# DECOMPOSITION OF INTERMOLECULAR INTERACTIONS IN *AB INITIO* SPECTROSCOPY

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Eric John Berquist, PhD

University of Pittsburgh, 2018

Spectroscopy, the response of matter to electromagnetic radiation of different wavelengths, is a powerful experimental tool for interrogating a molecule's structure and dynamics as it interacts with its environment. However, relating a spectroscopic signature to a molecular picture relies on sophisticated computational approaches in order to identify structures, intermolecular interactions, and their correlation with spectroscopic response. This thesis focuses on the question of how to correlate a molecule's structure and interactions with its environment via the *ab initio* calculation of spectroscopic parameters.

To build a molecular picture of CO<sub>2</sub> dynamics in ionic liquids (ILs), I performed quantum chemical calculations on small gas-phase CO<sub>2</sub>-IL clusters, qualitatively reproducing the experimental ordering for CO<sub>2</sub>'s asymmetric vibrational stretch ( $\nu_3$ ) peak position as a function of the anion. To uncover the physical origin of the shift, the language of decomposition analysis based on absolutely localized molecular orbitals (ALMO-EDA) was translated from energies to vibrational frequencies. Geometric distortion of CO<sub>2</sub>, as a result of charge transfer (CT) from the anion into the CO<sub>2</sub>, is the driving force for differentiating the CO<sub>2</sub>  $\nu_3$  shift in different IL anions.

After validating these simple models, I further decomposed the CT contribution into equilibrium structure and potential energy surface curvature mechanisms, finding that CT is a significant contributor in both the geometry optimization and frequency calculation steps. Comparing ALMO-EDA and symmetry-adapted perturbation theory (SAPT) showed that while dispersion dominates the binding energy, DFT-based ALMO-EDA showed excellent correlation with wavefunction-based SAPT, which enabled the construction of a spectroscopic map based on chemically-intuitive descriptors at lower cost.

This work presents the first application of ALMO-EDA to construct complex spectroscopic maps, however ALMO-EDA is not generally applicable to arbitrary spectroscopies. I reformulated the canonical linear response equations for use with ALMOs to provide a direct connection between EDA terms and their corresponding contribution to spectra. Test calculations indicate that allowing CT is equally important in both the underlying groundstate wavefunction and the response calculations and should not be confused with basis set superposition error.

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#### 1.0 INTRODUCTION AND THEORETICAL BACKGROUND

A great strength of quantum chemistry is that it enables construction of molecular models using the building blocks of chemical intuition, such as interactions between functional groups, that can in theory be correlated with any information present in the wavefunction. Furthermore, the ability to calculate spectroscopic parameters from wavefunctions makes it possible to connect the features of a molecular model with molecular properties. This is of paramount importance to experimental spectroscopy, where there is not always an obvious "signature" that connects features in complex molecular systems to a distinct spectroscopic response. As a result, it is often not possible to draw conclusions from experimental results without the aid of quantum chemical calculations.

Finding correlation between molecular models and spectra is of great value, but there is also difficulty from the computational side in terms of identifying the *correct* molecular models and *why* they are correct in explaining experimental spectra. To form true structure-spectra relationships, the most desirable connection is through the building blocks of chemistry, functional groups, and identifying the impact of their interactions. A common approach in both the wet lab and computationally is to remove or modify functional groups in some systematic way, resulting in a qualitative connection between structural components and changes in spectra. The drawbacks of such chemical transformations are the inability to quantify the physics behind these chemically-intuitive changes, and potential side effects of perturbing a molecular model's electronic and geometric structure due to cooperativity. One path to quantifying intermolecular interactions without such drastic chemical modifications is by fragmenting the system into groups of interest and decomposing their interaction energy into physically-motivated terms through a procedure called *energy decomposition analysis* (EDA). If EDA can be applied to spectra prediction, then the underlying causes of spectral changes due to specific chemical motifs can be quantified. More importantly, spectra-property relationships can be formed, where changes in spectral response can be tied directly back to types of physical interactions, such as electrostatics, charge transfer, and dispersion.

The unifying theme of this work is that it is possible to identify the contribution of specific intermolecular interactions to spectroscopic response. The contributions of specific intermolecular interactions are in the language of energy decomposition analysis using absolutely localized molecular orbitals, abbreviated as ALMO-EDA. Details of the ALMO-EDA procedures are given in section 5.2.

The majority of this work presents applications of response theory to calculating spectroscopic properties, specifically vibrational frequencies in chapters 2, 3, 4 and dipole polarizabilities in chapter 5, where each property is decomposed in terms of contributions to the final response from distorting the molecular geometry, allowing the non-interacting molecular densities to interact and then relax, and finally allowing charge to flow unrestricted between molecules. Chapter 6 presents a new model for implementing quantum chemical methods, with the first dipole hyperpolarizability as an example (sections 6.9.1 and 6.9.2), and how the decomposition of molecular properties may be implemented and disseminated in the future.

The remainder of this introduction will cover the basic language of molecular response theory and its connection to macroscopic spectroscopic observables, with examples of which observables are related to which microscopic terms (section 1.2). It will also cover more general cases of how those microscopic terms appear in different forms of derivation, all of which are related and give identical final answers. Specifically, a connection will be made between phenomenological Hamiltonians (section 1.3.1), series expansions (section 1.3.2), energy derivatives (sections 1.3.3, 1.3.4, and 1.3.5), perturbation theory (section 1.3.6), and quasienergy derivatives (section 1.4), of which the latter two are appropriate for incorporation of time dependence, leading to dynamic properties.

For more background literature on the theoretical development and applications of response theory to molecular properties, see reviews by Gauss,<sup>1</sup> Neese,<sup>2</sup> Norman,<sup>3</sup> Helgaker<sup>4</sup> and books by Szabo & Ostlund,<sup>5</sup> McWeeny,<sup>6</sup> Yamaguchi,<sup>7</sup> and Barron.<sup>8</sup>

#### 1.1 TERMS AND FUNDAMENTAL DEFINITIONS

Throughout the introduction and the remainder of this work, a number of terms appear and may seem to be used interchangeably. In quantum chemistry literature, the phrase *molecular property* is used to denote any quantity that can be calculated from the wavefunction. By this definition, not all molecular properties are *observables*, as they do not necessarily correspond to experimentally-measurable quantities. Such molecular properties may not also be uniquely defined. One of the most prominent examples of non-observable molecular properties is the calculation of atomic partial charges, with Mulliken<sup>5,9</sup> and Löwdin<sup>10</sup> population analyses being the two most commonly-known partitioning schemes for dividing the electron density into atomic contributions. However, this work associates molecular properties with observables, which may also be synonymous with *physical properties*. The term *chemical property* is avoided as it is more closely associated with reactivity than observable quantities.

The term *response* also requires disambiguation. Experimentally, *molecular response* refers to changes in a molecule's electronic and geometric state due to incident electromagnetic radiation (spectroscopy) or physical manipulation (such as structural deformation leading to piezoelectric response).<sup>11–13</sup> Computationally, within the Born-Oppenheimer approximation, molecular response encompasses how the electronic state is altered due to both external and internal perturbations. Examples of external perturbations are electric or magnetic fields whose strengths may or may not fluctuate with time, and examples of internal perturbations are nuclear displacements, nuclear magnetic moments, and the total electronic spin. Although external perturbations have a clear correspondence to spectroscopy, internal perturbations are more a description of a molecule's intrinsic structure.

However, in the context of this work, molecular response is sometimes used interchangeably with *response property*, which is intuitively a property associated with external applied fields, but here refers to any molecular property arising from the solution of the *response equations* or *response functions*.

The response equations relevant for this work are the coupled perturbed Hartree–Fock (CPHF), coupled perturbed Kohn–Sham (CPKS), or coupled perturbed self-consistent field (CPSCF) equations. These terms may be used interchangeably, as the equations are struc-

turally identical, with the only difference being the machinery of how the exchange-like terms are formed. These sets of equations are similar to those from time-dependent HF and KS (TDHF and TDKS/TDDFT) theory. In the TD equations, a non-Hermitian eigenvalue problem is solved for  $(\mathbf{G} - \omega \Delta)\mathbf{U} = \mathbf{0}$ , where  $\mathbf{G}$  is the orbital Hessian, the eigenvectors  $\mathbf{U}$  describe the transitions between the states of the system in the given molecular orbital (MO) basis, and the eigenvalues  $\omega$  are the system's excitation energies (poles)<sup>a</sup>. In the CP equations, a set of linear equations are solved for  $\mathbf{GU} = -\mathbf{V}$ , where  $\mathbf{V}$  represents the perturbation, and  $\mathbf{U}$  describes the modification to the unperturbed state's orbitals caused by the perturbation. A basic implementation of the CPHF equations is given in section 6.9.1 using the electric dipole operator as the perturbation. Although the remainder of this work will be concerned with the properties arising from solution of the CP equations and not the TD equations, their combination gives rise to other important molecular properties, namely the residues of the response function (eigenvectors from the TD equation contracted with the operator of interest), describe the perturbation-mediated transitions between states (their moments).

The solution of the CPSCF equations to calculate the parameters that describe the wavefunction's response to the perturbation  $\hat{V}$  determines the *linear response* of the system. Linear response is named as such not due to the linear form of the equations, but because the perturbation is linear in strength. This strength may be constant, static, or time-independent, or it may be oscillating, dynamic, frequency-, or time-dependent. This work is primarily concerned with static response properties, however an introduction to dynamic response is presented. The most common formulation of these equations is single-particle in nature, with both particle-hole and hole-particle terms, giving the *random phase approximation* (RPA).<sup>14,15</sup> If not the external perturbation but the response equations themselves are expanded using order analysis, the Hartree–Fock equations give the zeroth-order *polarization propagator*, RPA corresponds to the first-order polarization propagator (SOPPA).<sup>16</sup>

<sup>&</sup>lt;sup>a</sup> $\Delta$  is an identity matrix, except the lower diagonal is negated, see (Neese 107).

# 1.2 CONNECTION BETWEEN MACROSCOPIC AND MICROSCOPIC PROPERTIES

There is often a direct connection between the macroscopic observables measurable by spectroscopic techniques and the molecular response calculated at the microscopic scale. Tables 1 and 2 give examples of the most common molecular properties of interest and their relationships to energy derivatives and response functions, respectively. Although the effort required for implementing general energy derivatives may be considerable, the entries in both tables are the true starting points for molecular property calculations based on quantum chemical wavefunctions.

#### 1.3 STATIC (TIME-INDEPENDENT) RESPONSE PROPERTIES

The two primary ways to perform the derivation are

- 1. from a phenomenological Hamiltonian, similarly to using the correspondence principle when quantizing a classical expression (section 1.3.1), or
- 2. from series expansion of the energy with respect to one or more perturbations (section 1.3.2).

It is also possible to obtain expressions for static properties by the reduction of any expressions for dynamic properties to the static limit (zero frequency:  $\omega = 0$ ). The purpose of this section is to avoid some complexity in the derivation of time-dependent response by understanding the simpler case of static response first.

#### **1.3.1** Phenomenological approach

For a one-dimensional spring connecting a ball to a fixed object, Hooke's law is

$$F = -kx, \tag{1.1}$$

Table 1: Connection between specific energy derivatives and their respective molecular properties. F is an applied electric field, B is an applied magnetic field, X is a nuclear coordinate, m is a nuclear magnetic moment, J is a total rotational moment, I is a nuclear spin, and Sis the intrinsic electronic spin. Adapted from Ref. [1] and [17].

Energy derivative	Molecular property
$rac{dE}{dF_i}$	dipole moment; in a similar manner also multipole moments, electric field gradients, etc.
$\frac{dE}{dE}$	magnetic dipole moment and higher-order magnetic multipoles
$\frac{\frac{dE}{dB_{\alpha}}}{\frac{dE}{dX_{i}}}$	forces on nuclei; stationary points on potential energy surfaces,
	equilibrium and transition state structures
$\frac{dE}{dm}$	spin density; hyperfine interaction constants
$\frac{\frac{dE}{dm_{K_j}}}{\frac{d^2E}{dF_{\alpha}dF_{\beta}}}$ $\frac{\frac{d^2E}{dX_i dX_j}}{\frac{d^2E}{dX_i dF_{\alpha}}}$	(electric) polarizability
$\frac{d^2E}{dX_i dX_j}$	harmonic force constants; harmonic vibrational frequencies
$\frac{d^2E}{dX_i dF_{\alpha}}$	dipole derivatives; infrared intensities within the harmonic
	approximation
$\frac{d^2 E}{dB_{lpha} dB_{eta}}$	magnetizability
$\begin{array}{c} \frac{d^2 E}{dB_\alpha dB_\beta} \\ \frac{d^2 E}{dm_{K_j} dB_\alpha} \\ \frac{d^2 E}{dI_{K_i} dI_{L_j}} \\ \frac{d^2 E}{dI_{K_i} dI_{L_j}} \\ \frac{d^2 E}{dB_\alpha dJ_\beta} \\ \frac{d^2 E}{dI_{K_i} dB_\alpha} \\ \frac{d^2 E}{dI_{K_i} dB_\alpha} \\ \frac{d^2 E}{dI_{K_i} dB_\alpha} \\ \frac{d^2 E}{dI_{K_i} dB_\alpha} \\ \frac{d^2 E}{dI_{K_i} dF_\beta} \\ \frac{d^3 E}{dF_\alpha d^2 F_\beta} \\ \frac{d^3 E}{dX_i dX_j dX_k} \end{array}$	nuclear magnetic shielding tensor; relative NMR shifts
$rac{d^2 E}{dI_{K_i} dI_{L_i}}$	indirect spin-spin coupling constant
$rac{d^2E}{dB_{lpha}dJ_{eta}}$	rotational $g$ -tensor; rotational spectra in magnetic field
$rac{d^2E}{dI_{K_i}dB_{lpha}}$	nuclear spin-rotation tensor; fine structure in rotational spectra
$\frac{d^2E}{dS_idB_{lpha}}$	electronic $g$ -tensor
$\frac{d^{3}E}{dX_{i}dF_{\alpha}dF_{\beta}}$	polarizability derivative; Raman intensities
$\frac{\frac{d^3E}{dF_{\alpha}d^2F_{\beta}}}{\frac{d^3E}{dF_{\alpha}d^2F_{\beta}}}$	(first) electric hyperpolarizability
$\frac{d^3E}{dX_i dX_j dX_k}$	cubic force constants; vibrational corrections to distances and rotational constants
$\frac{d^4E}{dF_{lpha}dF_{eta}dF_{lpha}dF_{\lambda}dF_{\delta}}$	(second) electric hyperpolarizability
$rac{d^4E}{dF_lpha dF_eta dF_eta dF_eta dF_eta dF_eta dF_eta dF_eta d} rac{d^4E}{dB_lpha dB_eta dB_eta dB_\delta}$	(second) hypermagnetizability
$\frac{\frac{d^4E}{dX_i dX_j dX_k dX_l}}{dX_i dX_j dX_k dX_l}$	quartic force constants; anharmonic corrections to vibrational
	frequencies
$rac{d^4E}{dF_lpha dF_eta dF_lpha dF_lpha dX_i}$	hyper-Raman effects
$\frac{\frac{d^4E}{dF_{\alpha}dF_{\beta}dF_{\gamma}dX_i}}{\frac{d^4E}{dF_{\alpha}dF_{\beta}dX_idX_j}}$	Raman intensities for overtone and combination bands
$\frac{\frac{d^4E}{dF_{\alpha}dF_{\beta}dB_{\gamma}dB_{\delta}}}{\frac{d^4E}{dF_{\alpha}dF_{\beta}dB_{\gamma}dB_{\delta}}}$	Cotton–Mutton effect

Molecular Property	Definition	Type of response function
polarizability	${\langle\langle\hat{\mu};\hat{\mu} angle angle}_{\omega}$	linear
magnetizability	$\left<\left<\hat{m};\hat{m}\right>\right>_0$	linear
optical rotation	$\left<\left<\hat{\mu};\hat{m}\right>\right>_{\omega}$	linear
electronic circular dichroism	$\left<\left<\hat{\mu};\hat{m}\right>\right>_{\omega_f}$	single residue of linear
IR intensities	$\left<\left<\hat{\mu};\partial\hat{H}_0/\partial R\right>\right>_\omega$	linear
NMR spin-spin coupling constants	$\langle\langle \hat{h}_{\mathrm{SD}}; \hat{h}_{\mathrm{SD}} \rangle\rangle_{0},$	linear
	$\big\langle \big\langle \hat{h}_{\rm FC}; \hat{h}_{\rm FC} \big\rangle \big\rangle_0,$	linear
	$\left<\left<\hat{h}_{\mathrm{PSO}};\hat{h}_{\mathrm{PSO}}\right>\right>_0$	linear
NMR chemical shifts	$\left<\left<\hat{l}_O;\hat{h}_{\rm PSO}\right>\right>_0$	linear
EPR $g$ -tensor	$\big< \big< \hat{l}_O; \hat{h}_{\rm SOC} \big> \big>_0$	linear
static first hyperpolarizability	$\left<\left<\hat{\mu};\hat{\mu},\hat{\mu} ight> ight>_{0,0}$	quadratic
second-harmonic generation	$\langle\langle\hat{\mu};\hat{\mu},\hat{\mu} angle angle_{\omega,\omega}$	quadratic
electro-optical Pockels effect	$\langle\langle\hat{\mu};\hat{\mu},\hat{\mu} angle angle_{\omega,0}$	quadratic
optical rectification	$\langle\langle\hat{\mu};\hat{\mu},\hat{\mu} angle angle_{\omega,-\omega}$	quadratic
Faraday rotation	$\left<\left<\hat{\mu};\hat{\mu},\hat{m}\right> ight>_{\omega,0}$	quadratic
magnetic circular dichroism	$\langle\langle\hat{\mu};\hat{\mu},\hat{m}\rangle angle_{\omega_{f},0}$	single residue of quadratic
Raman intensities	$\langle\langle\hat{\mu};\hat{\mu},\partial\hat{H}_0/\partial R\rangle\rangle_{\omega,0}$	quadratic
static second hyperpolarizability	$\left<\left<\hat{\mu};\hat{\mu},\hat{\mu},\hat{\mu},\hat{\mu}\right> ight>_{0,0,0}$	cubic
third-harmonic generation	$\left<\left<\hat{\mu};\hat{\mu},\hat{\mu},\hat{\mu} ight> ight>_{\omega,\omega,\omega}$	cubic

Table 2: Connection between specific (non)linear response functions and their respective molecular properties. Adapted from Ref. [3].

where x is the displacement of the spring from equilibrium in meters, k is the spring constant in units of N m<sup>-1</sup>, and F is the restoring force in units of newtons acting on the displaced spring by the object it is attached to. If the sign is reversed, then the equation can be viewed as describing the force of spring acting on the attached object; it is a direction change and a matter of convention.

Hooke's law can be generalized to multiple dimensions. For example, in three-dimensional space it can be written as

$$\begin{bmatrix} F_1 \\ F_2 \\ F_3 \end{bmatrix} = -\begin{bmatrix} k_{11} & k_{12} & k_{13} \\ k_{21} & k_{22} & k_{23} \\ k_{31} & k_{32} & k_{33} \end{bmatrix} \begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix},$$
 (1.2)

which can represent either a single object or three one-dimensional springs. It can also be made 3N-dimensional when describing the forces on N atoms (each with 3 Cartesian components) given their relative positions  $\mathbf{x}$  and the "stiffness" of their connectivity  $\mathbf{k}$ . In the most general N-dimensional form, it can be written as

$$F_i = -\sum_j^N k_{ij} x_j, \tag{1.3}$$

or in Einstein summation notation where repeated indices are implicitly summed (contracted) over as

$$F_i = -k_{ij}x_j, \tag{1.4}$$

where both i, j range from 1 to N, leading to vectors  $\mathbf{F}$  and  $\mathbf{x}$  of shape [N] and a matrix  $\mathbf{k}$  of shape [N, N]. From (1.2), (1.3), and (1.4), if off-diagonal elements of k are allowed to be nonzero, there can be coupling between springs. For example, if i = 1, in the case of coupling,

$$F_1 = -(k_{11}x_1 + k_{12}x_2 + k_{13}x_3), (1.5)$$

which reduces to

$$F_1 = -k_{11}x_1 \tag{1.6}$$

in the absence of coupling, or the same result obtained in (1.1).

The force is also related to the energy. In one dimension,

$$F = -\nabla E \tag{1.7}$$

$$= -\frac{\partial E}{\partial x},\tag{1.8}$$

where  $\nabla \equiv \partial/\partial x$ . In N dimensions, like (1.4), (1.7) is (using vector calculus)

$$F_i = -\frac{\partial E}{\partial x_i}.\tag{1.9}$$

Equating the  $F_i$  in (1.4) and (1.9) gives

$$-k_{ij}x_j = -\frac{\partial E}{\partial x_i},\tag{1.10}$$

where the negative signs can be dropped. To solve for the stiffness coefficients, take the partial derivative of both sides with respect to  $x_j$ , using the product rule on the left hand side:

$$\left(\frac{\partial}{\partial x_j}\right)(k_{ij}x_j) = \left(\frac{\partial}{\partial x_j}\right)\left(\frac{\partial E}{\partial x_i}\right) \tag{1.11}$$

$$\left[\left(\frac{\partial}{\partial x_j}\right)(k_{ij})\right] x_j + k_{ij} \left[\left(\frac{\partial}{\partial x_j}\right) x_j\right] = \frac{\partial^2 E}{\partial x_j \partial x_i}$$
(1.12)

$$k_{ij} = \frac{\partial^2 E}{\partial x_j \partial x_i}.$$
 (1.13)

This tells that the internal stiffness is related to the second derivative of the energy with respect to nuclear coordinate displacements. The internal stiffness matrix is the molecular Hessian, where each "spring constant" is called a force constant, which describes how a change or perturbation to one atomic coordinate affects a change in another atomic coordinate.

Another important property is that in general, due to Young's theorem, the order of differentiation is not important, and the perturbations may be interchanged:

$$\frac{\partial^2 E}{\partial x_j \partial x_i} = \frac{\partial^2 E}{\partial x_i \partial x_j},\tag{1.14}$$

leading to a symmetric matrix  $\mathbf{k}$ . In practice, this has implications for computational cost which will be discussed in section 1.3.5.

A similar derivation holds for the dipole polarizability,  $\alpha$ , which is the ratio of the induced dipole moment  $\mu$  of a system to the electric field F that produces this dipole moment. Both  $\mu$  and F are 3-dimensional vector quantities,

$$\vec{\mu} = \vec{\vec{\alpha}} \cdot \vec{F},\tag{1.15}$$

which can be expanded identically to (1.2) as

$$\begin{bmatrix} \mu_1 \\ \mu_2 \\ \mu_3 \end{bmatrix} = \begin{bmatrix} \alpha_{11} & \alpha_{12} & \alpha_{13} \\ \alpha_{21} & \alpha_{22} & \alpha_{23} \\ \alpha_{31} & \alpha_{32} & \alpha_{33} \end{bmatrix} \begin{bmatrix} F_1 \\ F_2 \\ F_3 \end{bmatrix}, \qquad (1.16)$$

or in Einstein summation notation as

$$\mu_i = \alpha_{ij} F_j. \tag{1.17}$$

This is the most general case, where anisotropy may be present in the polarizability tensor, leading to nonzero off-diagonal elements.

Another definition of the molecular dipole moment induced by an external (applied) electric field is

$$\mu_i = -\frac{\partial E}{\partial F_i},\tag{1.18}$$

which originates from the energy of a neutral dipole in an electric field,

$$E = -\mu_i F_i. \tag{1.19}$$

Following (1.10), equating (1.17) and (1.18) gives

$$\alpha_{ij}F_j = -\frac{\partial E}{\partial F_i} \tag{1.20}$$

The remaining steps follow identically to (1.11), (1.12), and (1.13):

$$\left(\frac{\partial}{\partial F_j}\right)(\alpha_{ij}F_j) = \left(\frac{\partial}{\partial F_j}\right)\left(-\frac{\partial E}{\partial F_i}\right) \tag{1.21}$$

$$\left(\frac{\partial \alpha_{ij}}{\partial F_j}\right)F_j + \alpha_{ij}\left(\frac{\partial F_j}{\partial F_j}\right)^2 = -\frac{\partial^2 E}{\partial F_j \partial F_i}$$
(1.22)

$$\alpha_{ij} = -\frac{\partial^2 E}{\partial F_j \partial F_i} \tag{1.23}$$

#### 1.3.2 Series expansion

More generally, the derivative terms in section 1.3.1 originate from series expansions of the energy in the presence of a perturbation; for (1.1), it is internal geometric displacements, and in (1.15) it is an external electric field. The energy in the presence of an arbitrary perturbation P is written as

$$E(P) = \sum_{n=0}^{\infty} \frac{1}{n!} \frac{\partial^n E}{\partial P^n} \Big|_{P=a} \cdot (P-a)^n$$
  
=  $\sum_{n=0}^{\infty} \frac{1}{n!} E^{(n)}(a) \cdot (P-a)^n$   
=  $E^{(0)}(a) + E^{(1)}(a) \cdot (P-a) + \frac{1}{2} E^{(2)}(a) \cdot (P-a)^2 + \frac{1}{6} E^{(3)}(a) \cdot (P-a)^3 + \dots,$   
(1.24)

where a is the point at which the derivative is taken. Choosing  $a \stackrel{!}{=} 0$  (expanding around the perturbation at zero strength) turns the Taylor series into a Maclaurin series<sup>b</sup>:

$$E(P) = \sum_{n=0}^{\infty} \frac{1}{n!} \frac{\partial^{n} E}{\partial P^{n}} \Big|_{P=0} \cdot P^{n}$$
  
=  $\sum_{n=0}^{\infty} \frac{1}{n!} E^{(n)} \cdot P^{n}$   
=  $E^{(0)} + E^{(1)} \cdot P + \frac{1}{2} E^{(2)} \cdot P^{2} + \frac{1}{6} E^{(3)} \cdot P^{3} + \dots$  (1.25)

The perturbation P may have multiple components. For example, there are 3 possible Cartesian components to an external electric field  $\mathbf{F} = (F_x, F_y, F_z)$  and 3N atomic coordinates. Generalizing the dimensionality of P to k and inserting into (1.25) gives

$$E(\mathbf{P}) = \sum_{n=0}^{\infty} \frac{1}{n!} \left. \frac{\partial^n E}{\partial \mathbf{P}^n} \right|_{\mathbf{P}=\mathbf{0}} \cdot \mathbf{P}^n$$
(1.26)

Considering specific examples, using (1.26), replacing **P** with an external electric field **F**, and switching to Einstein notation gives

$$E(\mathbf{F}) = E_0 - \mu_i \cdot F_i - \frac{1}{2}\alpha_{ij} \cdot F_i F_j - \frac{1}{6}\beta_{ijk} \cdot F_i F_j F_k - \frac{1}{24}\gamma_{ijkl} \cdot F_i F_j F_k F_l - \dots, \qquad (1.27)$$

<sup>b</sup>The notation  $x \stackrel{!}{=} y$  means that x must be equal to y by definition.

where  $\mu_i$  is a component of the dipole (moment), expressed in operator form as

$$\hat{\mu} = (\hat{\mu}_x, \hat{\mu}_y, \hat{\mu}_z) = -e(\hat{x}, \hat{y}, \hat{z}), \qquad (1.28)$$

 $\alpha$  is a component of the polarizability,  $\beta$  is a component of the first hyperpolarizability,  $\gamma$  is a component of the second hyperpolarizability, etc., each describing an additional correction to how a system interacts with the external electric field.

It is also possible to consider multiple perturbations simultaneously. Adding another perturbation  $\mathbf{Q}$  to (1.26) gives

$$E(\mathbf{P}, \mathbf{Q}) = E^{(0,0)} + \left(E^{(1,0)} \cdot \mathbf{P} + E^{(0,1)}\mathbf{Q}\right) + \frac{1}{2}\left(E^{(2,0)} \cdot \mathbf{P}^2 + E^{(0,2)} \cdot \mathbf{Q}^2 + E^{(1,1)} \cdot \mathbf{P} \cdot \mathbf{Q}\right) + \dots,$$
(1.29)

where  $E^{(n,m)}$  refers to the energy correction that is simultaneously *n*th-order in the perturbation **P** and *m*th-order in the perturbation **Q**. The expected terms from both independent series expansions occur, but there is also a cross-term  $E^{(1,1)}$ . All mixed derivatives in Table 1 that are at least 2nd-order total correspond to such cross-terms. For example, consider adding an external magnetic field to (1.27):

$$E(\mathbf{F}, \mathbf{B}) = E_0 - \mu_i \cdot F_i - m_i \cdot B_i - \frac{1}{2} \left( \alpha_{ij} \cdot F_i F_j + \xi_{ij} \cdot B_i B_j + G_{ij} \cdot F_i B_j \right) - \dots, \quad (1.30)$$

where the magnetic field has introduced  $m_i$  as a component of the magnetic (dipole) moment,  $\xi_{ij}$  as a component of the magnetizability, and the mixed electric dipole–magnetic dipole polarizability  $G_{ij}$ , which is directly related to the optical rotation<sup>c</sup>, given as  $\langle\langle \hat{\mu}; \hat{m} \rangle\rangle_{\omega}$  in Table 2. The residues of the same response function give the rotatory strengths needed for electronic circular dichroism (ECD), shown as  $\langle\langle \hat{\mu}; \hat{m} \rangle\rangle_{\omega_f}$  in Table 2. Section 1.4 will show how frequency dependence can be properly introduced to this term and in general.

<sup>&</sup>lt;sup>c</sup>See Eq. (2) in Ref. [18], specifically the G term.

#### 1.3.3 Derivative evaluation

Up to this point, it has not been necessary to specify which energy expression is being differentiated: it is the energy expression for the chosen method (HF,  $\omega$ B97M-V, MP2, CCSD(T), ...). These derivatives may be evaluated in one of two ways:

- numerically, by using a finite difference expression (usually based on central differences) for the desired derivative order, evaluating the energy (or some other property) at multiple perturbation strengths (step sizes) and directions, or
- 2. analytically, by differentiating the energy expression "on paper" and evaluating it directly.

It is also possible to combine numerical and analytic approaches to obtain higher-order derivatives. For example, in the calculation of Raman intensities, defined as  $\frac{\partial^3 E}{\partial X_A \partial F_i \partial F_j}$ , there are six unique ways to perform the derivative, shown in Table 3. More explicitly, the first row

Table 3: Possible permutations of analytic (a) and numerical (n) differentiation for each perturbation term in calculating Raman intensities. The two cancelled entries are not unique due to permutational symmetry.

$X_A$	$F_i$	$F_j$
a	a	a
a	a	n
ø	Ŕ	ø
n	a	a
a	n	n
n	a	n
X	Ŕ	ø
n	n	n

corresponds to a fully analytic third derivative, the next three rows correspond to first-order finite difference of analytic second derivatives, the next three rows correspond to second-order finite difference of analytic first derivatives, and the last row corresponds to the third-order finite difference of energies. Due to symmetry in the electric field perturbation indices, two of the eight permutations are identical to others already present; for example, a/a/n and a/n/a are functionally identical. In practice, the fully analytic third derivative is often not implemented, but second derivatives are, leading to two unique possibilities:

$$\frac{\partial^3 E}{\partial X_A \partial F_i \partial F_j} = \underbrace{\frac{\partial}{\partial X_A}}_{\text{numeric}} \underbrace{\left(\frac{\partial^2 E}{\partial F_i \partial F_j}\right)}_{\text{analytic}} = \frac{\partial \alpha_{ij}}{\partial X_A}, \tag{1.31}$$

$$= \underbrace{\frac{\partial}{\partial F_i}}_{\text{numeric}} \underbrace{\left(\frac{\partial^2 E}{\partial X_A \partial F_j}\right)}_{\text{analytic}} = \frac{\partial}{\partial F_i} \left(\frac{\partial \mu_j}{\partial X_A}\right). \tag{1.32}$$

In (1.31) there are  $2 \times (3N \text{ atomic coordinates}) = 6N \text{ atom-displaced polarizability calcula$ tions. This is closer to the textbook definition of Raman intensities, which are the change inmolecular polarizability along each normal mode coordinate.<sup>19</sup> In (1.32), the dipole gradient $(needed for IR intensities) is calculated analytically for <math>2 \times (3 \text{ field directions}) = 6 \text{ finite}$ electric field calculations.

#### **1.3.4** Finite difference for numerical derivatives

To perform numerical differentiation for molecular properties, first consider the definition of a (first) derivative,

$$f'(x) = \lim_{h \to 0} \frac{f(x+h) - f(x)}{h},$$
(1.33)

where f(x) is the function of an independent variable x being differentiated with respect to that variable. If h is set to a small finite number (h > 0),

$$f'(x) \approx f'(x|h) = \frac{f(x+h) - f(x)}{h},$$
 (1.34)

the exact (analytic) derivative is approximated using a step size h. (1.34) is the forward (finite) difference, as the step is taken by incrementing the independent variable. More common is *central* difference,

$$f'(x|h) = \frac{f(x + \frac{1}{2}h) - f(x - \frac{1}{2}h)}{h}.$$
(1.35)

Replace f with the molecular energy, and let h be the strength of an applied electric field along the z-direction. (1.35) becomes

$$\mu_z(h_z) = \frac{E(\frac{1}{2}h_z) - E(\frac{1}{2}h_z)}{h_z},$$
(1.36)

the z-component of the electric dipole moment. x disappears because the derivative is taken at zero field. (1.36) may be useful for methods that do not commonly have analytic derivatives of any order, such as CCSDT. Of more interest is replacing the energies with analytic dipole moments to give an element of the polarizability tensor:

$$\alpha_{xz}(h_x) = \frac{\mu_z(\frac{1}{2}h_x) - \mu_z(\frac{1}{2}h_x)}{h_x}.$$
(1.37)

(1.37) is an example of a mixed analytic/numerical derivative as discussed in section 1.3.3. A fully-numeric polarizability calculation would require applying 2nd-order central difference,

$$f''(x|h) = \frac{f(x+h) - 2f(x) - f(x-h)}{h^2},$$
(1.38)

to give

$$\alpha_{zz}(h_z) = \frac{E(h_z) - 2E_0 - E(h_z)}{h_z^2}.$$
(1.39)

As discussed in section 5.3.3 and Ref. [1], there are considerable disadvantages to performing numerical differentiation of the wavefunction. These include the presence of finitedifference error due to step size sensitivity, the inability to handle frequency-dependent perturbations, the inability to handle response to applied magnetic fields without complex energies, and the poor calculation time scaling (especially for geometric derivatives). A particularly insidious example of error related to the step size is given in Figure 1. Many tests of numerical derivative errors consider relative or absolute accuracy in comparison to the exact analytic result. Figure 1 does not compare the error between the numerical and analytic results, but between matrix elements of the numerical result. In this case, the fundamental structure of the electric field response is violated: asymmetry implies that the polarizability is dependent on the order of which the probing electric fields are applied, and (1.14) does not hold, giving an unphysical result.

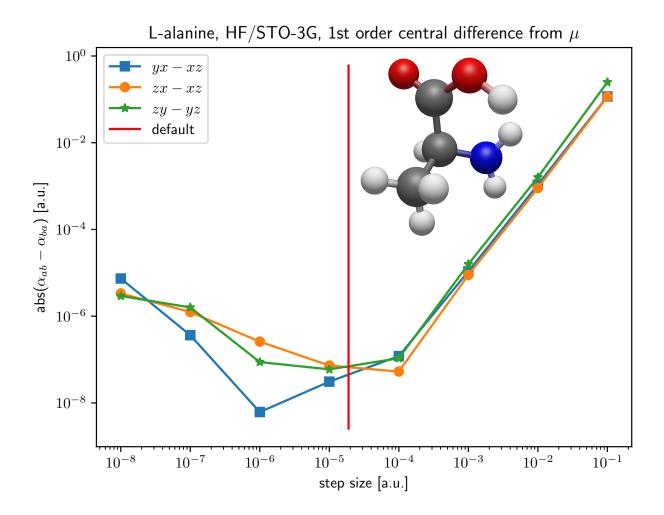


Figure 1: Effect of numerical noise on the off-diagonal matrix elements of the polarizability tensor. Nonzero differences indicate asymmetry, and the polarizability tensor is supposed to be symmetric. The red bar indicates the default step size for the applied electric field in Q-CHEM 5.1, set at  $1.88973 \times 10^{-5}$  a.u..

#### 1.3.5 Analytic derivative theory

As mentioned in section 1.3.3, the first requirement for evaluating analytic energy derivatives is to form the necessary mathematical expression. In the most general case, there are both derivatives of the atomic orbital (AO) basis integrals themselves and of the density matrix, which leads to derivatives of the MO coefficients. To illustrate some of the mechanics of differentiation, consider the derivative of the MO-basis matrix representation of the electronnuclear attraction operator  $\hat{V}_{eN}$  with respect to a nuclear coordinate  $X_A$ , which is a term needed for the molecular gradient:

$$\frac{\partial V_{ij}}{\partial X_A} = \frac{\partial}{\partial X_A} \left( \sum_{\mu\nu}^{AO} C_{\mu i} C_{\nu j} V_{\mu\nu} \right)$$
(Yamaguchi eq. 3.80)  
$$\sum_{\lambda = 0}^{AO} \left( \frac{\partial C_{\mu i}}{\partial C_{\mu i}} C_{\mu \nu} + C_{\mu i} \frac{\partial C_{\nu i}}{\partial C_{\mu i}} \right)$$
(Yamaguchi eq. 3.80)

$$=\sum_{\mu\nu}^{N} \left( \frac{\partial C_{\mu i}}{\partial X_A} C_{\nu j} V_{\mu\nu} + C_{\mu i} \frac{\partial C_{\nu j}}{\partial X_A} V_{\mu\nu} + C_{\mu i} C_{\nu j} \frac{\partial V_{\mu\nu}}{\partial X_A} \right), \qquad (\text{Yamaguchi eq. 3.81})$$

where the third (last) term is the true AO integral derivative, and the first two terms, the MO coefficient derivatives, come from differentiating the density matrix, which is defined as

$$P_{\mu\nu}^{\rm RHF} = \sum_{i}^{\rm d.o.} C_{\mu i} C_{\nu i} \tag{1.40}$$

in the AO basis.

The AO integral derivative can be further expanded. Using  $\mu, \nu$  rather than  $\chi_{\mu}, \chi_{\nu}$  so they refer to both AO basis functions *and* their matrix indices,

$$\frac{\partial V_{\mu\nu}}{\partial X_A} = \frac{\partial}{\partial X_A} \left\langle \mu \left| \hat{V} \right| \nu \right\rangle$$
 (Yamaguchi eq. 3.24)

$$= \left\langle \frac{\partial \mu}{\partial X_A} \left| \hat{V} \right| \nu \right\rangle + \left\langle \mu \left| \frac{\partial V}{\partial X_A} \right| \nu \right\rangle + \left\langle \mu \left| \hat{V} \right| \frac{\partial \nu}{\partial X_A} \right\rangle, \qquad (\text{Yamaguchi eq. 3.25})$$

where the first and third terms are derivatives of basis functions and the second term is a derivative of the operator itself. Although AO integral derivatives are a necessary component of most derivative expressions, they do not play a direct role in response equations, and do not need to be discussed further. It is convenient to rewrite the MO coefficient derivatives,

$$\frac{\partial C_{\mu i}}{\partial X_A} = \sum_m^{\text{MO}} U_{mi}^{X_A} C_{\mu m}, \qquad (\text{Yamaguchi eq. 3.7})$$

where the index m runs over all occupied and unoccupied/virtual MOs. Although  $X_A$  is being used for the perturbation, all parts of this derivation hold for any general perturbation. The key insight is that the effect of a perturbation on the MO coefficients can be written as the contraction of the unmodified MO coefficients with a unitary matrix describing single-particle excitations from occupied to virtual MOs, as well as deexcitations from virtual to occupied MOs. In matrix form, this is

$$\mathbf{C}^{(X_A)} = \mathbf{C}^{(0)} \left( \mathbf{U}^{(X_A)} \right)^T, \qquad (1.41)$$

where the dimension of **U** is  $[N_{\text{orb}}, N_{\text{orb}}]$ .

Now consider the derivatives of the MO coefficients/density matrix in the context of the Hartree–Fock equations. Starting from the restricted Hartree–Fock electronic energy expression,<sup>d</sup>

$$E_{\text{elec}}^{\text{RHF}} = 2\sum_{i}^{\text{d.o.}} h_{ii} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj) - (ij|ij) \right\},$$
 (Yamaguchi eq. 4.1)

the first derivative with respect to a nuclear displacement  $X_A$  is<sup>e</sup>

$$\frac{\partial E_{\text{elec}}^{\text{RHF}}}{\partial X_A} = 2\sum_{i}^{\text{d.o.}} h_{ii}^{X_A} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj)^{X_A} - (ij|ij)^{X_A} \right\} - 2\sum_{i}^{\text{d.o.}} S_{ii}^{X_A} \epsilon_i, \quad (\text{Yamaguchi eq. 4.21})$$

where terms with the superscript  $X_A$  indicate the a derivative of only the AO term.

Notice that the MO coefficient derivatives do not appear in the final HF gradient expression. They disappear due to Wigner's 2n + 1 rule. From page 25 of Ref. [7]:

 $<sup>\</sup>overline{(\hat{h} = \hat{H}^{\text{core}})} \equiv \hat{T}_e + \hat{V}_{Ne}$  is the one-electron core Hamiltonian operator, which itself is the sum of the electronic kinetic energy and electron-nuclear attraction energy operators, here in matrix representation, similarly to (Yamaguchi eq. 3.80). (pq|rs) is an MO-basis two-electron (repulsion) integral in Mulliken notation (see Table 2.2 of Ref. [5]).

<sup>&</sup>lt;sup>e</sup>Additionally, see section C.3 of Szabo & Ostlund<sup>5</sup> and Ref. [20].

When the wavefunction is determined up to the *n*th order, the expectation value (electronic energy) of the the system is resolved, according to the results of perturbation theory, up to the (2n + 1)st order. This principle is called Wigner's 2n + 1 theorem.<sup>21,22</sup>

More explicitly, we have the zeroth-order wavefunction, so we must be able to calculate the first-order correction to the energy. Worded differently, any first derivative of the energy can be calculated without differentiating MO coefficients, which is only required for second derivatives, such as the molecular Hessian or the dipole polarizability.

Differentiating (Yamaguchi eq. 4.1) with respect to  $X_A$  and collecting terms with U gives

$$\frac{\partial E_{\text{elec}}^{\text{RHF}}}{\partial X_A} = 2\sum_{i}^{\text{d.o.}} h_{ii}^{X_A} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj)^{X_A} - (ij|ij)^{X_A} \right\} + 4\sum_{m}^{\text{all}} \sum_{i}^{\text{d.o.}} U_{mi}^{X_A} F_{im},$$
(Yamaguchi eq. 4.16)

where the Fock matrix is defined as

$$F_{pq} = h_{pq} + \sum_{k}^{\text{d.o.}} \{2(pq|kk) - (pk|qk)\}$$
(Yamaguchi eq. 4.6)  
=  $h_{pq} + 2J_{pq} - K_{pq}$ ,

and the Coulomb and exchange matrices **J** and **K** have also been introduced. Using the RHF variational conditions, the Fock matrix from a converged calculation is diagonal in the MO basis, corresponding to the MO energies

$$F_{pq} = \delta_{pq} \epsilon_{pq}, \qquad (\text{Yamaguchi eq. 4.7})$$

so (Yamaguchi eq. 4.16) simplifies to

$$\frac{\partial E_{\text{elec}}^{\text{RHF}}}{\partial X_A} = 2\sum_{i}^{\text{d.o.}} h_{ii}^{X_A} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj)^{X_A} - (ij|ij)^{X_A} \right\} + 4\sum_{m}^{\text{all}} \sum_{i}^{\text{d.o.}} U_{mi}^{X_A} \epsilon_{im},$$
(Yamaguchi eq. 4.17 modified)

which can be further simplified as

$$\frac{\partial E_{\text{elec}}^{\text{RHF}}}{\partial X_A} = 2\sum_{i}^{\text{d.o.}} h_{ii}^{X_A} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj)^{X_A} - (ij|ij)^{X_A} \right\} + 4\sum_{i}^{\text{d.o.}} U_{ii}^{X_A} \epsilon_{ii}. \quad (\text{Yamaguchi eq. 4.17})$$

Now one of the most important tricks in quantum chemistry is used. Given the orthonormality of the MOs,

$$S_{pq} = \delta_{pq},$$
 (Yamaguchi eq. 3.44)

we must have (see footnote b)

$$\frac{\partial S_{pq}}{\partial X_A} \stackrel{!}{=} 0. \tag{Yamaguchi eq. 3.45}$$

Expanding the left-hand side of (Yamaguchi eq. 3.45) similarly to (Yamaguchi eq. 3.81) gives

$$\frac{\partial S_{pq}}{\partial X_A} = \sum_{\mu\nu}^{AO} C_{\mu p} C_{\mu q} \frac{\partial S_{\mu\nu}}{\partial X_A} + \sum_m^{\text{all}} \left( U_{mp}^{X_A} S_{mq} + U_{mq}^{X_A} S_{pm} \right) \qquad \text{(Yamaguchi eqs. 3.40 + 3.43)}$$
$$= S_{pq}^{X_A} + \sum_m^{\text{all}} \left( U_{mp}^{X_A} S_{mq} + U_{mq}^{X_A} S_{pm} \right). \qquad \text{(Yamaguchi eqs. 3.43)}$$

The sum over all MOs can be eliminated by reusing the orthonormality condition, so in the first term  $m \stackrel{!}{=} q$  and for the second term  $m \stackrel{!}{=} p$ , and the overlap matrix in the MO basis is unity for those terms, giving

$$\frac{\partial S_{pq}}{\partial X_A} = S_{pq}^{X_A} + U_{qp}^{X_A} + U_{pq}^{X_A} \stackrel{!}{=} 0.$$
 (Yamaguchi eq. 3.46)

Recognizing that we only need diagonal terms, this can be rewritten as

$$U_{pp}^{X_A} = -\frac{1}{2} S_{pp}^{X_A}, \qquad (\text{Yamaguchi eq. 4.20})$$

which is then plugged back into the first derivative expression to give

$$\frac{\partial E_{\text{elec}}^{\text{RHF}}}{\partial X_A} = 2\sum_{i}^{\text{d.o.}} h_{ii}^{X_A} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj)^{X_A} - (ij|ij)^{X_A} \right\} + 4\sum_{i}^{\text{d.o.}} \left( -\frac{1}{2} S_{ii}^{X_A} \right) \epsilon_{ii}$$
$$= 2\sum_{i}^{\text{d.o.}} h_{ii}^{X_A} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj)^{X_A} - (ij|ij)^{X_A} \right\} - 2\sum_{i}^{\text{d.o.}} S_{ii}^{X_A} \epsilon_{ii}.$$

(Yamaguchi eq. 4.21 [rederived])

Since is it almost always advantageous to avoid MO transformations and work in the AO basis, the last term can be rewritten

$$\sum_{i}^{\text{d.o.}} S_{ii}^{X_A} \epsilon_{ii} = \sum_{i}^{\text{d.o.}} \sum_{\mu\nu}^{\text{AO}} C_{\mu i} C_{\mu i} \frac{\partial S_{\mu\nu}}{\partial X_A} \epsilon_{ii}$$
$$= \sum_{i}^{\text{d.o.}} \sum_{\mu\nu}^{\text{AO}} C_{\mu i} C_{\mu i} \epsilon_{ii} S_{\mu\nu}^{X_A}$$
(Yamaguchi eq. 4.24)
$$= \sum_{\mu\nu}^{\text{AO}} W_{\mu\nu} S_{\mu\nu}^{X_A}$$

to use the energy-weighted density matrix  $\mathbf{W}$ , also sometimes called  $\mathbf{Q}$ :<sup>f</sup>

$$\frac{\partial E_{\text{elec}}^{\text{RHF}}}{\partial X_A} = 2\sum_{\mu\nu}^{\text{AO}} P_{\mu\nu} h_{\mu\nu}^{X_A} + \sum_{\mu\nu\lambda\sigma}^{\text{AO}} P_{\mu\nu} P_{\lambda\sigma} \left\{ 2(\mu\nu|\lambda\sigma)^{X_A} - (\mu\lambda|\nu\sigma)^{X_A} \right\} - 2\sum_{\mu\nu}^{\text{AO}} Q_{\mu\nu} S_{\mu\nu}^{X_A} + V_{NN}^{X_A}$$
(Szabo & Ostlund eq. C.12)

Again, the elimination of the **U** matrix is one of the most important results in quantum chemistry, as it means the coupled-perturbed SCF equations described previously do not need to be solved for first derivatives of SCF wavefunctions. This is why density or MO coefficient derivatives are not present in the gradient expression.

Differentiation of (Yamaguchi eq. 4.21) once more with respect to another nuclear displacement  $Y_B$  is

$$\begin{aligned} \frac{\partial^2 E_{\text{tot}}^{\text{RHF}}}{\partial X_A \partial Y_B} &= 2 \sum_{i}^{\text{d.o.}} h_{ii}^{X_A Y_B} + \sum_{ij}^{\text{d.o.}} \left\{ 2(ii|jj)^{X_A Y_B} - (ij|ij)^{X_A Y_B} \right\} \\ &- 2 \sum_{i}^{\text{d.o.}} S_{ii}^{X_A Y_B} \epsilon_i - 2 \sum_{i}^{\text{d.o.}} \sum_{p}^{\text{all}} \left\{ U_{ip}^{X_A} U_{ip}^{Y_B} + U_{ip}^{Y_B} U_{ip}^{X_A} - S_{ip}^{X_A} S_{ip}^{Y_B} - S_{ip}^{Y_B} S_{ip}^{X_A} \right\} \epsilon_i \\ &+ 4 \sum_{p}^{\text{all}} \sum_{i}^{\text{d.o.}} \left( U_{pi}^{Y_B} F_{pi}^{X_A} + U_{pi}^{X_A} F_{pi}^{Y_B} \right) + 4 \sum_{p}^{\text{all}} \sum_{i}^{\text{d.o.}} U_{pi}^{X_A} U_{pi}^{Y_B} \epsilon_p \\ &+ 4 \sum_{p}^{\text{all}} \sum_{i}^{\text{d.o.}} \sum_{q}^{\text{all}} \sum_{j}^{\text{d.o.}} U_{pi}^{X_A} U_{qj}^{Y_B} \left\{ 4(pi|qj) - (pq|ij) - (pj|iq) \right\} \\ &- 3 \left( X_A - X_B \right) \left( Y_A - Y_B \right) \frac{Z_A Z_B}{R_{AB}^5}, \end{aligned}$$

(Yamaguchi eqs. 4.54, 4.55, 3.127)

 $<sup>^{\</sup>rm f}{\rm The}$  convention in Szabo & Ostlund is to absorb the RHF factor of 2 into the density matrix, which is not done here.

where the nucleus-nucleus repulsion energy derivative is included for completeness. This is the final expression for the molecular Hessian<sup>g</sup> derived in (1.13). From here and Table 37, we can see that evaluating the **U** matrices (forming derivatives of the MO coefficients) is unavoidable.

However, the case of the molecular Hessian is a general one, because the AOs are perturbation-dependent: for a fixed electron position, the amplitude of a basis function will change if it moved, and they are typically atom-centered. In the case that the basis set is *not* perturbation dependent, as is most often in the case in electric field perturbations<sup>h</sup>, (Yamaguchi eqs. 4.54, 4.55, 3.127) reduces to

$$\frac{\partial^2 E_{\text{tot}}^{\text{RHF}}}{\partial F_{\alpha} \partial F_{\beta}} = -4 \sum_{a}^{\text{virt}} \sum_{i}^{\text{d.o.}} U_{ai}^{F_{\beta}} h_{ai}^{F_{\alpha}}, \qquad (\text{Yamaguchi eq. 17.54})$$

where  $\frac{\partial^2 E_{\text{tot}}^{\text{RHF}}}{\partial F_{\alpha} \partial F_{\beta}}$  is the  $\alpha\beta$ -component of the static polarizability tensor (1.23), and the oneelectron term  $h_{ai}^{F_{\alpha}}$  is the  $\alpha$ -component of the dipole operator in the occupied-virtual MO basis (the *property gradient*, see the **P**/**Q** matrix elements in section 5.3.1 and line 371). This specific term originates from the Fock matrix derivatives on line three, as the complete Hamiltonian now includes the perturbation (see (1.43)), which is the only term that survives the differentiation. In general, when the AO basis is perturbation independent, the energy derivative with respect to two arbitrary perturbations  $\lambda$  and  $\theta$  can be written as<sup>2</sup>

$$\frac{\partial^2 E}{\partial \lambda \partial \theta} = \sum_{\mu\nu} \left( P_{\mu\nu} \frac{\partial^2 h_{\mu\nu}}{\partial \lambda \partial \theta} + \frac{\partial P_{\mu\nu}}{\partial \theta} \frac{\partial h_{\mu\nu}}{\partial \lambda} \right), \qquad (\text{Neese eq. 77})$$

where the first term is evaluated as an expectation value and the second term requires solution of the response equations. The derivative of the density matrix is related to the  $\mathbf{U}$  matrices via<sup>i</sup>

$$\frac{\partial \mathbf{P}}{\partial \theta} = \mathbf{C}^{(0)} \left( \mathbf{C}^{(\theta)} \right)^T + \mathbf{C}^{(\theta)} \left( \mathbf{C}^{(0)} \right)^T$$
(1.42)

and (1.41).

<sup>&</sup>lt;sup>g</sup>Not mass-weighted.

<sup>&</sup>lt;sup>h</sup>See Ref. [23] for a discussion of using electric field-dependent functions.

<sup>&</sup>lt;sup>i</sup>(Neese eq. 77) is for real perturbations; in the case of imaginary perturbations, the sum changes to a difference.

The form of (Yamaguchi eq. 17.54) and (Neese eq. 77) as shown above should make it clear that for a second derivative of an HF wavefunction, only one set of U matrices is needed. This leads to a potential computational savings. Considering the IR intensities  $\frac{d^2E}{dX_A dF_\alpha}$ , calculating  $\frac{d}{dX_A}(\mu_\alpha)$  would require 3N U matrices (one for each nuclear displacement), but using (1.14) to calculate  $\frac{d}{dF_\alpha}\left(\frac{dE}{dX_A}\right)$  would only require 3 U matrices (one for each external field component).

## **1.3.6** Perturbation theory

In Rayleigh–Schrödinger perturbation theory<sup>j</sup>, the exact Hamiltonian  $\hat{H}$  of a system under an applied perturbation  $\hat{V}$  can be written as

$$\hat{H} = \hat{H}^{(0)} + \lambda \hat{V}, \qquad (1.43)$$

where  $\hat{H}^{(0)}$  is the Hamiltonian in the absence of the perturbation and  $\lambda \in [0, 1]$  controls the strength of the perturbation. Note that it is not yet necessary to specify the exact form of  $\hat{V}$ . The main assumption in perturbation theory, worded in two ways, is that the unperturbed Hamiltonian is an acceptable approximation to the exact Hamiltonian, and the perturbation is small. This assumption allows for a power (Maclaurin) series expansion of the wavefunction  $|\Psi_i\rangle$  and its energy  $\mathcal{E}_i$  for a given state *i*, where increasing orders account for better approximations to the exact (perturbed) energy:<sup>k</sup>

$$|\Psi_i\rangle = |\psi_i^{(0)}\rangle + \lambda |\psi_i^{(1)}\rangle + \lambda^2 |\psi_i^{(2)}\rangle + \dots$$
(1.44)

$$\mathcal{E}_{i} = E_{i}^{(0)} + \lambda E_{i}^{(1)} + \lambda^{2} E_{i}^{(2)} + \dots$$
(1.45)

Combining (1.43), (1.44), and (1.45) into the Schrödinger equation,

$$\hat{H} |\Psi_i\rangle = \mathcal{E}_i |\Psi_i\rangle, \qquad (1.46)$$

<sup>&</sup>lt;sup>j</sup>See Szabo & Ostlund<sup>5</sup> page 322; identical notation is followed throughout, except the summation index n is generally replaced with k.

<sup>&</sup>lt;sup>k</sup>While one hopes the series is convergent, it is often not the case, so the series is often truncated at the second-order correction to the energy, which may still be useful. See Ref. [24] for a series convergence study. It is unclear if the same issue exists when  $\hat{V}$  corresponds to an operator other than  $\hat{V}_{ee}$ , such as for external fields.

gives

$$\begin{pmatrix} \hat{H}^{(0)} + \lambda \hat{V} \end{pmatrix} \begin{bmatrix} |\psi_i^{(0)}\rangle + \lambda |\psi_i^{(1)}\rangle + \lambda^2 |\psi_i^{(2)}\rangle + \dots \end{bmatrix}$$

$$= \begin{bmatrix} E_i^{(0)} + \lambda E_i^{(1)} + \lambda^2 E_i^{(2)} + \dots \end{bmatrix} \begin{bmatrix} |\psi_i^{(0)}\rangle + \lambda |\psi_i^{(1)}\rangle + \lambda^2 |\psi_i^{(2)}\rangle + \dots \end{bmatrix},$$
(1.47)

where the  $\{\lambda\}$  are now also useful for collecting terms of like orders. The zeroth-order terms give the Schrödinger equation for the unperturbed energy,

$$\hat{H}^{(0)} |\psi_i^{(0)}\rangle = E_i^{(0)} |\psi_i^{(0)}\rangle, \qquad (1.48)$$

but equating all terms that are first order in  $\lambda$  on both sides gives

$$\hat{H}^{(0)} |\psi_i^{(1)}\rangle + \hat{V} |\psi_i^{(0)}\rangle = E_i^{(0)} |\psi_i^{(1)}\rangle + E_i^{(1)} |\psi_i^{(0)}\rangle, \qquad (1.49)$$

where  $\lambda$  has been dropped for readability since it is present in front of each term. (1.49) can be simplified through integration using the bra  $\langle \psi_i^{(0)} |$ , which does not change the order from  $\lambda^1$ :

$$\langle \psi_i^{(0)} | \left( \hat{H}^{(0)} | \psi_i^{(1)} \rangle + \hat{V} | \psi_i^{(0)} \rangle \right) = \langle \psi_i^{(0)} | \left( E_i^{(0)} | \psi_i^{(1)} \rangle + E_i^{(1)} | \psi_i^{(0)} \rangle \right)$$

$$\langle \psi_i^{(0)} | \hat{H}^{(0)} | \psi_i^{(1)} \rangle + \langle \psi_i^{(0)} | \hat{V} | \psi_i^{(0)} \rangle = \langle \psi_i^{(0)} | E_i^{(0)} | \psi_i^{(1)} \rangle + \langle \psi_i^{(0)} | E_i^{(1)} | \psi_i^{(0)} \rangle$$

$$= E_i^{(0)} \langle \psi_i^{(0)} | \psi_i^{(1)} \rangle + E_i^{(1)} \langle \psi_i^{(0)} | \psi_i^{(0)} \rangle .$$

$$(1.50)$$

It is now important to know what orthonormality conditions exist between the set of all corrected states  $\left\{ |\psi_i^{(n)}\rangle \right\}$ . For the unperturbed state, which is usually the Hartree–Fock ground state,

$$\langle \psi_i^{(0)} | \psi_i^{(0)} \rangle = 1,$$
 (1.51)

and the choice of *intermediate normalization* is made,

$$\langle \psi_i^{(0)} | \Psi_i \rangle \stackrel{!}{=} 1, \tag{1.52}$$

which upon expanding the ket using (1.44) leads to

$$\langle \psi_i^{(0)} | \psi_i^{(n)} \rangle = 0 \tag{1.53}$$

for any correction state where n > 0. Returning to (1.50), this first allows for simplification of the right-hand side,

$$\langle \psi_i^{(0)} | \hat{H}^{(0)} | \psi_i^{(1)} \rangle + \langle \psi_i^{(0)} | \hat{V} | \psi_i^{(0)} \rangle = E_i^{(0)} \langle \psi_i^{(0)} | \psi_i^{(1)} \rangle + E_i^{(1)} \langle \psi_i^{(0)} | \psi_i^{(0)} \rangle^{*1}$$

$$= E_i^{(1)},$$

$$(1.54)$$

and the first term on the left-hand side can be simplified using the hermiticity of the Hamiltonian followed by (1.53),

$$\langle \psi_{i}^{(0)} | \hat{H}^{(0)} | \psi_{i}^{(1)} \rangle = \langle \psi_{i}^{(1)} | \hat{H}^{(0)} | \psi_{i}^{(0)} \rangle^{*}$$

$$= \langle \psi_{i}^{(1)} | E_{i}^{(0)} | \psi_{i}^{(0)} \rangle^{*}$$

$$= E_{i}^{(0)} \langle \psi_{i}^{(1)} | \psi_{i}^{(0)} \rangle^{*}$$

$$= E_{i}^{(0)} \langle \psi_{i}^{(0)} | \psi_{i}^{(1)} \rangle^{*}$$

$$= 0.$$

$$(1.55)$$

The final form of (1.50) is now

$$\langle \psi_i^{(0)} | \hat{V} | \psi_i^{(0)} \rangle = E_i^{(1)}, \tag{1.56}$$

revealing that the first-order correction to the energy is the expectation value of the perturbation operator over the zeroth-order wavefunction. For context, when using perturbation theory to approximate the correlation energy of system on top of the mean-field wavefunction,  $\hat{V} \equiv \hat{V}_{ee} = \frac{1}{|\vec{r}_1 - \vec{r}_2|} = \frac{1}{r_{12}}$ , the electron-electron repulsion operator. However, the perturbation operator may be any one- or two-electron operator, and (1.56) is exact as long as  $|\psi_i^{(0)}\rangle$ is a variationally-optimized state<sup>1</sup>. The key insight is that to calculate the first-order correction to the energy, only the zeroth-order wavefunction is required. This means that if  $\hat{V}$  is replaced with an operator related to a molecular property, it can be calculated as an expectation value without needing the perturbed wavefunction. This is the same result as

<sup>&</sup>lt;sup>1</sup>Hartree–Fock and most density functional approximations that do not contain a perturbative correction (such as double hybrids) satisfy this criterion. Additionally, it is important for ALMO-EDA, where the polarized but CT-disallowed intermediate state  $|\psi_{\text{pol}}\rangle$  is variational, but the frozen density state  $|\psi_{\text{frz}}\rangle$  is *not*. All the work found in chapter 5 starts from  $|\psi_{\text{pol}}\rangle$ , so the use of a Lagrangian to account for orbital relaxation (leading to additional terms) is unnecessary.

in (Yamaguchi eq. 4.21), and resembles the result of the Hellmann–Feynman theorem when the AO basis is not dependent on the perturbation.

The generalization of (1.56) is that for n > 0, the *n*th order correction to the energy is given by

$$E_i^{(n)} = \langle \psi_i^{(0)} | \hat{V} | \psi_i^{(n-1)} \rangle , \qquad (1.57)$$

so to find the second-order correction to the energy, the first-order correction to the wavefunction is required. The general rule is that given the *n*th order correction to the wavefunction, the 2n + 1th order correction to the energy can be calculated. This is known as Wigner's 2n + 1 rule (see section 6.9.2.4). From (1.57), the first form of the second-order correction is

$$E_i^{(2)} = \langle \psi_i^{(0)} | \hat{V} | \psi_i^{(1)} \rangle , \qquad (1.58)$$

where the problem now becomes the calculation of the perturbed wavefunction  $|\psi_i^{(1)}\rangle$ . The strategy is to expand it as a linear combination of eigenfunctions of  $\hat{H}^{(0)}$  that are orthogonal to the unperturbed state (in line with (1.53)),

$$\langle k | \psi_i^{(0)} \rangle \stackrel{!}{=} 0, \tag{1.59}$$

and form a complete orthonormal set  $\left\{ |\psi_k^{(0)}\rangle \right\} \equiv \{|k\rangle\},\$ 

$$|\psi_i^{(1)}\rangle = \sum_k c_k^{(1)} |k\rangle,$$
 (1.60)

leading to

$$\langle k | \psi_i^{(1)} \rangle = c_k^{(1)}.$$
 (1.61)

Using (1.53) and the fact that the set  $\{|k\rangle\}$  is complete, the resolution of the identity can be inserted:

$$|\psi_i^{(1)}\rangle = \sum_k |k\rangle \langle k|\psi_i^{(1)}\rangle \tag{1.62}$$

To calculate the first-order correction to the wavefunction, first rearrange (1.49) to collect all terms with the same ket,

$$(E_i^{(0)} - \hat{H}^{(0)}) |\psi_i^{(1)}\rangle = (\hat{V} - E_i^{(1)}) |\psi_i^{(0)}\rangle, \qquad (1.63)$$

and multiply (1.63) on the left with  $\langle k |$  to give

$$E_{i}^{(0)} \langle k | \psi_{i}^{(1)} \rangle - \langle k | \hat{H}^{(0)} | \psi_{i}^{(1)} \rangle = \langle k | \hat{V} | \psi_{i}^{(0)} \rangle - E_{i}^{(1)} \langle k | \psi_{i}^{(0)} \rangle, \qquad (1.64)$$

where the last term cancels due to  $\langle a|b\rangle = \delta_{ab}, \{a,b\} \in k$ , and  $|k\rangle \neq |\psi_i^{(0)}\rangle$  from (1.59). To deal with the second term, use (1.60), canceling terms again due to orthonormality, and finally inserting (1.61):

$$\langle k | \hat{H}^{(0)} | \psi_i^{(1)} \rangle = \langle k | \hat{H}^{(0)} | \left( \sum_a c_a^{(1)} | a \rangle \right)$$

$$= \langle k | \hat{H}^{(0)} | \left( c_a^{(1)} | a \rangle + c_b^{(1)} | b \rangle + \dots + c_k^{(1)} | k \rangle + \dots \right)$$

$$= \langle k | \left( E_a^{(0)} c_a^{(1)} | a \rangle + E_b^{(0)} c_b^{(1)} | b \rangle + \dots + E_k^{(0)} c_k^{(1)} | k \rangle + \dots \right)$$

$$= E_a^{(0)} c_a^{(1)} \langle k | a \rangle^{-1} + E_b^{(0)} c_b^{(1)} \langle k | b \rangle^{-1} + \dots + E_k^{(0)} c_k^{(1)} \langle k | k \rangle^{-1} + \dots$$

$$= E_k^{(0)} c_k^{(1)}$$

$$= E_k^{(0)} \langle k | \psi_i^{(1)} \rangle .$$

$$(1.65)$$

Plugging (1.65) back into (1.64) gives

$$\left(E_i^{(0)} - E_k^{(0)}\right) \langle k | \psi_i^{(1)} \rangle = \langle k | \hat{V} | \psi_i^{(0)} \rangle \tag{1.66}$$

$$\langle k | \psi_i^{(1)} \rangle = \frac{\langle k | V | \psi_i^{(0)} \rangle}{E_i^{(0)} - E_k^{(0)}}, \qquad (1.67)$$

which upon inserting into (1.62), gives the final form of the first-order correction to the perturbed wavefunction:

$$|\psi_i^{(1)}\rangle = \sum_{k \neq i} |k\rangle \, \frac{\langle k|\hat{V}|\psi_i^{(0)}\rangle}{E_i^{(0)} - E_k^{(0)}}.$$
(1.68)

Inserting (1.68) into (1.58) then gives the second-order correction to the perturbed energy:

$$E_{i}^{(2)} = \langle \psi_{i}^{(0)} | \hat{V} \left\{ \sum_{k \neq i} |k\rangle \frac{\langle k | \hat{V} | \psi_{i}^{(0)} \rangle}{E_{i}^{(0)} - E_{k}^{(0)}} \right\}$$

$$= \sum_{k \neq i} \frac{\langle \psi_{i}^{(0)} | \hat{V} | k\rangle \langle k | \hat{V} | \psi_{i}^{(0)} \rangle}{E_{i}^{(0)} - E_{k}^{(0)}}.$$
(1.69)

In the case where  $\hat{V}$  is operator with multiple components, such as the dipole operator in (1.28), the energy becomes a rank-2 tensor, the polarizability matrix:

$$\alpha_{ab} = -\sum_{k \neq i} \frac{\langle \psi_i^{(0)} | \hat{\mu}_a | k \rangle \langle k | \hat{\mu}_b | \psi_i^{(0)} \rangle}{E_i^{(0)} - E_k^{(0)}}.$$
(1.70)

(1.70) is called a sum-over-states expansion due to the explicit summation over the set of excited states  $|\psi_k^{(0)}\rangle$ . Although the derivation assumes that all states are exact and the summation is infinite, the actual states are formed from the basis of excited Slater determinants using the converged SCF wavefunction as the reference state  $|\psi_i^{(0)}\rangle$ .

# 1.4 DYNAMIC (FREQUENCY-DEPENDENT) RESPONSE PROPERTIES

Up to this point, only static perturbations have been considered, where the strength of an applied field does not oscillate or vary with time. This is perfectly satisfactory for many properties, such as those that are intrinsic to the system or do not depend on field strength. For example, it does not make sense to have a field strength directly associated with a change in nuclear positions; this is not the same thing as having nuclear positions change in the presence of an applied field. Similarly, from Table 1, rotational and nuclear magnetic moments do not have a strength associated with them. This holds generally for "internal" perturbations. However, many non-linear optical processes in particular take advantage of oscillating fields, so frequency- or time-dependent molecular response properties must be calculable.

In order to deal with frequency-dependent response, a slightly different path must be taken, in part because the total energy of the system is no longer stationary with time, so energy derivatives as encountered in Section 1.3.5 are not physically well-defined. There are numerous possible derivation frameworks which cannot be done justice here. Equivalent results arise from time-dependent perturbation theory, quasienergy derivatives,<sup>1,3,25,26</sup> and the polarization propagator,<sup>6</sup> to name a few. Ideally, there is a time-dependent extension of Section 1.3.2 that at some step allows for identification of coefficients in a series expansion with response functions. Similarly, in the static limit ( $\omega \rightarrow 0$ ), results from analytic derivative theory should be recovered, making time-dependent response theory a more general framework for response properties. The following derivation is borrowed heavily from Ref. [26], with expansion using Ref. [1].

# 1.4.1 Quasienergy derivatives

The starting point is the now the time-dependent Schrödinger equation (TDSE),

$$\hat{H}(t) |\Psi(t)\rangle = i \frac{\partial}{\partial t} |\Psi(t)\rangle, \qquad (1.71)$$

which, unlike (1.46) does not have the energy on the right-hand side. It is useful to factor out the time-dependent phase of the wavefunction,

$$|\Psi(t)\rangle = e^{-i\mathcal{F}(t)} |\tilde{\Psi}(t)\rangle, \qquad (\text{Toulouse eq. 48})$$

where  $\Psi(t)$  is the original unfactored wavefunction,  $\mathcal{F}(t)$  is a phase factor, and  $\tilde{\Psi}(t)$  is the phase-isolated wavefunction.<sup>m</sup> Rearrange the TDSE (1.71),

$$\left[\hat{H}(t) - i\frac{\partial}{\partial t}\right]|\Psi(t)\rangle = 0, \qquad (\text{Toulouse eq. 47})$$

and use the phase-isolated wavefunction<sup>n</sup>

$$\left[\hat{H}(t) - i\frac{\partial}{\partial t}\right] \left|\tilde{\Psi}(t)\right\rangle = \dot{\mathcal{F}}(t) \left|\tilde{\Psi}(t)\right\rangle, \qquad (\text{Toulouse eq. 49})$$

where  $\dot{\mathcal{F}}(t)$  now resembles the energy from the time-independent Schrödinger equation (TISE). This "energy" is still not stationary with time, however it will reappear later as part of a stationary theory.

Before going further, the Hamiltonian must be specified. The partitioning introduced in (1.43) is modified:

$$\hat{H}(t) = \hat{H}^{(0)} + \hat{V}(t),$$
(1.72)

 ${}^{\mathrm{n}}\dot{A}(t) = \mathrm{d}A(t)/\mathrm{d}t$ 

<sup>&</sup>lt;sup>m</sup>This notation is consistent with Ref. [1]. In Ref. [26],  $\bar{\Psi}(t)$  is the total wavefunction and  $\Psi(t)$  is the phase-isolated wavefunction. In Ref. [25],  $|\bar{0}\rangle$  is the total wavefunction,  $|\tilde{0}\rangle$  is the phase-isolated wavefunction, and  $|0\rangle$  is the stationary wavefunction, recovered from  $|\tilde{0}(t \to 0)\rangle$ .

so that time-dependence is introduced only to the perturbation and not the standard molecular Hamiltonian.<sup>o</sup> The prototypical perturbation usually represents an external electric field that is slowly turned on in order for the system to gradually respond and may oscillate with time at a characteristic frequency.<sup>p</sup> Representing the perturbation in terms of Fourier components,

$$\hat{V}(t) = x_1 \hat{B} e^{-i\omega t} + x_2 \hat{A} e^{+i\omega t},$$
(Toulouse eq. 46 [modified])

shows that the perturbation, and therefore the Hamiltonian, is periodic in time  $(\hat{H}(t+T) = \hat{H}(t))$  with a period of  $T = 2\pi/\omega$ . Other perturbation shapes, such as step functions, can be represented using a more general form of (Toulouse eq. 46 [modified]) with more Fourier components:

$$\hat{V}(t) = \sum_{k=-N}^{N} e^{-i\omega_k t} \sum_{X} \epsilon_X(\omega_k) \hat{X}, \qquad (\text{Gauss eq. 106})$$

where k is the Fourier component index,  $\omega_k$  are the frequencies, and  $\epsilon_X(\omega_k)$  and  $\hat{X}$  are the corresponding perturbation strengths and operators. This gives the required integration bounds for (Toulouse eq. 49), leading to

$$\mathcal{Q} = \frac{1}{T} \int_0^T \mathrm{d}t \, \dot{\mathcal{F}}(t)$$

$$= \frac{1}{T} \int_0^T \mathrm{d}t \, \frac{\langle \tilde{\Psi}(t) | \left[ \hat{H}(t) - i \frac{\partial}{\partial t} \right] | \tilde{\Psi}(t) \rangle}{\langle \tilde{\Psi}(t) | \tilde{\Psi}(t) \rangle},$$
(Toulouse eq. 50)

where Q is the *time-averaged quasienergy*. The second part of (Toulouse eq. 50) is the variational condition for  $\tilde{\Psi}(t)$ , making Q stationary with respect to fluctuations in  $\tilde{\Psi}(t)$ . In the time-independent case, the quasienergy reduces to the (time-independent) energy, and the phase-isolated wavefunction reduces to the (time-independent) wavefunction.

The time-averaged quasienergy can now be expanded with respect to the perturbation parameters,

$$\mathcal{Q}(x_1, x_2) = \mathcal{Q}^{(0)} + \mathcal{Q}^{(10)}x_1 + \mathcal{Q}^{(01)}x_2 + \frac{1}{2}\mathcal{Q}^{(20)}x_1^2 + \mathcal{Q}^{(11)}x_1x_2 + \frac{1}{2}\mathcal{Q}^{(02)}x_2^2 + \dots,$$
(Toulouse eq. 51)

<sup>&</sup>lt;sup>o</sup>Sometimes  $\hat{V}(t)$  is notated as  $\hat{H}'(t)$  or  $\hat{H}^{(1)}(t)$ ; all are equivalent as long as the perturbation and time partitioning in the full Hamiltonian are the same.

<sup>&</sup>lt;sup>p</sup>In the case that the response of the system is slower than the speed of which the perturbation is turned on, a different (undesirable) solution may be found if the perturbation is strong enough.

analogous to the series expansion in Section 1.3.2. However, the expansion coefficients  $\partial^n Q/\partial x^n$  are still not in a position to be directly calculable for an approximate theory due to the presence of the integral in (Toulouse eq. 50), unlike in the static case, so the time-dependent theory must be further derived for exact states.

Using the time-dependent form of (1.56),

$$\mathcal{Q}^{(10)} = \frac{1}{T} \int_0^T \mathrm{d}t \, \langle \tilde{\Psi}_0 | \hat{B} e^{-i\omega t} | \tilde{\Psi}_0 \rangle$$
  
=  $\langle \tilde{\Psi}_0 | \hat{B} | \tilde{\Psi}_0 \rangle \, \delta[\omega].$  (Toulouse eq. 53)

The rule used in (Toulouse eq. 53) is

$$\frac{1}{T} \int_0^T \mathrm{d}t \, e^{-i\omega t} = \delta[\omega] = \begin{cases} \delta_{\omega,0} & |T| < \infty\\ \delta(\omega) & T \to \infty \end{cases},\tag{1.73}$$

where we define  $\delta[\omega]$  as the Kronecker delta for finite T and the Dirac delta for  $T \to \infty$ . More explicitly,  $\delta[\omega = 0] = (1/T) \int_0^T dt \, e^0 = 1$ .  $\delta[\omega \neq 0]$  would lead a non-zero value for exponential inside (1.73), which when expanded as sines and cosines, gives rise to terms that are not physically admissible as Fourier components. The conclusion is that only static firstorder properties are non-zero, where the physical intuition is that absorption or emission of a photon with  $\omega \neq 0$  would violate energy conservation. Using (1.58) and (1.52),

$$\mathcal{Q}^{(20)} = \frac{1}{T} \int_0^T \mathrm{d}t \, 2 \left\langle \tilde{\Psi}_0 | \hat{B} e^{-i\omega t} | \tilde{\Psi}^{(10)}(t) \right\rangle, \qquad (\text{Toulouse eq. 54})$$

where the first-order wavefunction correction is (similar to (1.60))

$$|\tilde{\Psi}^{(10)}(t)\rangle = \sum_{n \neq 0} c_n^{(10)}(t) e^{-i\omega_{n0}t} |\tilde{\Psi}_n\rangle, \qquad (\text{Toulouse eq. 55})$$

where  $\omega_{n0} = E_n - E_0$  are the unperturbed system excitation energies. The first-order wavefunction expansion coefficients are found similarly to (1.61),

$$c_n^{(10)}(t) = -i \int_{-\infty}^t \mathrm{d}t' \, \langle \tilde{\Psi}_n | \hat{B} e^{-i\omega t'} e^{\gamma t'} | \tilde{\Psi}_0 \rangle \, e^{i\omega_{n0}t'}, \qquad (\text{Toulouse eq. 56})$$

where a factor of  $e^{\gamma t}$  with  $\gamma \to 0^+$  adiabatically switches on the perturbation from  $t' \to -\infty$  and imposes the initial condition  $c_n^{(10)}(t \to -\infty) = 0$ . Performing the integration in (Toulouse eq. 56) gives

$$c_n^{(10)}(t) = \frac{\langle \tilde{\Psi}_n | \hat{B} e^{-i\omega t} | \tilde{\Psi}_0 \rangle e^{i\omega_{n0}t}}{\omega - \omega_{n0} + i\gamma},$$
 (Toulouse eq. 57)

where the factor  $e^{\gamma t}$  is dropped from the numerator, but now supplies a damping factor for when the field oscillation comes close to a resonance (excitation energy). Now (Toulouse eq. 54), (Toulouse eq. 55), and (Toulouse eq. 57) are combined to give

$$\mathcal{Q}^{(20)} = \frac{1}{T} \int_0^T \mathrm{d}t \, 2 \sum_{n \neq 0} \frac{\langle \tilde{\Psi}_0 | \hat{B} e^{-i\omega t} | \tilde{\Psi}_n \rangle \, \langle \tilde{\Psi}_n | \hat{B} e^{-i\omega t} | \tilde{\Psi}_0 \rangle}{\omega - \omega_{n0} + i\gamma}$$

$$= 2 \sum_{n \neq 0} \frac{\langle \tilde{\Psi}_0 | \hat{B} | \tilde{\Psi}_n \rangle \, \langle \tilde{\Psi}_n | \hat{B} | \tilde{\Psi}_0 \rangle}{\omega - \omega_{n0} + i\gamma} \delta[2\omega],$$
(Toulouse eq. 58)

which is only finite for  $\omega = 0$  similarly to (Toulouse eq. 53). Performing the same steps for the mixed term,

$$\begin{aligned} \mathcal{Q}^{(11)} &= \frac{1}{T} \int_{0}^{T} \mathrm{d}t \, \left[ \langle \tilde{\Psi}_{0} | \hat{A}e^{+i\omega t} | \tilde{\Psi}^{(10)}(t) \rangle + \langle \tilde{\Psi}_{0} | \hat{B}e^{-i\omega t} | \tilde{\Psi}^{(01)}(t) \rangle \right] \\ &= \frac{1}{T} \int_{0}^{T} \mathrm{d}t \, \left[ \frac{\langle \tilde{\Psi}_{0} | \hat{A}e^{+i\omega t} | \tilde{\Psi}_{n} \rangle \, \langle \tilde{\Psi}_{n} | \hat{B}e^{-i\omega t} | \tilde{\Psi}_{0} \rangle}{\omega - \omega_{n0} + i\gamma} + \frac{\langle \tilde{\Psi}_{0} | \hat{B}e^{-i\omega t} | \tilde{\Psi}_{n} \rangle \, \langle \tilde{\Psi}_{n} | \hat{A}e^{+i\omega t} | \tilde{\Psi}_{0} \rangle}{-\omega - \omega_{n0} + i\gamma} \right] \\ &= \sum_{n \neq 0} \frac{\langle \tilde{\Psi}_{0} | \hat{A} | \tilde{\Psi}_{n} \rangle \, \langle \tilde{\Psi}_{n} | \hat{B} | \tilde{\Psi}_{0} \rangle}{\omega - \omega_{n0} + i\gamma} - \sum_{n \neq 0} \frac{\langle \tilde{\Psi}_{0} | \hat{B} | \tilde{\Psi}_{n} \rangle \, \langle \tilde{\Psi}_{n} | \hat{A} | \tilde{\Psi}_{0} \rangle}{\omega + \omega_{n0} - i\gamma}, \end{aligned} \tag{Toulouse eq. 59}$$

which is in general nonzero for all  $\omega$ . Physically, it corresponds to the absorption of a virtual photon due to  $\hat{B}$  that probes the excited states of the system, followed by emission of a photon due to  $\hat{A}$ , which is allowed due to net energy conservation.  $Q^{(11)}$  is the *linear response* function of operators  $\hat{A}$  and  $\hat{B}$  in the spectral representation and it is often denoted as  $Q^{(11)} =$  $\langle \langle \hat{A}; \hat{B} \rangle \rangle_{\omega}$  (see Table 2). Physically, it can be viewed as the change in the expectation value of the operator  $\hat{A}$  due to the perturbation  $\hat{B}e^{-i\omega t}$ . Due to the pole structure introduced by the denominator (with de-excitation energies arising from the second term), (Toulouse eq. 59) contains information about all the excitation energies of the system. Higher-order derivatives of the quasienergy lead to time-dependent non-linear response functions: third derivatives correspond to quadratic response, and fourth derivatives correspond to cubic response, and so on.

# 2.0 CARBON CAPTURE FROM CARBON DIOXIDE'S POINT-OF-VIEW

The text in this chapter has been adapted from Brinzer, T.; Berquist, E. J.; Ren, Z.; Dutta, S.; Johnson, C. A.; Krisher, C. S.; Lambrecht, D. S.; Garrett-Roe, S. Ultrafast Vibrational Spectroscopy (2D-IR) of CO<sub>2</sub> in Ionic Liquids: Carbon Capture from Carbon Dioxide's Point of View. J. Chem. Phys. **2015**, 142, 212425, DOI: 10.1063/1.4917467, and its erratum Brinzer, T.; Berquist, E. J.; Dutta, S.; Johnson, C. A.; Krisher, C. S.; Lambrecht, D. S.; Garrett-Roe, S.; Ren, Z. Erratum: "Ultrafast vibrational spectroscopy (2D-IR) of CO<sub>2</sub> in ionic liquids: Carbon capture from carbon dioxide's point of view" [J. Chem. Phys. 142, 212425 (2015)]. J. Chem. Phys. **2017**, 147, 049901, DOI: 10.1063/1.4995447. The author's contribution to the work included performing all *ab initio* calculations and writing the corresponding sections 2.4.2, 2.4.3, and 2.3.5. These calculations consisted of constructing molecular models, performing geometry optimizations followed by harmonic frequency calculations using DFT, and designing the application of ALMO-EDA to vibrational frequency analysis.

## 2.1 SUMMARY

The CO<sub>2</sub>  $\nu_3$  asymmetric stretching mode is established as a vibrational chromophore for ultrafast two-dimensional infrared (2D-IR) spectroscopic studies of local structure and dynamics in ionic liquids, which are of interest for carbon capture applications. CO<sub>2</sub> is dissolved in a series of 1-butyl-3-methylimidazolium-based ionic liquids ([Im<sub>4,1</sub>][X]), where [X]<sup>-</sup> is the anion from the series hexafluorophosphate (PF<sub>6</sub><sup>-</sup>), tetrafluoroborate (BF<sub>4</sub><sup>-</sup>), bis-(trifluoromethylsulfonyl)imide (Tf<sub>2</sub>N<sup>-</sup>), triflate (TfO<sup>-</sup>), trifluoroacetate (TFA<sup>-</sup>), dicyanamide (DCA<sup>-</sup>), and thiocyanate (SCN<sup>-</sup>). In the ionic liquids studied, the  $\nu_3$  center frequency is sensitive to the local solvation environment and reports on the timescales for local structural relaxation. Density functional theory calculations predict charge transfer from the anion to the CO<sub>2</sub> and from CO<sub>2</sub> to the cation. The charge transfer drives geometrical distortion of CO<sub>2</sub>, which in turn changes the  $\nu_3$  frequency. The observed structural relaxation timescales vary by up to an order of magnitude between ionic liquids. Shoulders in the 2D-IR spectra arise from anharmonic coupling of the  $\nu_2$  and  $\nu_3$  normal modes of CO<sub>2</sub>. Thermal fluctuations in the  $\nu_2$  population stochastically modulate the  $\nu_3$  frequency and generate dynamic cross-peaks. These timescales are attributed to the breakup of ion cages that create a well-defined local environment for CO<sub>2</sub>. The results suggest that the picosecond dynamics of CO<sub>2</sub> are gated by local diffusion of anions and cations.

## 2.2 INTRODUCTION

There is a pressing need to develop next-generation materials to capture  $CO_2$  from fossil-fuel burning power plants. Commercial carbon capture technologies are inefficient and greatly increase the cost of energy.<sup>29</sup> Novel materials, including metal-organic frameworks,<sup>30,31</sup> polymers,<sup>32,33</sup> and ionic liquids,<sup>34–36</sup> have been proposed as transformational technologies. In each case, however, a lack of tools to interrogate at a molecular scale how  $CO_2$  interacts with the sorbents, what local structures it forms, and for how long those structures persist has limited the ability to optimize these materials for this important task.

Our strategy to investigate the local environment of  $CO_2$  is to use a vibration of the  $CO_2$ itself. We hypothesized that the antisymmetric stretching vibration of  $CO_2$ , the  $\nu_3$  mode, could be a sensitive probe of the carbon capture process and that ultrafast two-dimensional vibrational spectroscopy (2D-IR) could give new insight into the local structure and dynamics around the  $CO_2$ . The central goal of this report is to establish the  $\nu_3$  mode of  $CO_2$  as a viable platform for ultrafast multidimensional spectroscopy of carbon capture in ionic liquids.

Ionic liquids, sometimes called room temperature molten salts, excite particular interest for carbon capture due to their chemical tunability. Ionic liquids are organic salts that are molten at or below 100 °C. Each formula unit consists of an anion-cation pair without a surrounding solvent. The physical and chemical properties of ionic liquids can be manipulated by changing the specific anion and cation pair, which provides tremendous flexibility. The chemical space spanned by possible ionic liquids is estimated at  $10^{18}$  anion-cation combinations, including binary and ternary mixtures,<sup>37</sup> only a tiny fraction of which has been explored. Even without optimization, many ionic liquids have CO<sub>2</sub> solubility and selectivity comparable to molecular solvents,<sup>38,39</sup> and chemical modification can improve these properties further.<sup>40,41</sup> Ionic liquids exhibit negligible vapor pressure and are generally thermally and hydrolytically stable at the operating temperature (~ 50 °C) of post-combustion carbon capture.

The promise of chemical tunability of ionic liquid properties has spurred efforts to design improved ionic liquids, both synthetically<sup>34,40–45</sup> and *in silico*.<sup>46,47</sup> Additionally, other strategies, such as creating mixtures of multiple ionic liquids,<sup>48,49</sup> or mixtures of ionic liquids with molecular solvents<sup>50,51</sup> show promise. Despite the progress that has been made, there remains a lack of fundamental understanding of the local solute-solvent interactions between  $CO_2$  and the ionic liquid sorbents.

Molecular modelling provides valuable insights but faces challenges due to the timeand length-scale mismatches between the simulations and bulk thermodynamic experiments. For example, electronic structure theory can predict  $CO_2$  binding motifs and energies,<sup>52–55</sup> molecular dynamics simulations of  $CO_2$  in ionic liquids can provide atomistic detail of local structure and dynamics in the condensed phase,<sup>56–61</sup> and Monte Carlo simulations can calculate important thermodynamic properties.<sup>57,62–66</sup> However, it remains a challenge to directly compare these results to macroscopic experimental observables such as viscosity or  $CO_2$  solubility.

Ultrafast spectroscopy naturally provides observables that are compatible with the timeand length-scales of molecular modelling. Ultrafast two-dimensional infrared spectroscopy (2D-IR), a coherent third-order spectroscopy, can investigate femtosecond to picosecond molecular dynamics in the condensed phase at equilibrium.<sup>67–70</sup>

A 2D-IR experiment, in essence, measures the distribution of vibrational frequencies in an ensemble of molecules at two points in time, separated by a controllable delay. When the delay is short, the local environment does not have time to reorganize, causing correlation of initial and final frequencies, and stretching the 2D-IR peak along the frequency diagonal. As the delay time is increased, the system loses memory of its initial configuration and the peaks become rounder. Thus, 2D-IR spectra encode the two-point frequency fluctuation correlation function through the change in their shape with the population time,  $t_2$ , of the experiment

$$c_2(t_2) = \langle \delta\omega(t_2)\delta\omega(0) \rangle \tag{2.1}$$

where  $\delta\omega(t)$  is the offset of the instantaneous vibrational frequency  $\omega(t)$  from the average  $\langle \omega \rangle$ 

$$\delta\omega(t) = \omega(t) - \langle\omega\rangle \tag{2.2}$$

This time-correlation function is the essential information content of any specific peak in 2D-IR spectroscopy, which can be compared with the available time-correlation functions from molecular simulations.

Cross-peaks in 2D-IR also contain valuable information. Vibrational coupling of modes, population transfer, and chemical exchange can all generate cross-peaks in a 2D-IR spectrum. These mechanisms can be distinguished by their spectral kinetics. Vibrational coupling, or mixing of the local modes, causes cross-peaks that are seen even at the earliest population times, because they result from direct vibrational transitions, for example the coupling of the symmetric and antisymmetric stretching modes of water.<sup>71</sup> Coherence transfer between bright modes can additionally create beat frequencies in both their diagonal and cross-peaks.<sup>71</sup> Population transfer arises from the exchange of excited state population during  $t_2$ , for example, that of the Amide I modes of small peptides.<sup>72</sup> Chemical exchange results from the change in frequency of a single molecule as it moves between different local environments, for example, the exchange of free and complexed phenol-benzene.<sup>70</sup> Both population transfer and chemical exchange give rise to dynamic cross-peaks, whose relative intensity shows an early minimum, increasing with population time.

Linear spectroscopies can provide insight into structure and dynamics in ionic liquids. For example, Raman spectroscopy has been used to study  $CO_2$  in  $[Im_{4,1}][TFA],^{73}$  or the effects of ionic liquid water content on  $CO_2$  solubility.<sup>50</sup> Similarly, NMR spectroscopy has been used to probe the solvation of  $CO_2$  in imidazolium ionic liquids at high pressures.<sup>74,75</sup> A number of studies have also examined structure and dynamics in ionic liquids on an ultrafast timescale using various chromophores, including IR pump-probe measurements of small anions in ionic liquids,<sup>76</sup> 2D-IR studies of water<sup>71</sup> and thiocyanate<sup>77</sup> in imidazolium ionic liquids, electronic spectroscopy of solvated laser dyes,<sup>78,79</sup> and optical Kerr effect spectroscopies.<sup>80–83</sup> Each of these spectroscopies is sensitive to the spectral density of low frequency vibrations (i.e., the Fourier transform of  $c_2(t)$ ), but they differ in the coupling of their respective chromophores to the low frequency modes.

The difficulty for most ultrast spectroscopies lies in connecting the average solvent dynamics to the dynamics specifically around the CO<sub>2</sub>. Time-dependent Stokes shift and fluorescence upconversion experiments<sup>79</sup> can measure dynamics over a broad range of timescales; however, it is an open question how relevant the dynamics of a comparatively large laser dye are to those of a small molecule such as CO<sub>2</sub>. Optical Kerr effect spectroscopies<sup>80,84</sup> are sensitive to the many body Raman polarizability tensor, which is difficult to connect to specific motions around a solute in most cases. In our approach, our spectroscopic probe is guaranteed to access the solvation environment of CO<sub>2</sub> (because it *is* CO<sub>2</sub>) and is guaranteed to be local to the CO<sub>2</sub> (because it is an isolated vibration of the CO<sub>2</sub>). On the other hand, the observed solvation dynamics will arise from only those local motions which most strongly couple into the  $\nu_3$  mode; there is no guarantee that the accessible solvent motions are important. This report explores what information this otherwise optimal probe provides.

For our present purposes, a good spectroscopic probe should have the following properties: a high transition dipole moment ( $\varepsilon \sim 800$  to  $1000 \,\mathrm{M^{-1} \, cm^{-1}}$ ); a fundamental frequency in a spectral region that is free of fundamentals or strong combination bands (for most ionic liquids from 1600 to  $2600 \,\mathrm{cm^{-1}}$ ); sensitivity to the local environment; a lifetime,  $T_1$ , that is long enough to measure dynamics on a tens of picoseconds timescale; and, finally, a lineshape at least partially inhomogeneously broadened, so that motional narrowing (homogeneous broadening) does not average away the embedded information.

Given these requirements, the  $\nu_3$  band of CO<sub>2</sub> is a natural choice. Nonlinear spectroscopy on the  $\nu_3$  band ( $\varepsilon \sim 1000 \,\mathrm{M^{-1} \, cm^{-1}}$ ) has been demonstrated in water,<sup>85,86</sup> where the  $T_1$  time is ~ 10 ps. In addition, the mode absorbs in a free spectroscopic window of most ionic liquids (~ 2350 cm<sup>-1</sup>).

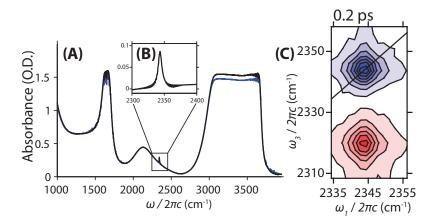


Figure 2: (A) FTIR spectrum of H<sub>2</sub>O with (blue line) and without (black line) CO<sub>2</sub> dissolved in it. CO<sub>2</sub>  $\nu_3$  lies in the overtones and combinations bands from H<sub>2</sub>O librational modes. (B) Inset of  $\nu_3$  with water background subtracted shows the Lorentzian character of the peak. (C) Purely absorptive 2D-IR spectrum of  $\nu_3$  in H<sub>2</sub>O with  $t_2 = 0.2$  ps shows that, in water, the line is nearly completely in the limit of homogeneous dynamics.

The remaining question is how sensitively  $CO_2$  reports on structural relaxation of its local environment in ionic liquids.  $CO_2$  in water is an important point of reference because, in water,  $CO_2$  is insensitive to its environment. The  $CO_2 \nu_3$  frequency shift from the gas phase to the condensed phase is very small, which indicates low sensitivity to the condensed phase local environment. In addition, the  $CO_2 \nu_3$  line is narrow and Lorentzian (Figure 2). Even at early population times, the 2D spectra show almost no diagonal character (Figure 2C), indicating that peak shape is determined by dephasing time,  $T_2$ , and that a deeper analysis of the frequency fluctuations (Equation 2.1) is not possible. This finding is consistent with previous three pulse photon echo peak shift (3PEPS) experiments.<sup>85</sup> In ionic liquids, the timescales of solvent motion are expected to be slower than in water, and the coupling to the environment may well be larger. Both of these effects would increase the ability to observe dynamics around  $CO_2$ .

The other vibrational modes of CO<sub>2</sub>, the symmetric stretch,  $\nu_1$ , and the doubly degenerate bend,  $\nu_2$  and  $\bar{\nu}_2$ , present distinct challenges for vibrational spectroscopy. The  $\nu_2$  modes are sensitive to the chemical environment of the  $CO_2$ ,<sup>87,88</sup> but are located in the crowded fingerprint region. The Raman active  $\nu_1$  is readily measured, but the lineshape is dominated by the Fermi resonance with the overtone of the  $\nu_2$ ;<sup>73</sup> furthermore, it is a dark mode for IR.

Here, we demonstrate that the CO<sub>2</sub>  $\nu_3$  mode reports on its local solvent environment by showing the sensitivity of the  $\nu_3$  frequency and dynamics to variation in solvent anion in a series of imidazolium ionic liquids; furthermore, we show that  $\nu_3$  reports a broad range of solvation timescales in these ionic liquids. We employ electronic structure calculations to investigate the mapping of vibrational frequencies onto structures of CO<sub>2</sub>-anion-cation clusters. We show that, despite apparent complexity, the CO<sub>2</sub> linear and 2D-IR lineshapes can be interpreted using simple and accurate physical models. Finally, we establish correlations between the measured dynamics of CO<sub>2</sub> and the macroscopic properties of its ionic liquid solvent.

The paper is organized as follows. Initially, we present the analysis and interpretation of the linear CO<sub>2</sub> spectrum (Section 2.4.1), including a discussion of its temperature dependence. Next, we describe the our results from electronic structure calculations on CO<sub>2</sub>anion-cation clusters and its relationship to our experimental data (Section 2.4.2), followed by a simple model of CO<sub>2</sub> that is able to reproduce the observed trends (Section 2.4.3). We then present an overview of the 2D-IR spectra (Section 2.4.4), including a kinetic analysis of the observed shoulders and cross-peaks (Section 2.4.5), assignments of the spectral features (Section 2.4.6), and modelling of the main  $\nu_3$  peak (Section 2.4.7) and shoulders and crosspeaks (Section 2.4.8). Finally, we present a discussion of the physical interpretation of our results (Section 2.5), conclusions (Section 2.6) and methods (Section 2.3).

# 2.3 METHODS

# 2.3.1 Materials

Ionic liquids were obtained from Ionic Liquids Technologies, Inc (IoLiTec), and used without further purification (except for  $[Im_{4,1}][BF_4]$ , which was purified prior to experiments using

the procedure described by Giernoth and Bankmann.<sup>89</sup>) Ionic liquid samples were stored in ambient conditions; however, prior to experiments, samples dried under vacuum at 50 mTorr.

# 2.3.2 FTIR

FTIR spectra were measured using a  $N_{2(g)}$ -purged Nicolet 6700 FTIR instrument (ThermoFisher Scientific). Ionic liquid samples were loaded with CO<sub>2</sub> (99.8% purity, Matheson TRIGAS) in an airtight custom glass vial, with a septum that allows access to the CO<sub>2</sub>loaded ionic liquid. An aliquot of the liquid sample was sandwiched between two 2 mm-thick CaF<sub>2</sub> optical windows (Crystran Ltd, UK) separated by a 25 µm Teflon spacer, which were held in a brass sample cell. The cell was assembled in a glove bag to limit adsorption of atmospheric water. Spectra were obtained for both the neat ionic liquid and for the ionic liquid loaded with CO<sub>2</sub>.

For temperature-dependent measurements, the sample was temperature-controlled by using a cooling/heating recirculating chiller (Fisher Isotemp) to control the temperature of the sample cell holder. The sample temperature was monitored by measuring the temperature at the optical window using a thermocouple (National Instruments USB-TC01 J-type).

### 2.3.3 2D-IR

**2.3.3.1 Generation of femtosecond mid-IR pulses** The experiments utilize a commercial Ti:Sapphire chirped pulse amplifier laser system ( $\lambda = 805 \text{ nm}, 5 \text{ kHz}$  repetition rate, 120 fs pulse duration) (Coherent Vitesse / Coherent Legend Elite).

A home-built optical parametric amplifier (OPA) generates the mid-IR pulses ( $\lambda = 12 \text{ to } 2 \text{ µm}$ ), corresponding to around 830 to 5000 cm<sup>-1</sup>. The OPA design leads to noise suppression in the resulting mid-IR pulses.<sup>90</sup> The spectral bandwidth after the OPA is about 200 cm<sup>-1</sup>. For these experiments, we tune the OPA wavelength to 4.3 µm. Mid-IR pulse energy entering the 2D spectrometer is approximately 2.2 µJ per pulse.

**2.3.3.2 2D Spectrometer** The 2D-IR spectrometer uses a pump-probe geometry,<sup>91</sup> in which the first two mid-IR pulses travel collinearly to the sample. A Mach-Zehnder in-

terferometer controls the coherence time  $t_1$  between these pulses. A delay stage after the interferometer controls the population time  $t_2$  between the second and third pulses. The signal, which contains both rephasing and non-rephasing components, is emitted in the direction of the probe pulse  $(\vec{k}_3)$ , which also serves as a local oscillator to heterodyne the signal.

A 150 line/mm grating in a single monochromator disperses the signal in  $\omega_3$  onto a liquid N<sub>2</sub>-cooled 2 × 32 channel mercury cadmium telluride (MCT) detector. The signal in  $\omega_1$  is indirectly acquired by scanning along  $t_1$  using the Mach-Zehnder interferometer, and then applying a numerical Fourier transform to the resulting  $t_1$ -dependent signal at each data point in  $\omega_3$  (which also removes the transient absorption signal). The delay changes as the interferometer scans along  $t_1$  are acquired by comparing the interference pattern generated by a He:Ne beam which travels a parallel path through the interferometer.

A series of spectra in  $t_2$  are then acquired by varying the population time between the second and third laser pulses, and then obtaining a spectrum in  $\omega_1$  and  $\omega_3$  at each population time.

## 2.3.4 Global Fitting and Bootstrapping

Global fitting of spectra utilizes a third-order response function formalism in the semiimpulsive limit, including the Condon approximation and also the approximation of the cumulant expansion truncated after second order. A constrained nonlinear optimization algorithm (fmincon MATLAB) is used to minimize the magnitude of the sum of squared error between each data point in the set of spectra and a corresponding data point in a calculated spectrum. A bootstrapping algorithm<sup>92</sup> establishes the error of the global fitting result. The global fitting algorithm was run using synthetic data sets composed of a random selection of the original data points taken with replacement. The distribution of the fitting parameters after 100 iterations provided the error estimate.

### 2.3.5 Computational Details

All calculations were performed with a development version of the Q-Chem program package,<sup>93</sup> employing the B3LYP density functional,<sup>94,95</sup> the 6-31G(d,p) basis set,<sup>96,97</sup> and a (100,302) grid for the numerical quadrature. All SCF calculations were tightly converged to below  $10^{-9}$  a.u. for the DIIS error.<sup>98</sup> Gas-phase geometry optimizations of free CO<sub>2</sub> and the CO<sub>2</sub>-ionic liquid clusters were converged to changes of  $1 \times 10^{-8}$  a.u. in the energy,  $1 \times 10^{-6}$  a.u. in the nuclear displacement, and  $1 \times 10^{-6}$  a.u. in the gradient. Optimized structures were confirmed as minima via harmonic frequency calculations using analytic Hessians. Frequencies were scaled by a factor of 0.9627 (Table 6 Merrick et al.).<sup>99</sup>

For the calculations including the electrostatic and polarization effects of the ionic liquid with charge transfer disabled (" $+\Delta\omega_{\text{FRZ}} + \Delta\omega_{\text{POL}}$ " in Figure 5), absolutely localized molecular orbitals (ALMOs)<sup>100</sup> were employed, with the ionic liquid constituents as one combined fragment and the CO<sub>2</sub> as another fragment. Solution of the ALMO equations is requested by setting frgm\_method = gia. Charge transfer between fragments is disabled by setting frgm\_lpcorr = 0. For the calculation of complementary occupied-virtual pairs (COVPs), an energy decomposition analysis (ALMO-EDA) calculation is performed where charge transfer is allowed (frgm\_lpcorr = rs\_exact\_scf).

# 2.4 RESULTS AND DISCUSSION

#### 2.4.1 Linear IR Spectroscopy Results

The linear spectra of  $CO_2$  establish that the frequency of the  $\nu_3$  mode is sensitive to the anion, and set the stage for discussing the spectroscopic features present in the 2D-IR spectra.

The  $\nu_3$  vibration absorbs strongly around  $2340 \text{ cm}^{-1}$  in a spectral region with no strong solvent absorbances (Figure 3A). The lineshape of the  $\nu_3$  band (Figure 3B) appears mostly Lorentzian, with a low frequency shoulder.

Changing the anion causes both the full-width at half-maximum (FWHM) and center frequency of  $\nu_3$  to change (Figure 3C). We varied the anion, rather than the cation, because the

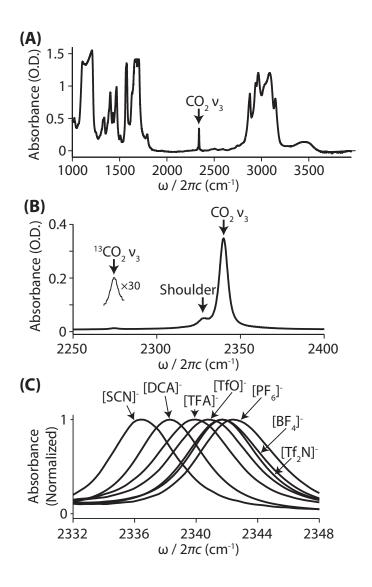


Figure 3: a) Absorption spectrum of  $CO_2$  in  $[Im_{4,1}][TFA]$  shows the intense antisymmetric stretch absorption at 2340 cm<sup>-1</sup>; b) the background subtracted spectrum is Lorentzian with a shoulder at 2328 cm<sup>-1</sup>, the  $\nu_3$  band of the <sup>13</sup>C isotopomer is located at 2280 cm<sup>-1</sup>; c) The average vibrational frequency of the  $\nu_3$  absorption of  $CO_2$  shifts for different anions and the same  $[Im_{4,1}^+]$  cation (background subtracted).

anion dominates  $CO_2$  solubility in ionic liquids.<sup>39,53,101</sup> Anions studied were hexafluorophosphate (PF<sub>6</sub><sup>-</sup>), tetrafluoroborate (BF<sub>4</sub><sup>-</sup>), bis-(trifluoromethylsulfonyl)imide (Tf<sub>2</sub>N<sup>-</sup>), triflate (TfO<sup>-</sup>), trifluoroacetate (TFA<sup>-</sup>), dicyanamide (DCA<sup>-</sup>), and thiocyanate (SCN<sup>-</sup>). The cation in all experiments was 1-butyl-3-methylimidazolium ([Im<sub>4,1</sub>]).

The  $\nu_3$  center frequency progressively redshifts from a maximum of 2342.5 cm<sup>-1</sup> ([PF<sub>6</sub>]<sup>-</sup>) to a minimum of 2336 cm<sup>-1</sup> ([SCN]<sup>-</sup>). The shoulder moves with the main absorption band and stays ~ 12 cm<sup>-1</sup> lower in frequency. Qualitatively, smaller, harder anions like [SCN]<sup>-</sup> and [DCA]<sup>-</sup> create a larger redshift than bulkier, softer anions like [Tf<sub>2</sub>N]<sup>-</sup> and [TfO]<sup>-</sup>, which is most likely a function of increased anionic charge density. The increased charge density could red-shift the CO<sub>2</sub> center frequency though an increased local electric field (Stark effect), through charge transfer, or through inductive effects. Quantum chemistry calculations (Section 2.4.2) help to disentangle the driving forces behind this qualitative trend.

The shoulder on the low frequency side of the main  $\nu_3$  transition could arise from several possible mechanisms, a "hot-band", a multiple-quantum transition, or different chemical environments. The temperature dependence of this feature is important in discriminating among these possibilities.

Temperature-dependent FTIR demonstrates that the shoulder on the low frequency side of the main  $\nu_3$  transition is a hot band of the  $\nu_3$  mode (Figure 4A). Increasing temperature causes a decrease in intensity of the main peak and an increase in intensity of the shoulder, while conserving oscillator strength. The relative magnitude of the shoulder (~ 10% of the main band at room temperature) is similar to the expected relative excited state bending mode ( $\nu_2$ ) population predicted by a Boltzmann distribution.

We fit the spectra in Figure 4A to two Voigt profiles (one for the main peak, and one for the first shoulder seen on the 2D-IR).

A van't Hoff analysis of the logarithm of the relative peak heights against 1/T gives an activation energy of  $810 \pm 30 \text{ cm}^{-1}$ . This value is near the energy of the  $\nu_2$  bending vibration (667 cm<sup>-1</sup>). Residual gas lines and nonlinearity of the detector contribute to the systematic error of this measurement. Nevertheless, the temperature dependence strongly suggests that the first shoulder is due to one quantum of the bending mode which is excited thermally and

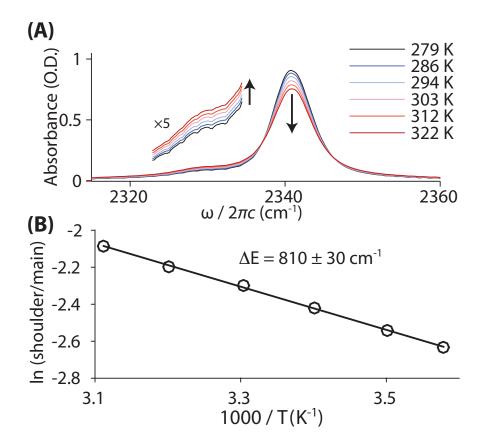


Figure 4: (A) Temperature dependence of the  $\nu_3$  spectrum in  $[\text{Im}_{4,1}][\text{TfO}]$  shows transition of intensity from the main peak to the shoulder with increasing temperature, indicating a temperature-dependent two-state transition. (B) Relative intensity of shoulder to the main band (based on fitting to Voigt profiles) follows a van't Hoff temperature dependence, indicating an energy barrier of around  $800 \text{ cm}^{-1}$ , which closely follows the prediction from the temperature dependence of bending mode population.

is anharmonically coupled to the  $\nu_3$  mode.

The temperature dependence and hot-band assignment are important components of our interpretation of the shape of the 2D-IR spectra (Section 2.4.5) and their time-dependence (Section 2.4.8).

# 2.4.2 Vibrational Frequency Calculations

Electronic structure calculations provide a rationale for the observed trend in vibrational frequencies.

Harmonic frequency calculations reproduce the general trend that  $\nu_3$  progressively redshifts with decreasing anion size (Table 4). We simplify the solvated CO<sub>2</sub> structure to a gasphase cluster consisting of one CO<sub>2</sub> with one cation-anion pair, with 1,3-dimethylimidazolium (Im<sub>1,1</sub>) as the cation. When scaled with the appropriate factor,<sup>99</sup> the simulations calculate vibrational frequencies within a few wavenumbers of the experimental value. The ordering of anions mostly agrees with experiment as well, the only outliers being [TFA]<sup>-</sup> and [SCN]<sup>-</sup>, which are located only 2.3 cm<sup>-1</sup> apart.

The level of agreement between experiment and theory is good, given that the condensed phase environment is neglected. That such a simple representation reproduces the general trends so well suggests that the interactions of  $CO_2$  are dominated by local effects in its immediate surroundings. Future work will address the condensed phase effects by sampling representative structures from molecular dynamics simulations and repeating the analysis in the context of larger solvation shells.

Encouraged by the fact that the electronic structure calculations reproduce the experimental trends in  $\nu_3$  frequencies, we decompose the calculated vibrational frequencies into different components using absolutely localized molecular orbitals (ALMO), in analogy to ALMO energy decomposition analysis (ALMO-EDA).<sup>100,102,103</sup>

Unlike standard quantum chemical calculations, where individual molecular orbitals may delocalize over more than a single fragment, each ALMO is composed of atomic orbitals from a single fragment. This constraint allows us to control charge transfer between fragments and to quantify the interaction between fragments in physically intuitive terms. The total vibrational frequencies  $\omega_{tot}$  and vibrational shifts  $\Delta \omega_{int}$  from gas phase ("free") CO<sub>2</sub> for each mode  $\nu$  may be written as:

$$\omega_{\rm tot} = \omega_{\rm free} + \Delta \omega_{\rm int}, \tag{2.3}$$

where

$$\Delta\omega_{\rm int} = \Delta\omega_{\rm GEOM} + \Delta\omega_{\rm FRZ} + \Delta\omega_{\rm POL} + \Delta\omega_{\rm CT}.$$
 (2.4)

 $\Delta\omega_{\text{GEOM}}$  (geometric distortion) corresponds to the change in frequency caused by distortion of fragments from their free geometries to their cluster geometries,  $\Delta\omega_{\text{FRZ}}$  (the frozen orbital interaction) results from the combined electrostatic interaction and Pauli repulsion between the filled, unrelaxed orbitals of each fragment,  $\Delta\omega_{\text{POL}}$  (polarization) is due to the relaxation of a fragment's orbitals in the field of the other fragments, and  $\Delta\omega_{\text{CT}}$  (charge transfer) is from occupied-virtual orbital donation between orbitals of different fragments.<sup>104</sup>

The cluster environment can affect the vibrational frequency of CO<sub>2</sub> in two different ways. The first depends on the anharmonic potential surface of a free CO<sub>2</sub> molecule. In a harmonic system, the spring constant, k, uniquely determines the vibrational frequency for all nuclear positions (i.e., the curvature of a quadratic potential is constant). CO<sub>2</sub>'s potential energy surface, however, is inherently anharmonic. Any change in geometry will thus cause a change in the  $\nu_3$  vibrational frequency. In other words, the cluster can change the  $\nu_3$  frequency just by shifting the location of minimum of the CO<sub>2</sub> potential energy surface due to interactions with the surrounding cluster ( $\Delta \omega_{\text{FRZ}} + \Delta \omega_{\text{POL}} + \Delta \omega_{\text{CT}}$ ).

We focus on the following grouping of terms: (1) distortion of isolated CO<sub>2</sub> to its cluster geometry ( $\Delta \omega_{\text{GEOM}}$ ), (2) the combined frozen orbital and polarization contributions through use of ALMOs ( $\Delta \omega_{\text{FRZ}} + \Delta \omega_{\text{POL}}$ ), and (3) charge transfer between the fragments in the cluster ( $\Delta \omega_{\text{CT}}$ ).

The final frequency,  $\omega_{\text{tot}}$ , correlates most strongly with  $\Delta\omega_{\text{GEOM}}$  ( $R^2 = 0.96$ ), indicating that geometrical distortion of CO<sub>2</sub> dominates the frequency shift. Depending on the particular geometry that CO<sub>2</sub> adopts in the cluster,  $\Delta\omega_{\text{GEOM}}$  can vary by  $\pm 6 \text{ cm}^{-1}$  (Figure 5).<sup>a</sup> Electrostatics and charge transfer both change the local curvature of the potential energy surface; however, their effects are mostly uniform across the ionic liquids studied. When we turn off charge transfer between fragments,  $\nu_3$  blue-shifts on average by  $\langle \Delta \omega_{\rm FRZ} + \Delta \omega_{\rm POL} \rangle = +2.8 \pm 0.6 \,{\rm cm}^{-1}$ . Modelling the cluster geometry as a field of point charges increases this blue shift to  $+4.4 \pm 0.6 \,{\rm cm}^{-1}$  (Supplementary Information), which may indicate that a point-charge representation of the cluster over-polarizes the QM region.<sup>105,106</sup> Allowing charge transfer red-shifts the frequencies by  $\langle \Delta \omega_{\rm CT} \rangle = -3.5 \pm 0.8 \,{\rm cm}^{-1}$ . Thus, both electrostatics and charge transfer change the local curvature of the  $\nu_3$  potential energy surface. The effects, however, are uniform and nearly cancel. The net result is that the inherent anharmonicity of the CO<sub>2</sub> potential energy surface ultimately dominates the  $\nu_3$ frequency.

The geometrical distortion of the CO<sub>2</sub> is driven by charge transfer. Using ALMOs and forbidding charge transfer during relaxation of the cluster removes the variance in  $\Delta\omega_{\text{GEOM}}$ (Figure 5B). Once again, both electrostatic and charge transfer interactions act uniformly on the frequency, leading to a negligible variance in  $\omega_{\text{tot}}$ . Without the geometrical distortion due to charge transfer, the vibrational frequencies for all clusters remain within  $\pm 2 \text{ cm}^{-1}$  and no longer follow the experimental trend.

The essential point is that charge transfer and electrostatics only affect the vibrational frequency indirectly, through their coupling into the equilibrium  $CO_2$  nuclear geometry. The direct effects of electrostatics and charge transfer on the potential energy surface (and thus the effective spring constant) of  $\nu_3$  are uniform across ionic liquids studied and counteract each other.

This DFT-based analysis may over-emphasize charge transfer to some extent. It is well known that DFT over-delocalizes electrons due to self-interaction error, which might exaggerate the amount of charge transfer. In the context of gas-phase anion clusters, both  $DFT^{107}$ and post-Hartree–Fock methods<sup>108</sup> have also identified charge transfer as a driver of geometrical distortion of CO<sub>2</sub>, so we expect that our qualitative picture will be robust with respect to the theoretical method. Future work will explore the quantitative differences between

<sup>&</sup>lt;sup>a</sup>Since  $\omega$  normally refers to an angular frequency, this quantity might more rigorously be be called  $\Delta \omega_{\text{GEOM}}/2\pi c$ ; however, for convenience of notation, we chose to use spectroscopic units uniformly in this section. That is, all frequencies are given in wavenumbers, rather than rad s<sup>-1</sup>.

the different methods. Furthermore, although our cluster results agree well with experiment, we expect that the extended solvation environment neglected here may introduce screening effects not captured at the cluster level.<sup>109</sup> A more sophisticated study of solvation effects could determine whether our finding, that charge transfer dominates the geometric effects which differentiate  $CO_2$  vibrational frequency shifts, is transferable to bulk ionic liquids.

These calculations demonstrate that the  $\nu_3$  frequency shift reflects a complex interplay between geometry, electrostatics, and charge transfer. The geometrical distortion is the most important factor in determining the final variation in vibrational frequency with anion identity; however, the equilibrium geometry of the CO<sub>2</sub> itself ultimately depends on inductive effects, such as charge transfer.

# 2.4.3 Frequency, Geometry, and Charge Transfer Discussion

To gain chemical insight into the charge transfer process, one can analyze the donor and acceptor orbitals of  $CO_2$  and the ionic liquid. This analysis sheds light on the nature of the geometrical distortion, which, in turn, leads to a simple model for the vibrational frequencies in terms of a few geometrical parameters.

We employ a complementary occupied-virtual orbital pair (COVP) analysis<sup>103</sup> to gain insight into the electronic structure effects underlying the charge transfer between CO<sub>2</sub> and the solvent. COVPs provide a way to visualize charge transfer effects, where "each COVP corresponds to an occupied orbital on one molecule donating charge to one specific (complementary) virtual orbital on the other molecule."<sup>110</sup> These orbital pairs are constructed from a singular value decomposition of the occupied-virtual mixing matrix **X** that describes charge transfer between the (polarized) fragments upon removing the ALMO fragment localization constraint. While **X** contains, in general, excitations between all possible occupied-virtual pairs, the COVP representation of **X** is diagonal and thus provides the most compact possible basis for describing charge transfer. The associated singular values allow one to assess the contribution of a particular COVP to charge transfer, and typically one finds that only one or a few orbital pairs dominate the effect (as shown below in this study). The COVP analysis thus allows to conveniently identify and visualize the electron donor/acceptor orbitals

Table 4: Experimental and calculated  $\nu_3$  vibrational frequencies (cm<sup>-1</sup>) for CO<sub>2</sub> in various imidazolium (experimental [Im<sub>4,1</sub>], calculations [Im<sub>1,1</sub>]) ionic liquids. Calculations are carried out using a gas phase anion-cation-CO<sub>2</sub> cluster at 0 K. The level of agreement between calculations and experimental results indicates that interactions of CO<sub>2</sub> are dominated by local effects in its immediate surroundings.

Anion	Expt. Freq.	Calc. Freq.	Calc. Freq. (scaled)
$[PF_6]^-$	2342.5	2437.7	2346.8
$[Tf_2N]^-$	2341.7	2435.8	2344.9
$[BF_4]^-$	2341.7	2434.7	2343.9
$[TfO]^{-}$	2340.9	2431.9	2341.2
$[TFA]^{-}$	2339.9	2429.3	2338.7
$[DCA]^-$	2338.4	2430.5	2339.8
$[SCN]^-$	2336.5	2430.0	2339.4

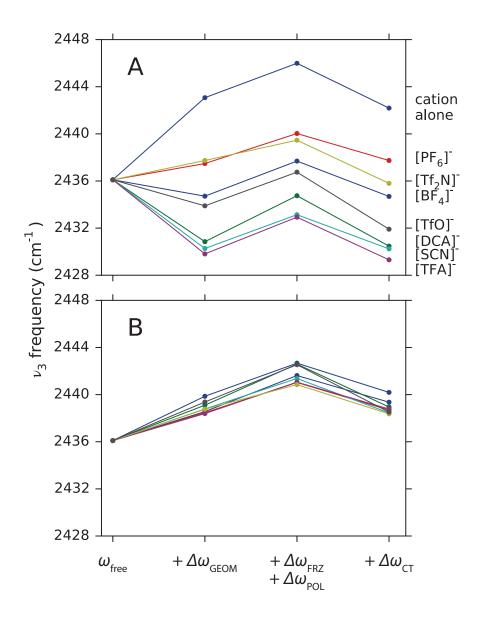


Figure 5: Decomposition of the geometric, electrostatic, and charge transfer contributions to CO<sub>2</sub>  $\nu_3$  vibrational frequency shifts. (A) The cluster geometry (including CO<sub>2</sub>) was optimized while allowing charge transfer. (B) The cluster geometry was optimized using ALMOs to forbid charge transfer between fragments. The final frequency ( $\omega_{tot} = \omega_{free} + \Delta\omega_{GEOM} + \Delta\omega_{FRZ} + \Delta\omega_{POL} + \Delta\omega_{CT}$ ) correlates most strongly with the change in frequency from geometric distortion ( $\Delta\omega_{GEOM}$ ).

Table 5: Charge transfer from the anion to  $CO_2$  and from  $CO_2$  to the cation both contribute to the geometrical distortion of the  $CO_2$ . The most important geometrical degrees of freedom are the bend angle,  $\theta$  and the sum of the two carbonyl bond lengths, L.

cluster	CT to $CO_2 (me^-)$	CT from $CO_2$ (me <sup>-</sup> )	$\theta$ (°)	L (Å)
$[Im_{1,1}]^+$	0.079	2.251	0.07	2.3374
$[PF_6]^-$	3.336	1.012	3.79	2.3379
$[Tf_2N]^-$	2.493	1.603	2.64	2.3380
$[\mathrm{BF}_4]^-$	4.558	1.264	4.51	2.3385
$[TfO]^-$	3.009	2.339	4.01	2.3389
$[TFA]^{-}$	5.131	1.618	5.22	2.3394
$[DCA]^-$	3.376	2.259	4.99	2.3394
$[SCN]^-$	3.317	1.323	4.35	2.3395

pair(s) that significantly contribute to charge transfer.

Charge transfer to the CO<sub>2</sub> originates from occupied orbitals on the anions. The charge is accepted by virtual orbitals on the CO<sub>2</sub>. The virtual orbitals are a linear combination of the LUMO and LUMO+1 orbitals, which have  $\sigma^*$  and  $\pi^*$  character, respectively. Charge transfer from the anion has a strong linear correlation to the bend angle ( $R^2 = 0.84$ ). Mechanistically, bending the CO<sub>2</sub> allows  $\sigma^*$  and  $\pi^*$  to mix, lowers the energy of the acceptor orbital, and also maximizes the spatial overlap with the donor orbital. The amount of charge transferred (3 to 5 me<sup>-</sup>) is small, but the resulting bend angle (3 to 5°) can be substantial (Table 5).

 $CO_2$  also donates charge back to the ionic liquid cluster, primarily to the cation. The amount of charge donated by the  $CO_2$  to the cation  $(-1 \text{ to } -2 \text{ me}^-)$  is typically less than the charge donated from the anion, but nevertheless has specific consequences for the resulting geometry. The donor orbital from the  $CO_2$  is a mixture of  $\sigma$ -bonding and  $\pi$ -nonbonding character. The charge donation from the  $CO_2$  is linearly correlated to the carbonyl bond length differences ( $R^2 = 0.85$ ). For the  $[\text{Im}_{1,1}][\text{TfO}]$  cluster, which has the highest charge transfer from CO<sub>2</sub> to the cation  $(2.32 \text{ me}^-)$ , the  $\sigma$  character of the donating orbital causes the carbonyl nearest the cation to lengthen from the gas-phase 1.169 Å to 1.175 Å while the distal carbonyl contracts to 1.163 Å.

The effects of charge transfer to and from the  $CO_2$  can be incorporated into a simple model of the vibrational frequencies. The model is constructed in a vibrational local-mode basis. The effective one exciton vibrational Hamiltonian is

$$H^{(1)} = \begin{pmatrix} h\omega_1 & \beta \\ \beta & h\omega_2 \end{pmatrix}$$
(2.5)

where  $\omega_i$  is the local mode frequency of carbonyl *i* and  $\beta$  is the coupling between the two local modes. The diagonalized hamiltonian gives symmetric and antisymmetric linear combinations of the local modes as the vibrational eigenstates with energies  $h\omega_s$  and  $h\omega_a$ . The splitting between symmetric and antisymmetric vibrations is twice the coupling constant,  $h(\omega_s - \omega_a) = 2\beta$ , and the average frequencies in local and normal modes are also equal  $h(\omega_a + \omega_s)/2 = h(\omega_1 + \omega_2)/2 = \alpha$ .

The bend in the CO<sub>2</sub> determines the change in the coupling constant between the local modes,  $\beta$  ( $R^2 = 0.94$ ). The motion of the central carbon atom is the primary motion that couples the two carbonyls. When they are collinear, the motion of one carbonyl directly influences the other. Bending the CO<sub>2</sub> means the carbonyls are no longer collinear, which means that the projection of one local vibration on the other decreases. This decrease, in turn, decreases the effective coupling constant.

The sum of the CO<sub>2</sub> bond lengths L, is correlated to the  $\alpha$  ( $R^2 = 0.998$ ). The dependence of  $\alpha$  on the geometry of the molecule is not as straightforward than that of  $\beta$ . In the strong coupling limit,  $\beta \gg |\hbar\omega_2 - \hbar\omega_1|$ , the symmetric and antisymmetric stretching frequencies only depend on the average frequencies,  $(\hbar\omega_1 + \hbar\omega_2)/2$ . As such, the geometrical asymmetry induced by charge transfer from the CO<sub>2</sub>, which weakens one bond and strengthens the other, is largely averaged out. Only a weak correlation between the charge donated from the CO<sub>2</sub> and the  $\alpha$  remains. The sum of the bond lengths, L, however, reports exactly this difference in total bonding strength. Though the changes in L are minute ( $\sim 0.001$  Å), the effect on the vibrational frequencies is not. Because of the strong linear correlation with these two geometrical variables, we propose that the simplest model of the scaled vibrational frequencies is  $\alpha(L)$  and  $\beta(\theta)$ , where

$$\alpha(L) = 9523.8 \,\mathrm{cm}^{-1} - \left(3415.3 \,\mathrm{cm}^{-1} \,\mathrm{\AA}^{-1}\right) L \tag{2.6}$$

and

$$\beta(\theta) = -515.7 \,\mathrm{cm}^{-1} + \left(1.12 \,\mathrm{cm}^{-1} \mathrm{deg}^{-1}\right) \,\theta, \tag{2.7}$$

where  $\alpha$  and  $\beta$  are in units of cm<sup>-1</sup>, L is in Å, and  $\theta$  is in degrees. The one exciton Hamiltonian

$$H^{(1)} = \begin{pmatrix} \alpha(L) & \beta(\theta) \\ \beta(\theta) & \alpha(L) \end{pmatrix}, \qquad (2.8)$$

reproduces the scaled harmonic frequencies with an RMS error of  $1.2 \,\mathrm{cm^{-1}}$  and the experimental frequencies with an RMS error of  $4 \,\mathrm{cm^{-1}}$ .<sup>b</sup>

Following a detailed investigation of the charge transfer, the participating orbitals, and the effects of charge transfer on the  $CO_2$  geometry, we have put forward a simple model that successfully reproduces the calculated vibrational frequencies and, to a reasonable extent, the experimental frequencies, with no free parameters.

# 2.4.4 2D-IR Spectroscopy Overview

While linear spectroscopy shows the sensitivity of  $CO_2$  to its local environment, it cannot address the ultrafast dynamics of the chromophore. 2D-IR, however, directly reports on the dynamic structural relaxation around  $CO_2$ . 2D-IR of  $CO_2$  in  $[Im_{4,1}][TFA]$  introduces many of the features that are general across all of the ionic liquids studied.

The 2D spectra of the  $\nu_3$  mode of CO<sub>2</sub> in [Im<sub>4,1</sub>][TFA] (Figure 6A and B) show the main  $\nu_3$  band, two diagonal shoulders, and cross-peaks between them. The observed peaks cannot be explained without also keeping track of the states of the CO<sub>2</sub> symmetric stretch and bending modes in the vibrational state. The total vibrational wavefunction is specified by  $|\nu_1\nu_2^l\nu_3\rangle$ , where  $\nu_1$  is the number of quanta in the symmetric stretch,  $\nu_2$  is the number

<sup>&</sup>lt;sup>b</sup>See section 2.7 for 2D-IR spectra of  $CO_2$  in each ionic liquid, as well as a comparison of center line slope and global fitting results for correlation times, and more detailed computational results. Additionally, there is information on fitting of the one exciton Hamiltonian model for unscaled frequencies, and vibrational frequency calculations of  $CO_2$  in a field of point-charges that approximates the cluster geometry.

of quanta in the bending mode, l is the vibrational angular momentum quantum number of the bending mode, and  $\nu_3$  is the number of quanta in the antisymmetric stretch.

The main band consists of a pair of intense peaks corresponding to the  $|00^{0}0\rangle \rightarrow |00^{0}1\rangle$ and  $|00^{0}1\rangle \rightarrow |00^{0}2\rangle$  (1a and 1b) transitions, separated by the anharmonicity of  $\nu_{3}$  (~  $24 \,\mathrm{cm}^{-1}$ ). Due to ground state bleach, 1a appears as a negative (blue) feature, while 1b, from excited state absorption, is a positive (red) feature. The  $\nu_{3}$  shoulder appears as a pair of small peaks (2a and b), shifted along the diagonal by  $-12 \,\mathrm{cm}^{-1}$  in  $\omega_{1}$  and  $\omega_{3}$ . A second apparent shoulder, not seen in FTIR, presents as a pair of smaller peaks (1e and 1f), shifted along the diagonal from the main band by  $-24 \,\mathrm{cm}^{-1}$  in  $\omega_{1}$  and  $\omega_{3}$ . At early population times, there is an apparent cross-peak between the main peak and second shoulder (1c). Cross-peaks grow in between the first shoulder and main peak (2-1a and b, 1-2b) over  $t_{2}$ . The expected cross-peak 1-2a cannot be seen due to cancellation with the overwhelming opposite signal from the 1b.

The combination of  $CO_2$ 's high molar absorptivity (~ 1000 M<sup>-1</sup> cm<sup>-1</sup>) and the  $\varepsilon^2$  dependence of the third-order signal causes the 2D signal from  $CO_2$  to dominate the spectrum in intensity. Contributions from solvent overtones in the background are smaller than the level of noise in the spectrum. Thus, the 2D signal reflects the vibrational modes of  $CO_2$ , rather than solvent background, and the solvent can only affect the 2D spectrum through intermolecular couplings with  $CO_2$  vibrational modes.

The unambiguous spectral diffusion of 1a and 1b over the 50 ps population time demonstrates that the line is not entirely in the motional narrowing (homogeneous) limit. That is,  $\nu_3$  will allow us to resolve the dynamics of structural relaxation around CO<sub>2</sub>.

The observations of a complex pattern of peaks and of spectral diffusion on a tens of picoseconds timescale for  $CO_2$  in  $[Im_{4,1}][TFA]$  are general features of the spectra in all of the tested ionic liquids and are described in detail in the next two sections.

# 2.4.5 2D-IR Shoulders and Cross-Peaks

Careful analysis of the relative kinetics of the diagonal peaks and cross-peaks (Figure 7) provides insight into how the coupling of  $CO_2$  vibrational modes and their stochastic dynamics

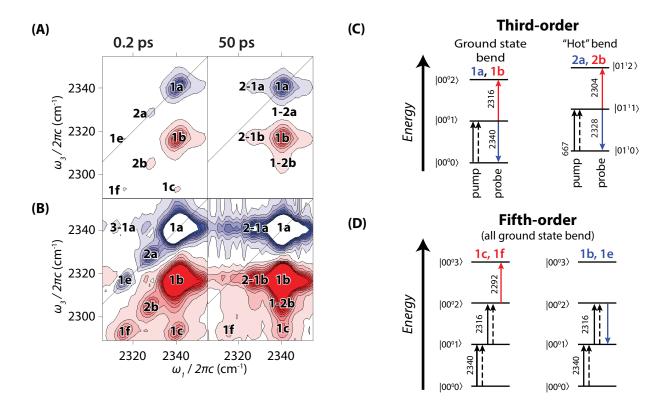


Figure 6: (A) 2D-IR spectrum of CO<sub>2</sub> in  $[Im_{4,1}][TFA]$  at  $t_2 = 0.2$  and 50 ps. The peak labels correspond to transitions in (C) and (D). (B) The same spectrum as (A) with contours limited to 10% of the maximum in the z-direction. Structure of the diagonal shoulders and cross-peaks can be seen much more readily. (C) and (D) Vibrational energy level diagrams for observed third-order (C) and fifth-order (D) bands of CO<sub>2</sub> in  $[Im_{4,1}][TFA]$ . Quantum numbers correspond to  $|\nu_1\nu_2^l\nu_3\rangle$ . Transition frequencies are labeled in wavenumbers (cm<sup>-1</sup>), and a label corresponding to the peaks in A and B. The color of the label indicates whether the expected peak is negative (blue) or positive (red).

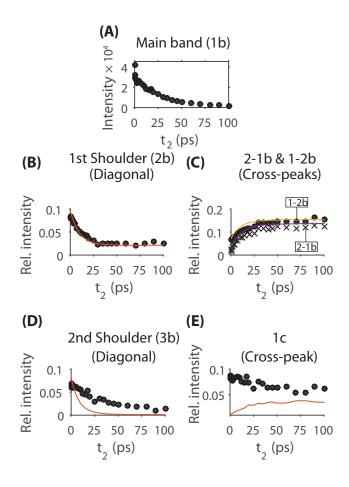


Figure 7: Kinetic analysis of  $[Im_{4,1}][TFA]$ . (A) Absolute intensity of the main peak (1b) with increasing  $t_2$ . Decreased intensity results from both orientational and population relaxation. (B)-(E) show intensities relative to A. Discrete data points represent experimental data, while lines show data from stochastic simulations (Section 2.4.8). (B) and (C), which result from the first diagonal shoulder (2b) and its cross-peaks with the main band (1-2b / 2-1b) show good agreement between experimental and simulated kinetics. (D) and (E), which result from the second diagonal shoulder (3b) and the apparent cross-peak (1c) show distinct kinetics, which cannot result from the same stochastic bending mode fluctuations, and point to a direct transition.

create the observed spectrum.

Orientational and vibrational relaxation of CO<sub>2</sub> cause a decrease in spectral intensity over  $t_2$ . The main peak (1b) shows an initial rapid decrease in intensity from orientation relaxation, followed by a slower decay over ~ 100 ps, from vibrational relaxation processes. Polarization-controlled studies can remove the contribution from orientational relaxation, and provide an explicit assessment of vibrational relaxation rate.<sup>69,111</sup>

The shoulders and cross-peaks are significantly weaker than the main peak, and also relax over  $t_2$ ; however, analysis of their kinetics relative to the main band reveals the underlying stochastic dynamics of CO<sub>2</sub> vibrational modes.

The first diagonal shoulder (2b) decays more quickly than the main band, decreasing to a minimum intensity at ~ 25 ps followed by a (relative) steady state (Figure 7). Crosspeaks between the first shoulder and the main band (2-1b and 1-2b) start at a minimum intensity, and then increase, before reaching a relative steady state by 25 ps. This behavior points to dynamic exchange between  $|00^01\rangle$  and  $|01^{1}1\rangle$ , which give rise to the diagonal peaks (Section 2.4.8).

The second diagonal shoulder (3b) decreases in intensity relative to the main band, but more slowly than the first shoulder. The apparent cross-peak 1c decreases in relative intensity over  $t_2$  with slower kinetics than the second shoulder. This behavior contrasts with that of the cross-peaks 1-2b and 2-1b, and indicates that 1c arises from a direct vibrational transition, rather than dynamic exchange.

#### 2.4.6 Peak Assignment

The Dunham expansion for anharmonically coupled vibrational modes provides a theoretical framework for building an analysis of coupled vibrational modes:

$$E = \sum_{i} h\omega_i \left( n_i + \frac{1}{2} \right) + \sum_{ij} x_{ij} \left( n_i + \frac{1}{2} \right) \left( n_j + \frac{1}{2} \right)$$
(2.9)

where  $\omega_i$  is the frequency of the mode,  $n_i$  is the number of quanta in the mode, and  $x_{ij}$  are anharmonic coupling constants. It directly follows that the energy of a particular mode is given by:

$$\nu_{n_k \to n_k+1} = \nu_k + 2n_k x_{kk} + \sum_{i \neq k} x_{ij} n_i, \qquad (2.10)$$

which implies that transition energy will decrease by  $x_{ij}$  for every quantum of energy in an anharmonically coupled mode.<sup>112</sup> Gas phase vibrational calculations predict  $x_{23} \approx -12 \,\mathrm{cm}^{-1}$  per quantum in  $\nu_2$ .<sup>113,114</sup>

The first shoulder can then be explained by anharmonic coupling of excited state bending modes with the asymmetric stretching mode. This coupling causes a frequency shift of  $-12 \,\mathrm{cm^{-1}}$ , and creates a shoulder on the linear and the 2D spectra (peaks 2a/2b on 2D-IR). Stochastic fluctuations in thermally populated bending modes cause dynamic 2D-IR cross-peaks.

This mechanism for dynamic cross-peaks is not unique to  $\text{CO}_2$  in ionic liquids; however, it is a nearly ideal system in which to observe and analyze it. The narrow total linewidth  $(\sim 6 \text{ cm}^{-1})$ , combined with a large anharmonic coupling constant  $(x_{23} = -12 \text{ cm}^{-1})$ , leads to clear segregation of the resulting frequencies into distinct peaks. The difference in energy between the ground and first excited state  $\nu_2$  modes is only around  $3k_{\text{B}}T$ , which is low enough to be thermally accessible, but high enough to be quantized. Finally, the rate of stochastic fluctuations in bending mode states is slow enough to preserve distinct diagonal bands at short population times, but fast enough to allow dynamic cross-peaks over the timescale of the experiment (~ 100 ps).

Alternative hypotheses can be ruled out. There are two possibilities that need to be addressed. First, the shoulder is often assigned to a multiquantum transition. Second, the shoulder and cross-peaks could be due to chemical exchange.

The first  $\nu_3$  shoulder in our spectra is also present in the FTIR of CO<sub>2</sub> dissolved in organic liquids and many polymers, and is often attributed to a multiquantum transition  $\nu_3 + \nu_2 - \nu_2$ ,<sup>87,115–118</sup> where the difference in energy is attributed to splitting of normally degenerate CO<sub>2</sub>  $\nu_2$  and  $\bar{\nu}_2$  bending modes. (This combination should perhaps be written as  $\nu_3 + \nu_2 - \bar{\nu}_2$ or  $\nu_3 + \bar{\nu}_2 - \nu_2$ , but is typically presented without distinguishing between the two bending modes.) This hypothesis fails on several accounts. First, such a multiquantum transition is harmonically forbidden, so the transition dipole moment should be significantly lower than for the one quantum  $\nu_3$  transition. The intensity of the shoulder, however, directly follows a Boltzmann distribution for the  $\nu_2$  bending modes, which implies that the magnitude of the transition dipole moment is roughly equal for both the fundamental and this multiquantum transition.

Second, with this mechanism, a shoulder on the high frequency side of the fundamental should accompany the observed shoulder on the low frequency side. That is, there is no clear reason why the transition  $\nu_3 + \nu_2 - \bar{\nu}_2$ , would be strongly allowed, but  $\nu_3 + \bar{\nu}_2 - \nu_2$  would not. Third, this hypothesis assumes that the splitting of the bending modes is an identical  $12 \text{ cm}^{-1}$ , but this is not the case.<sup>88</sup>

Finally, in the 2D spectrum, this combination band would give rise to cross-peaks between the first shoulder and the main band (since each a  $CO_2$  molecule could undergo either transition with excitation), which would be present at the earliest population times, and would only relatively decay (rather than relatively increase) with  $t_2$ . This behavior contradicts the observed spectral kinetics.

The temperature dependence of the shoulder (Figure 4) also excludes different chemical environments (such as multiple equilibrium geometries of a  $CO_2$ -anion interaction) undergoing chemical exchange. In this hypothesis, the most intense feature would be due to free  $CO_2$ and the shoulder to  $CO_2$  with a stronger chemical interaction. The growth of the cross-peaks would correspond to the exchange of these populations. However, the free  $CO_2$  band should be entropically favored and increase with increasing temperature while the shoulder should be enthalpically favored and decrease with increasing temperature. The opposite is observed, so this hypothesis can be ruled out. Additionally, the equal relative energy spacing of the diagonal shoulders from the main band for  $CO_2$  in every ionic liquid studied strongly suggests that the additional peaks arise from the  $CO_2$  itself, rather than from distinct chemical environments.

In contrast, the explanation of anharmonic coupling between  $\nu_2$  and  $\nu_3$  fits the temperature dependence, the transition dipole scaling, and accounts for the cross-peak kinetics. In our picture, each step requires only a one quantum transition for each peak, explains the presence of a shoulder on only one side of the fundamental, and correctly reproduces the cross-peak kinetics (over  $t_2$ ) between the first shoulder and main band due to thermal excitation and de-excitation of the bend.

The apparent cross-peak 1c, as well as the second apparent shoulder (1e and 1f) are fifthorder signals, as can be shown by pump power-dependence, frequencies, and sign show that it is a fifth-order signal, as are several other features. Assignments of the  $\nu_3$  2D-IR spectrum of carbon dioxide in 1-butyl-3-methylimidazolium trifluoroacetate [Im<sub>4,1</sub>][TFA], are given in Figure 6 and Table 6).

The magnitude of third-order signal is linear in pump light intensity, since there are two pump electric field interactions, while that of fifth-order signal (with four electric field interactions) is quadratic. We assessed the magnitude of each peak when the pump power was changed by a factor of two (Table 6). There is a clear distinction between the pump power dependence of the third order signals (1a, 1b, 2a, 2b, and their population exchange cross-peaks) and the fifth order signal (1c, 1e, 1f, and 31a). The reported intensity ratio is the ratio of volumes of a single peak when the pump power doubles. Thus, for the main 'red' peak (1b:  $\nu_3$  excited state absorption with ground state  $\nu_2$ ), peak volume goes up by a factor of  $2.2 \pm 0.1$  when pump power doubles. Peak 1c's volume, however, increases by a factor of  $3.3 \pm 0.2$ .

The fifth-order perturbative pathways have previously been described by Garrett-Roe and Hamm for 3D-IR (five IR pulse) spectroscopy.<sup>86</sup> The assignment of a "name" for each fifth-order pathway (Table 4 & Figure 8) follows the scheme used by Garrett-Roe and Hamm, where pathways are described by listing the vibrational quantum numbers of the three coherent states that contribute to them. Non-rephasing diagrams are shown for all pathways.

Since a 2D-IR experiment only has two coherence times (which give two frequency axes), we can only resolve two of the three coherences in the fifth-order pathway. When up-pumping occurs during the first two ("pump") pulses, either  $t_1$  or  $t_3$  will be unresolved. Thus, each pathway can give two spectral peaks on a 2D-IR spectrum, if the coherent frequencies in  $t_1$  and  $t_3$  differ. For fifth-order pathways in Table 4, the coherence noted in parenthesis does not contribute to the observed peak, since oscillation of the first coherence will not be observed when there are multiple electric field interactions during a single 100 fs pulse. That is, the pathway 10|21|32 contributes to peaks 1c and 1f. Peak 1f results from up-pumping during the first pump pulse, (10) |21|32, and thus only the  $|2\rangle \langle 1|$  and  $|3\rangle \langle 2|$  coherences are

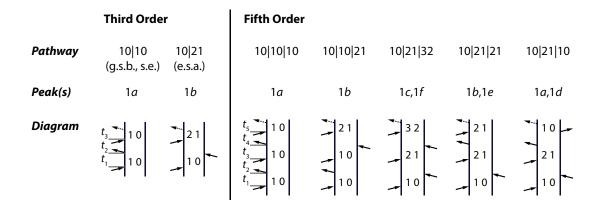


Figure 8: Double-sided Feynman diagrams, pathway labels, and peaks for third- and fifthorder peaks in the CO<sub>2</sub> 2D-IR spectrum (non-rephasing pathways shown). Labels for pathways correspond to those used by Garrett-Roe and Hamm in their description of purely absorptive 3D-IR spectra.<sup>86</sup> In a three optical pulse experiment (like 2D-IR), only two of the three coherences of a fifth-order signal can be resolved. Thus, depending on whether up-pumping occurs during the first or second pump pulse, either  $t_1$  or  $t_3$  will be unresolved in the fifth-order pathways. This effect can lead to multiple peaks on the 2D-IR spectrum from a single fifth-order pathway.

observed. Peak 1c results from up-pumping during the second pulse, 10|(21)|32, and thus only the  $|1\rangle\langle 0|$  and  $|3\rangle\langle 2|$  coherences are observed. The center frequency and sign of the peak amplitude for each observed fifth order peak matches that predicted by the corresponding fifth-order pathway (Table 4).

The peaks 1c, 1e, 1f, and 3-1a are fifth-order signals, not cascading third-order signals. Two of the peaks, 1c and 1f, cannot be generated by a cascade, because they involve walking up the vibrational ladder to a  $|3\rangle$  (2| coherence. Given the presence of these unambiguously direct fifth-order signals, we would expect to to find spectra contributions from other fifthorder pathways. Peaks 1e and 3-1a are located where we would predict additional fifth-order signal. The correspondence of the sign of the signal to those predicted by a direct fifth-order pathway is also important, because the relative signs of cascading third-order signals and fifth-order signals are opposite (due to the difference of  $i^2$  in the pre-factor in the infrared). Furthermore, the relative magnitudes follow the predictions based on the various pathways through population states and harmonic transition dipole moment scaling.<sup>86</sup> Finally, the relative peak intensities, including those of direct third-order signals, do not substantially vary with the concentration of the chromophore. Cascaded signals scale proportionally to  $c^2$ , and thus would not scale with the other peaks on the spectrum.

## 2.4.7 Modelling of the Main Band

The 2D peak of a specific vibrational mode encodes the frequency-fluctuation correlation function (Equation 2.1) in its lineshape. Lineshape analysis can extract the timescale of structure relaxation around that mode, by quantifying spectral diffusion, or change in diagonal character (or ellipticity), of a peak over  $t_2$ .

The intense  $\nu_3$  peak clearly exhibits spectral diffusion in each ionic liquid studied (Figure 9). Qualitatively, at early population times, the main  $\nu_3$  peaks have diagonal character. As a function of the population time,  $t_2$ , the peaks become rounder. The rate of  $\nu_3$  spectral diffusion varies in the ionic liquids tested, indicating a broad range of timescales for structural relaxation in the different solvents. The rate is slowest in  $[\text{Im}_{4,1}][\text{PF}_6]$  (Figure 9A) and fastest in  $[\text{Im}_{4,1}][\text{DCA}]$  (Figure 9C). The vibrational relaxation time is slow enough to allow

Table 6: Peak parameters related to the assignment of peaks in the 2D-IR spectrum of  $CO_2$  in  $[Im_{4,1}][TFA]$  to third-order or fifth-order signal. Pathways are labeled with the non-rephasing coherences they exhibit. Parenthetical coherences are not observed due to the timing of up-pumping (thus, 10|(21)|32 indicates a pathway with observed 2D-IR frequencies of  $\omega_1, \omega_3 = \omega_{01}, \omega_{23}$ ).

Peak Label	Center $(\omega_1, \omega_3)$	Peak Vol. Ratio <sup>1</sup>	Sign	Order	$Pathway^2$
1a	(2341.5, 2341.5)	$2.20\pm0.01$	_	3	10 10 (g.s.b./s.e.)
1b	(2341.5, 2317.5)	$2.20\pm0.02$	+	3	10 21 (e.s.a.)
2a	(2329.5, 2329.5)	$1.90\pm0.03$	_	3	'hot' g.s.b./s.e.
2b	(2329.5, 2305.5)	$2.5\pm0.1$	+	3	'hot' e.s.a.
21a	(2329.5, 2341.5)	$1.7\pm0.2$	_	3	pop. exch.
21b	(2329.5, 2317.5)	$2.40\pm0.04$	+	3	pop. exch.
1e	(2317.5, 2317.5)	$3.8 \pm 0.2$	_	5	(10)  21  21
$1\mathrm{f}$	(2317.5, 2293.5)	$3.5 \pm 0.1$	+	5	(10)  21  32
1c	(2341.5, 2293.5)	$3.3 \pm 0.2$	+	5	10 (21) 32
31a	(2317.5, 2341.5)	$3.4\pm0.4$	+	5	(10)  21  10

<sup>1</sup> Factor by which the volume of the indicated peak increased when pump power was doubled.

<sup>2</sup> g.s.b./s.e.: Ground state bleach / stimulated emission. e.s.a.: Excited state absorption. 'Hot' peaks refer to peaks resulting from thermal excitation of the  $\nu_2$  bending mode. Numerals for Feynman pathways of fifth-order peaks from Garrett-Roe and Hamm.<sup>86</sup> Subscripted 'a' and 'b' indicate whether up-pumping occurred on the first or second pulse.

us to measure over 100 ps of dynamics.

We used a global fitting algorithm to quantify the rate of spectral diffusion for  $\nu_3$  in each ionic liquid (Figure 9). The main peak in the 2D spectrum is sufficiently separated from the shoulders that it can be treated independently. Simulated spectra were calculated using a third-order response function formalism in the semi-impulsive limit. The frequencyfluctuation correlation function

$$c_2(t) = \frac{\delta(t)}{T_2} + \Delta^2 \exp\left(-\frac{t}{\tau_c}\right), \qquad (2.11)$$

corresponds to a physical system in which  $CO_2$  senses two distinct timescales of motion. Fast motions, in the homogeneous limit, are modeled by first term, which describes a loss of correlation that is too fast to be quantified. In the time domain lineshape function, this leading term describes exponential decay in the ensemble response from dephasing, (with time constant  $T_2$ ); the resulting lineshape in frequency space is a Lorentzian with FWHM of  $(\pi T_2)^{-1}$ .

The second term corresponds to processes in the spectral diffusion regime, which create a Kubo lineshape. In the slow modulation limit (where  $\tau_c \Delta \gg 1$ ), correlations do not change over the timescale of the molecular response. The resulting lineshape function describes a time-domain Gaussian with a variance of  $\Delta^{-2}$ ; the corresponding lineshape in frequency space is a Gaussian with FWHM of 2.355 $\Delta$ .

The analytical lineshape function:

$$g(t) = \frac{t}{T_2} + \Delta^2 \tau_c^2 \left[ \exp\left(-\frac{t}{\tau_c}\right) + \frac{t}{\tau_c} - 1 \right], \qquad (2.12)$$

can be used to calculate 2D spectra. Normalization of spectra before fitting removes any contribution from vibrational or orientational relaxation, which we do not model. A constrained nonlinear optimization algorithm globally fits the calculated spectra to experimental spectra by minimizing the sum of squares difference between the data and calculation. The algorithm optimizes  $T_2$ ,  $\tau_c$ , and  $\Delta$ , in addition to the central frequency, anharmonicity, the  $|00^01\rangle \rightarrow |00^02\rangle$  transition dipole moment, and the phase. The resulting spectral diffusion time,  $\tau_c$ , shows good agreement with that obtained by center line slope (CLS) analysis (section 2.7.1).

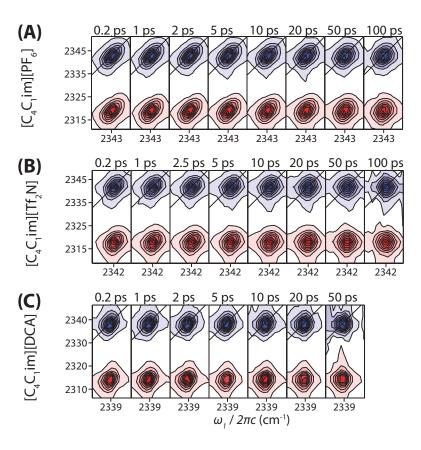


Figure 9: Experimental 2D-IR spectra of CO<sub>2</sub> in  $[Im_{4,1}]$  (A)  $[PF_6]$ , (B)  $[Tf_2N]$ , and (C) [DCA] show the range of timescales for spectral diffusion in  $\nu_3$ . Spectral diffusion results from local structural relaxation around CO<sub>2</sub>. Spectral modelling quantifies the timescale of this structural relaxation, and indicates that the timescale varies by up to an order of magnitude between ionic liquid solvents, and that CO<sub>2</sub> dynamics are likely gated by anion dynamics in these ionic liquids. Spectra for CO<sub>2</sub> in other ionic liquids tested can be found in figure 15.

Experimental and optimized calculated spectra agree in terms of overall lineshape and rate of spectral diffusion (Figure 10). The resulting lineshape parameters can then be used as input for spectral modelling that treats the shoulders and cross-peaks of the spectrum (Section 2.4.8).

The lineshape parameters (Table 7) for  $\nu_3$ , combined with insights from computational modeling of CO<sub>2</sub>-anion-cation clusters, help to refine a physical picture of the solvation environment of CO<sub>2</sub> in ionic liquids. The timescale of frequency fluctuation correlations  $(\tau_c)$  for CO<sub>2</sub> varies by up to an order of magnitude between the solvents, from  $13 \pm 3$  ps in  $[Im_{4,1}][DCA]$  to  $104 \pm 10$  ps in  $[Im_{4,1}][PF_6]$ . The inhomogeneous width ( $\Delta$ ) which is largest in PF<sub>6</sub><sup>-</sup> and smallest in DCA<sup>-</sup> reflects the diversity of local environments reported by CO<sub>2</sub> in an ionic liquid. The dephasing time  $(T_2)$ , which varies from 2.6 to 3.4 ps, is longer than typical dephasing times in molecular solvents.

A quantitative analysis based on lineshape theory has allowed us to determine the dynamical timescales, dephasing times, and inhomogeneous linewidths for  $\nu_3$  in the six ionic liquids studied.

#### 2.4.8 Modelling of Shoulders and Cross-Peaks

Having quantified the change in shape of the main 2D  $\nu_3$  band, we now turn to modelling of the dynamics encoded in the diagonal shoulders and cross-peaks.

Fluctuations in the CO<sub>2</sub>  $\nu_2$  population can be described by a thermal equilibrium between n bending modes:

$$|00^{0}0\rangle \stackrel{k_{f}}{\underset{k_{r}}{\overleftarrow{k_{r}}}} |01^{1}0\rangle \cdots \stackrel{k_{f}''}{\underset{k_{r}''}{\overleftarrow{k_{r}''}}} |0n^{l}0\rangle$$
(2.13)

The rate of transition between the ground and first excited state,  $k_f$ , combined with the Boltzmann distribution of states, determines the remaining rates.  $k_f$  is ultimately determined by the probability of stochastically gaining a quantum of energy in a CO<sub>2</sub> bending mode, most likely through collisions in the local environment. The first backwards rate,  $k_r$ , is directly analogous to the off-equilibrium vibrational energy relaxation rate.

A model that combines probabilistic fluctuations in bending mode population based on

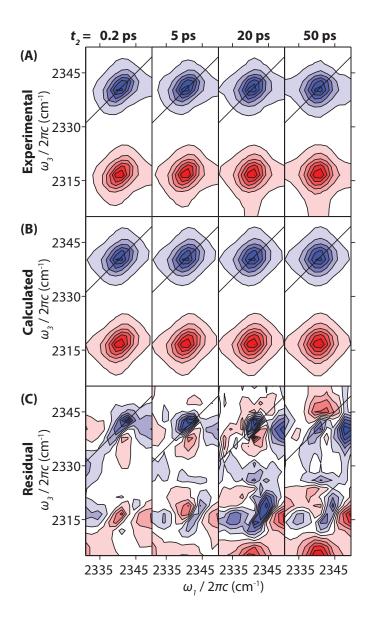


Figure 10: Example of global fitting of spectra. (A) Experimental 2D-IR spectra of CO<sub>2</sub> in  $[Im_{4,1}][TFA]$ . (B) Calculated 2D-IR for  $\nu_3$  based on a third-order response function, which is fitted to A by optimizing the correlation time  $\tau_c$ , frequency range  $\Delta$ , and dephasing time  $T_2$ , in addition to several other parameters (see text). (C) Residual between the experimental and calculated spectra.

Table 7: Best fit correlation function parameters, by ionic liquid.  $\tau_c$  indicates the timescale of structural relaxation around CO<sub>2</sub>, the inhomogeneous linewidth  $\Delta$  reflects the range of frequencies experienced by CO<sub>2</sub> in different local environments of each ionic liquid, and the homogeneous dephasing time  $T_2$  arises from fast motions, such as librations, of CO<sub>2</sub>.

Anion	$\Delta (\mathrm{cm}^{-1})$	$\tau_c \ (\mathrm{ps})$	$T_2$ (ps)
$[\mathrm{PF}_6]^-$	$2.0 \pm 0.1$	$104\pm10$	$3.3 \pm 0.1$
$[Tf_2N]^-$	$1.6\pm0.1$	$26\pm5$	$2.8\pm0.1$
$[TfO]^{-}$	$1.7\pm0.1$	$25\pm5$	$2.7\pm0.1$
$[TFA]^{-}$	$1.8\pm0.1$	$40\pm5$	$2.6\pm0.1$
$[DCA]^-$	$1.6\pm0.1$	$13 \pm 3$	$3.2\pm0.2$
$[SCN]^-$	$1.8\pm0.1$	$16 \pm 3$	$3.4 \pm 0.1$

Equation 2.13 with standard response function treatment is able to capture the essential physics required for such stochastic hot bands and their cross-peaks. The frequency of the  $\nu_3$  mode has two sources of variation: (1) the classical bath of intermolecular modes usually encountered in solvation dynamics and (2) the quantum bath of intramolecular vibrations to which the  $\nu_3$  band is coupled. The frequency of the  $\nu_3$  mode,  $\omega(t)$  fluctuates as

$$\omega(t) = \langle \omega \rangle + \delta \omega_{\text{inter}}(t) + \delta \omega_{\text{intra}}(t).$$
(2.14)

This stochastic frequency can be used as an input to standard nonlinear response function formalism. For example, the first order response function

$$R^{(1)}(t) \propto \exp\left(-i\left\langle\omega\right\rangle t\right) \times \left\langle\exp\left(-i\int_{0}^{t} \mathrm{d}t'\delta\omega_{\mathrm{inter}}(t') + \delta\omega_{\mathrm{intra}}(t')\right)\right\rangle, \qquad (2.15)$$

can be separated into the two parts, assuming the intra- and inter-molecular modes are uncorrelated,

$$R^{(1)}(t) \propto \exp\left(-i\left\langle\omega\right\rangle t\right) \times \left\langle \exp\left(-i\int_{0}^{t} \mathrm{d}t'\delta\omega_{\mathrm{inter}}(t')\right) \right\rangle \times \left\langle \exp\left(-i\int_{0}^{t} \mathrm{d}t''\delta\omega_{\mathrm{intra}}(t'')\right) \right\rangle.$$
(2.16)

The intermolecular component can be treated with the cumulant expansion truncated at second order

$$R^{(1)}(t) \propto \exp\left(-i\left\langle\omega\right\rangle t - g(t)\right) \times \left\langle\exp\left(-i\int_{0}^{t} \mathrm{d}t''\delta\omega_{\mathrm{intra}}(t'')\right)\right\rangle.$$
(2.17)

where g(t) is the lineshape function. The extension to third-order response functions is straightforward.

We performed a stochastic simulation in which an ensemble of trajectories was generated by allowing probabilistic instantaneous transitions between the ground and excited states of the  $\nu_2$ , with upward and downward rates consistent with the equilibrium populations. These transitions were allowed to happen at any point in the simulation, including during the coherence times.

The simulated lineshape is sensitive to the rate of thermal fluctuations in  $\nu_2$ . By tuning the rate constant  $k_f$  of stochastic fluctuation from the ground state into the first excited state and enforcing detailed balance to preserve equilibrium, we can control (1) whether or not diagonal shoulders will appear, and (2) the kinetics of cross-peak formation. In the limit of fast fluctuations, there are no clearly observed shoulders or cross-peaks, as all three peaks coalesce into a single band. In the limit of slow fluctuations, there are clearly defined shoulders, which persist throughout the experimental timescale, and cross-peaks do not grow into the spectrum. In an intermediate regime, we are able to reproduce both the lineshape and kinetics (Figures 11 and 7) seen in the relative intensities of the first shoulder and the cross-peaks between it and the main peak as functions of population time.

The microscopic rate constant  $(k_{up})$  for CO<sub>2</sub> bending mode fluctuations in [Im<sub>4,1</sub>][TfO], from the Monte Carlo simulations is estimated to be  $k_{up} = 2.5 \pm 0.1 \text{ ns}^{-1}$ . The corresponding down rate, which is analogous to the vibrational relaxation rate in off-equilibrium pumpprobe experiments, is estimated to be  $k_{down} = 30 \pm 12 \text{ ns}^{-1}$ . The kinetic Monte Carlo simulations include the non-equilibrium pumping that was explained by Fayer et al..<sup>119</sup> Their pump-probe measurements showed an increase in the ground state bleach band due to differences in transition dipole moment between the ground state  $|000\rangle$  and the 'hot' band  $|01^{1}0\rangle$  transition dipole moments. The 2D measurement resolves the excitation frequency, so those dynamics are visible as a separate cross-peaks, where the pump-probe measurement

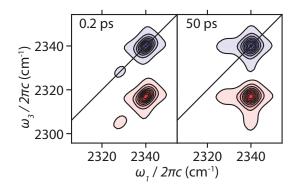


Figure 11: Calculated spectrum of CO<sub>2</sub> in  $[Im_{4,1}][TFA]$  at  $t_2 = 0.2$  and 50 ps. Spectra are based on a stochastic simulation that allows the bending mode of a particular oscillator to fluctuate over the course of the experiment (while preserving a Boltzmann distribution). The lineshape as a function of  $t_2$  closely approximates the lineshape of the main peak (1a and 2a), first diagonal shoulder (1b and 2b), and cross-peaks (1b,a; 2a,b and 2b,a) in the experimental spectra (Figure 6).

observes the sum of the two peaks (the projection of the spectrum onto the  $\omega_3$ -axis). The main ground state bleach decays with bending mode exchange and the cross-peak grows. If the dipoles of the two states are the same these two terms cancel in the pump-probe measurement; however, the differences in dipole lead to effective rises in the pump-probe ground state bleach signal.

## 2.5 MOLECULAR INTERPRETATION

The resulting molecular picture is that the slower dynamics of the ionic liquid solvent gate  $CO_2$ 's dynamics in solution. The slow timescale ( $\tau_c$ ) arises from structural relaxation of the solvent around  $CO_2$ , and corresponds to the breakup of local ion shells. Until this liberating event,  $CO_2$  is caged in a relatively well-ordered local environment. Librational and other fast motions only sample a narrow range of instantaneous frequencies, but the variation in

instantaneous frequency between different local environments gives rise to the inhomogeneous linewidth.

We assign the inhomogeneous width,  $\Delta$ , to the interactions of the CO<sub>2</sub> with its local ion cage. Because charge transfer drives the distortion of the CO<sub>2</sub> geometry, and the geometry determines the  $\nu_3$  frequency,  $\Delta$  reports the range of local structural motifs that the CO<sub>2</sub> can sample. This range varies from 2 cm<sup>-1</sup> in [PF<sub>6</sub>] to 1.6 cm<sup>-1</sup> in [DCA] (a 20% decrease).  $\Delta$ is also not strongly correlated to the average frequency shift or other structural parameters, and so we attribute it to the range of structures in the condensed phase.

The inhomogeneous linewidth of  $\text{CO}_2$  is the narrowest of the IR probes in recent 2D-IR experiments. Thiocyanate,  $\text{SCN}^-$ , has a total inhomogeneous linewidth  $\Delta_{\text{total}} \sim 8 \text{ cm}^{-1}$ ;<sup>77</sup> heavy water, HOD,  $\Delta_{\text{total}} \sim 5 \text{ cm}^{-1}$ ;<sup>71</sup> and  $\text{CO}_2 \ \Delta_{\text{total}} \sim 2 \text{ cm}^{-1}$ . This trend reflects the strength of the coupling of the vibrational chromophore to its environment. The SCN<sup>-</sup> anion is directly integrated into the ion network and hydrogen-bonded to the imidazolium cation through the 2-position. HOD interacts more weakly with the ionic liquid. It associates primarily with the anion, but it is sensitive to the electric field projected on the OH (or OD) bond axis. Because HOD is dipolar, it still experiences relatively large frequency fluctuations.  $\text{CO}_2$  is even more weakly still coupled to its environment.  $\text{CO}_2$ , which has a quadrupole moment and no dipole moment, is even less influenced by the local electric fields and is sensitive to the more chemical nature of the CO<sub>2</sub>-anion-cation interaction.

Similarly, we assign the spectral diffusion time,  $\tau_c$ , to a local ion cage's lifetime around CO<sub>2</sub>. The observed timescale reflects the time for the ion cage around CO<sub>2</sub> to break up and permit CO<sub>2</sub> to move to a novel local environment. This interpretation is consistent with previous computational work which indicate that the ionic liquid solvent reorients spontaneously to accommodate CO<sub>2</sub> in well-defined locations in the ionic liquid,<sup>56</sup> and with NMR studies showing a well-defined angular distribution of CO<sub>2</sub> around the cation.<sup>74</sup>

The bulk viscosity,  $\eta$ , serves as a proxy for this rate of diffusion which we can compare across the anions. Of course, small, neutral molecules like CO<sub>2</sub> experience less friction from the solvent than the viscosity implies.<sup>120,121</sup> Nevertheless, the linear correlation of bulk viscosity and  $\tau_c$  ( $R^2 = 0.82$ ) supports our assignment (Figure 12). This correlation further suggests that the motion of the smaller, more mobile CO<sub>2</sub> through the ionic liquid is gated by the motion of the solvent ions.

CO<sub>2</sub> has a Lewis acid-base interaction with the anion of the ionic liquid. Isolated water has possible hydrogen bonds with both the anion and the cation. SCN<sup>-</sup> has a strong electrostatic attraction to the cation. Thus, all three chromophores have different specific interactions with their ionic liquid solvent. Nevertheless, the correlation times seen in 2D-IR studies of [SCN]<sup>-</sup> in  $[Im_{4,1}][Tf_2N]^{77}$  and D<sub>2</sub>O/HOD in  $[Im_{4,1}][PF_6]^{71}$  follow the same viscosity trend, when you account for the expected ~ 25% decrease in the viscosity of  $[Im_{4,1}][PF_6]$ with  $\chi_{H_2O} \approx 0.04$ .<sup>122</sup> This fact suggests that each of these chromophores is reporting on the local diffusive motion of the surrounding solvent, despite the fact that SCN<sup>-</sup>, water, and CO<sub>2</sub> have different specific interactions with the ions in their solvation shells.

Furthermore, recent MD simulations suggest a direct relationship between ion cage lifetime and bulk transport properties such as self-diffusivity and conductivity.<sup>126</sup> While diffusivity of CO<sub>2</sub> and self-diffusivity of an ionic liquid are not identical parameters, the dynamics reported by CO<sub>2</sub> and  $[SCN]^{-77}$  in  $[Im_{4,1}][Tf_2N]$  are nearly identical, and both have been related to ion cage lifetime. Thus, it is reasonable to speculate that CO<sub>2</sub> mass transport in these ionic liquids may also depend on ion cage lifetime. In this case, the correlation times reported could provide an avenue to directly address the molecular mechanism of CO<sub>2</sub> mass transport in ionic liquids, and might even give insight into other transport properties such as self-diffusivity and conductivity.

The homogeneous dephasing time,  $T_2$ , depends on both the timescale of fast motions for CO<sub>2</sub>,  $\tau_H$ , and on the frequency range experienced during those motions,  $\Delta_H$  ( $T_2 = (\Delta_H^2 \tau_H)^{-1}$ ). Experimentally, it is impossible to disentangle these two contributions, but the dephasing time (~ 3 ps) is significantly longer than that seen for either HOD (~ 1 ps) or SCN<sup>-</sup> (~ 1.4 ps) in ionic liquids. Thus, either CO<sub>2</sub> samples a relatively narrow frequency range during its homogeneous motions, or the those motions are particularly fast. Based on the small inhomogeneous linewidth,  $\Delta$ , and the fact that CO<sub>2</sub> is a small molecule whose moment of inertia (and consequently, the timescale for fast motions such as librations) is unchanged between ionic liquids and molecular solvents, it seems reasonable that the long dephasing time results from a narrow frequency range in a well-defined local environment, rather than a decrease in solvent interactions that slow the molecule.

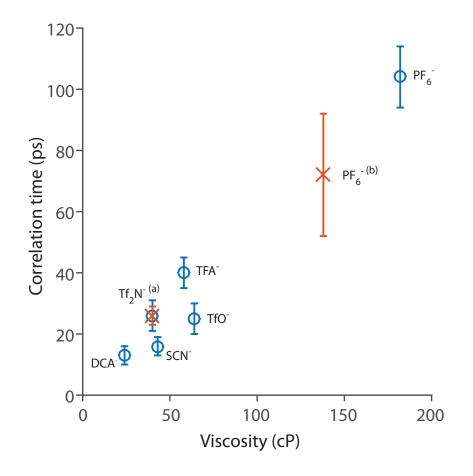


Figure 12: Correlation time,  $\tau_c$ , compared with viscosity for the 1-butyl-3-methylimidazolium ionic liquid solvent. Data points marked with an 'O' are from CO<sub>2</sub> in this work, while those marked 'X' are correlation times from other works (a) SCN<sup>-</sup> in [Im<sub>4,1</sub>][Tf<sub>2</sub>N],<sup>77</sup> (b) HOD in [Im<sub>4,1</sub>][PF<sub>6</sub>],<sup>71</sup> with ionic liquid viscosity scaled to account for water content.<sup>122</sup> Literature values for viscosity were used for all ionic liquids.<sup>123–125</sup>

Furthermore, the computational results show that, in gas phase clusters, CO<sub>2</sub> bends and adopts a distorted equilibrium geometry. In condensed phase dynamics, transitioning from a linear to a bent geometry could be one method of populating an excited state bending mode, and could have a direct impact on  $k_f$ , the rate of bending mode transitions. In principle, the spectral diffusion rate should influence the rate of transition between equilibrium geometries, and thus drive excitation and de-excitation of bending modes. Since we are able to model  $k_f$  based on equilibrium measurements, a systematic study of ionic liquids with different spectral diffusion rates could experimentally elucidate to how the motions of the solvent around a small molecule influence stochastic fluctuations in bending mode population.

These molecular mechanisms can be both tested and clarified by the comparison of these results to simulation. Frequency mapping techniques, combined with classical molecular dynamics simulations can be used to calculate the IR absorption spectrum and the spectral diffusion of modes of interest for small molecules such as water,<sup>127-129</sup> nitriles and thiocyanate,<sup>130,131</sup> and azides<sup>132,133</sup> in molecular solvents. More recently these methods have been expanded to explore isolated water in imidazolium ionic liquid solvents,<sup>134</sup> with good agreement with experiment.<sup>71</sup> Similar approaches for CO<sub>2</sub> could verify the molecular mechanism of CO<sub>2</sub> solvation in ionic liquids. It is likely, given the calculated dependence of  $\nu_3$ on CO<sub>2</sub> geometry, that any molecular dynamics simulation would need to account for the geometrical distortion of the CO<sub>2</sub> due to charge transfer, either directly via on-the-fly QM calculations, or with a classical proxy that indirectly accounts for these effects.

These initial studies utilized imidazolium-based ionic liquids because they are commercially available, are "archetypal," and are relatively well-characterized; thus, they provide a good initial platform on which to develop spectroscopic methods. Many ionic liquids of interest, however, involve either novel classes of anions and cations or chemical modification of existing ionic liquids. The changes in solvent structure and dynamics that result from such modifications are generally *not* well-understood. This type of spectroscopy can provide valuable molecular insights into how and why chemical modification of ionic liquids determines bulk properties of interest, especially  $CO_2$  uptake and local ion mobility (which is related to viscosity and conductivity). Chemisorbing ionic liquids are also of interest, especially for carbon capture applications, and many (1) have an initial physisorption step, and (2) have an equilibrium between physisorbed and chemisorbed (reacted)  $CO_2$ . These types of studies could help to elucidate the molecular mechanisms of the equilibrium between  $CO_2$  in its free and bound forms.

# 2.6 CONCLUSIONS

We have demonstrated that the  $CO_2 \nu_3$  mode can act as a probe of local structure and dynamics in imidazolium ionic liquids. This method has potential application to the analysis of structure and dynamics in ionic liquids being developed for  $CO_2$  capture.

The  $\nu_3$  frequency is sensitive to the timescale of local structural relaxation in ionic liquids. The timescale of this relaxation,  $\tau_c$  is determined by spectral modelling using a third-order response function formalism, with a Bloch-Kubo lineshape. For the imidazolium ionic liquids studied,  $\tau_c$  varies by as much as an order of magnitude between solvents, and correlates with the viscosity of the ionic liquids. The molecular mechanism posited for this timescale is the breakup of local ion cages around the CO<sub>2</sub>.

Computational studies aid understanding the origin of the  $\nu_3$  center frequency shifts in different imidazolium ionic liquids and suggest that geometrical distortion of the CO<sub>2</sub>, driven by charge transfer from the anion into virtual orbitals of CO<sub>2</sub> and from occupied orbitals of CO<sub>2</sub> into virtual orbitals of the cation. A simple one exciton Hamiltonian is able to reproduce the scaled harmonic frequencies with an RMS error of  $1.2 \text{ cm}^{-1}$  by accounting for dependence of average frequency,  $\alpha$ , on total bond length, L, and the coupling constant,  $\beta$ , on magnitude of the angular distortion of CO<sub>2</sub>,  $\theta$ .

Anharmonic coupling of  $\nu_2$  and  $\nu_3$  allows thermal fluctuations of  $\nu_2$  population to stochastically shift the CO<sub>2</sub>  $\nu_3$  by units of  $-12 \text{ cm}^{-1}$  (the coupling constant), and cause the appearance of a shoulder and dynamic cross-peaks on the 2D spectrum. Modelling of the stochastic bending mode population over the timescale of the experiment gives an estimate of the rate of excitation and de-excitation of bending mode population in the condensed phase at thermal equilibrium, estimated to be  $k_f = 2.5 \pm 1.0 \text{ ns}^{-1}$  and  $k_r = 30 \pm 12 \text{ ns}^{-1}$ . Additional spectral features (the "second shoulder" and apparent "cross-peak" 1c) arise from fifth-order signal. The molecular picture that arises from this work is one in which imidazolium ionic liquids solvate  $CO_2$  in well-defined local environments. The interactions of  $CO_2$  with its solvent are dominated by local interactions with its nearest neighbor anion and cation. The picosecond dynamics of  $CO_2$  are gated by the slower local diffusive motions of the anion and cation, whose translations and rotations are hindered due to electrostatic friction from surrounding ions, and potentially due to dispersive interactions between nanosegregated alkyl chains.

The methods and analysis developed in this work describe  $CO_2$  in imidazolium ionic liquids. We expect that they will be transferable, however, to broad classes of materials, such as polymers or metal-organic frameworks, as well as to other ionic liquids.

## 2.7 SUPPORTING INFORMATION

#### 2.7.1 Comparison of Global Fitting with Center Line Slope

For the center line slope method, we fit the signal size as a function of final frequency ( $\omega_3$ ) with two Gaussians with opposite signs for each initial frequency ( $\omega_1$ ) data point. The resolved positions of the Gaussians of the 0 to 1 transition peak are considered the center points. The center line slope is determined by fitting the center points linearly as a function of  $\omega_1$ . Estimated errors are propagated accordingly.

The resulting center line slope is fitted to a biexponential decay as a function of  $t_2$ 

$$c_2 = \sum_{i=1}^{2} a_i \exp\left(-t_2/\tau_i\right)$$
(2.18)

with the resulting parameters for CO<sub>2</sub>  $\nu_3$  in [Im<sub>4,1</sub>][TFA]:  $a = 0.09 \pm 0.04$ ,  $\tau_1 = 2.1 \pm 2.1$  ps,  $b = 0.35 \pm 0.04$ ,  $\tau_2 = 35 \pm 5$  ps.

## 2.7.2 2D IR Spectra

# 2.7.3 Computational Results

In tables 8 and 9, ' $\nu_1$ ' is the frequency of the symmetric stretching mode of CO<sub>2</sub>, and ' $\nu_3$ ' is the frequency of the antisymmetric stretching mode of CO<sub>2</sub>.  $\alpha$  is the average of the two

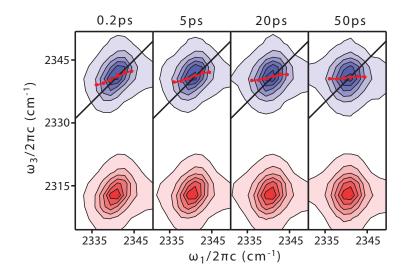


Figure 13: CLS overlaid on the 2D spectrum of  $CO_2$  in  $[Im_{4,1}][TFA]$ 

normal mode frequencies,  $\alpha = (\omega_{\rm s} + \omega_{\rm a})/2$ .  $\beta$  is the coupling constant, or the difference of the two local mode frequencies,  $\beta = (\omega_{\rm s} - \omega_{\rm a})/2$ .

'CT:  $CO_2$  to IL' is the amount of charge transferred from the  $CO_2$  into the ionic liquid components, 'CT: IL to  $CO_2$ ' is the amount of charge transferred from the ionic liquid components into the  $CO_2$ , and 'CT: net' is the net charge transferred into the  $CO_2$ .

'geom: angle' is the CO<sub>2</sub> O-C-O angle, and 'geom:  $\theta$ ' is the deviation of the angle from 180°. 'geom:  $l_1$ ' and 'geom:  $l_2$ ' are the bond lengths of the two C-O bonds, 'geom:  $l_2 - l_1$ ' is the difference between the two bonds lengths, and 'geom: L' is the sum of the two bond lengths. 'geom: O<sub>12</sub>' is the through-space oxygen-oxygen distance in CO<sub>2</sub>.

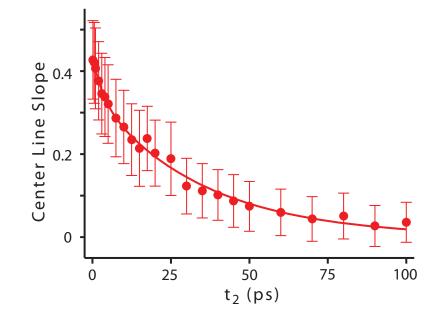


Figure 14: CLS fitting of CO<sub>2</sub>  $\nu_3$  2D spectrum from [Im<sub>4,1</sub>][TFA]

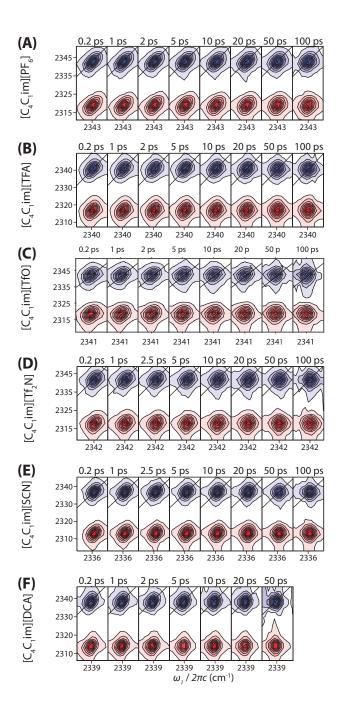


Figure 15: 2D-IR spectra of CO<sub>2</sub>  $\nu_3$  in [Im<sub>4,1</sub><sup>+</sup>] (A) [PF<sub>6</sub>]<sup>-</sup>, (B) [TFA]<sup>-</sup>, (C) [TfO]<sup>-</sup>, (D) [Tf<sub>2</sub>N]<sup>-</sup>, (E) [SCN]<sup>-</sup>, and (F) [DCA]<sup>-</sup>, showing the range of timescales for spectral diffusion in  $\nu_3$ .

Table 8:  $CO_2$ -IL geometries optimized allowing charge transfer. "Free  $CO_2$ " is  $CO_2$  not in the presence of the IL, "cation" is  $CO_2$  only in the presence of the IL cation (no anion), and all other columns specify the IL anion identity. The cation is  $[Im_{1,1}]^+$  or  $[C_1C_1im]^+$ .

	Free $CO_2$	Cation	$[BF_4]^-$	$[DCA]^-$	$[PF_6]^-$	$[SCN]^-$	$[TFA]^-$	$[Tf_2N]^-$	$[TfO]^-$
$\nu_1 ({\rm cm}^{-1})$	1371.93	1372.12	1372.96	1370.71	1373.95	1370.35	1371.68	1372.88	1371.14
$\nu_3 \; ({\rm cm}^{-1})$	2436.1	2443.07	2434.71	2430.85	2437.48	2430.27	2429.81	2437.74	2433.89
$\beta \ (\mathrm{cm}^{-1})$	-532.085	-535.475	-530.875	-530.07	-531.765	-529.96	-529.065	-532.43	-531.375
$\alpha \ (\mathrm{cm}^{-1})$	1904.015	1907.595	1903.835	1900.7	1905.715	1900.31	1900.745	1905.31	1902.515
CT: $CO_2$ to IL (me <sup>-</sup> )	0	2.251	1.264	2.259	1.012	1.323	1.618	1.603	2.339
CT: IL to $CO_2$ (me <sup>-</sup> )	0	0.079	4.558	3.376	3.336	3.317	5.131	2.493	3.009
CT: net $(me^-)$	0	-2.172	3.294	1.117	2.324	1.994	3.513	0.89	0.67
geom: angle (°)	179.96	179.93	175.49	175.01	176.21	175.65	174.78	177.36	175.99
geom: $\theta$ (°)	0.042	0.07	4.51	4.99	3.79	4.35	5.22	2.64	4.01
geom: $l_2 - l_1$ (Å)	$1.9  imes 10^{-7}$	0.015	0.0087	0.011	0.0071	0.0089	0.0076	0.0076	0.011
geom: $l_1$ (Å)	1.169	1.176	1.174	1.175	1.173	1.165	1.173	1.165	1.175
geom: $l_2$ (Å)	1.169	1.161	1.165	1.164	1.165	1.174	1.166	1.173	1.164
geom: $O_{12}$ (Å)	2.338	2.337	2.337	2.337	2.337	2.338	2.337	2.337	2.337
geom: $L$ (Å)	2.338	2.337	2.338	2.339	2.338	2.339	2.339	2.338	2.339

Table 9:  $CO_2$ -IL geometries optimized without allowing charge transfer. "Free  $CO_2$ " is  $CO_2$  not in the presence of the IL, "cation" is  $CO_2$  only in the presence of the IL cation (no anion), and all other columns specify the IL anion identity. The cation is  $[Im_{1,1}]^+$  or  $[C_1C_1im]^+$ .

	Free $\rm CO_2$	Cation	$[\mathrm{BF}_4]^-$	$[DCA]^-$	$[\mathrm{PF}_6]^-$	$[SCN]^-$	$[TFA]^{-}$	$[Tf_2N]^-$	$[TfO]^-$
$\nu_1 ({\rm cm}^{-1})$	1371.93	1371.47	1373.31	1373.44	1373.33	1373.14	1373.65	1373.06	1373.45
$\nu_3 \; ({\rm cm}^{-1})$	2436.1	2439.86	2438.56	2439.1	2438.47	2438.78	2438.39	2438.767	2439.37
$\beta \ (\mathrm{cm}^{-1})$	-532.085	-534.195	-532.625	-532.83	-532.57	-532.82	-532.37	-532.85	-532.96
$\alpha ~({\rm cm}^{-1})$	1904.015	1905.665	1905.935	1906.27	1905.9	1905.96	1906.027	1905.91	1906.41
CT: $CO_2$ to IL (me <sup>-</sup> )	0	1.743	1.038	1.836	1.154	1.302	1.023	1.246	1.941
CT: IL to $CO_2$ (me <sup>-</sup> )	0	0.039	3.053	2.266	2.221	1.64	2.916	1.274	2.048
CT: net (me <sup><math>-</math></sup> )	0	-1.704	2.015	0.43	1.067	0.338	1.893	0.028	0.107
geom: angle (°)	179.96	179.97	177.30	177.29	177.58	177.78	178.30	177.19	177.39
geom: $\theta$ (°)	0.04	0.03	2.70	2.70	2.42	2.22	1.70	2.81	2.61
geom: $l_2 - l_1$ (Å)	$1.9  imes 10^{-7}$	0.012	0.008	0.008	0.007	0.008	0.007	0.007	0.009
geom: $l_1$ (Å)	1.169	1.175	1.173	1.173	1.172	1.165	1.166	1.172	1.173
geom: $l_2$ (Å)	1.169	1.163	1.165	1.165	1.166	1.173	1.172	1.166	1.165
geom: $O_{12}$ (Å)	2.338	2.338	2.337	2.337	2.337	2.337	2.338	2.337	2.337
geom: $L$ (Å)	2.338	2.338	2.338	2.338	2.338	2.338	2.338	2.338	2.338

# 3.0 MODELING CARBON DIOXIDE VIBRATIONAL FREQUENCIES IN IONIC LIQUIDS: I. *AB INITIO* CALCULATIONS

The text in this chapter has been adapted from Berquist, E. J.; Daly, C. A.; Brinzer, T.; Bullard, K. K.; Campbell, Z. M.; Corcelli, S. A.; Garrett-Roe, S.; Lambrecht, D. S. Modeling Carbon Dioxide Vibrational Frequencies in Ionic Liquids: I. Ab Initio Calculations. *J. Phys. Chem. B* 2017, *121*, 208–220, DOI: 10.1021/acs.jpcb.6b09489, and is copyright the American Chemical Society. The author's contribution to the work included performing all quantum chemical calculations and analyses (excepting those for DVR), designing the charge transfer mechanism and counterpoise correction analyses, writing those respective parts of the manuscript, and editing/revising the remainder.

# 3.1 SUMMARY

This work elucidates the molecular binding mechanism of  $CO_2$  in  $[C_4C_1im][PF_6]$  ionic liquid (IL) and its interplay with the  $CO_2$  asymmetric stretch frequency  $\nu_3$ , and establishes computational protocols for the reliable construction of spectroscopic maps for simulating ultrafast 2D-IR data of  $CO_2$  solvated in ILs. While charge transfer drives the static frequency shift between *different* ionic liquids [27], we find here that electrostatic and Pauli repulsion effects dominate the dynamical frequency shift between different geometries sampled from the finitetemperature dynamics within a single ionic liquid. This finding is also surprising because dispersion interactions dominate the  $CO_2$ -IL interaction energies, but are comparably constant across different geometries. An important practical consequence of this finding is that density functional theory is expected to be sufficiently accurate for constructing potential energy surfaces for  $CO_2$  in  $[C_4C_1\text{im}][PF_6]$ , as needed for accurate anharmonic calculations to construct a reliable spectroscopic map. Similarly, we established appropriate computational and chemical models for treating the extended solvent environment. We found that a QM/MM treatment including at least 2 cation-ion pairs at the QM level and at least 32 pairs at the MM level is necessary to converge vibrational frequencies to within  $1 \text{ cm}^{-1}$ . Using these insights, this work identifies a computational protocol as well as a chemical model necessary to construct accurate spectroscopic maps from first principles.

### 3.2 INTRODUCTION

Capturing anthropogenic  $CO_2$  before its release into the atmosphere is a pressing need, and most methods will require the development of novel materials, such as metal-organic frameworks, polymers, or ionic liquids (ILs).<sup>31–33,36,41,136</sup> Understanding how to control the interactions between  $CO_2$  and its condensed-phase environment is a key to achieving efficient carbon capture and sequestration<sup>41,137–139</sup> and to developing routes toward potentially transforming  $CO_2$  into value-added chemicals including fuels.<sup>140–142</sup> To rationally develop such technologies, a molecular level understanding of the  $CO_2$ -sorbent interactions, structures and dynamics is necessary.

In a previous paper,<sup>27</sup> some of us established that  $CO_2$ 's asymmetric vibrational stretch mode ( $\nu_3$ ) can be used to effectively probe the structure and dynamics of  $CO_2$  dissolved in ILs. Using a combination of ultrafast two-dimensional infrared (2D-IR) spectroscopy and computational modeling, we determined structural candidates for the immediate  $CO_2$  solvent environments whose vibrational solvation shifts were consistent between experiment and theory. Experimentally, the timescales of structural reorganization relative to the  $CO_2$ molecule were correlated to the bulk viscosity. This experimental correlation between molecular property (solvation timescales) and bulk property (viscosity) suggests that  $CO_2$  motions are gated by the same motions that lead to bulk diffusion. Molecular models are needed, however, to establish physical explanations for the correlation.

 $CO_2$  solvation in ionic liquids gives rise to several interesting and challenging effects that

are worth exploring thoroughly, taking both computational methodology and the chemical picture into account. Our previous work suggested that charge transfer (CT) between  $CO_2$  and the IL dominates the differentiation of the calculated vibrational signatures between different ionic liquids. Understanding the strength and nature of intermolecular interactions between  $CO_2$  and its IL solvent fundamentally shapes our model of the  $CO_2$ -IL interaction. Investigating  $CO_2$ -IL interactions will thus deepen our understanding of the mechanism of  $CO_2$  solubility in ionic liquids, and even of (de)activation of  $CO_2$  for catalytic reductions. Interestingly, the asymmetric stretch frequency of  $CO_2$  encodes the strength of intermolecular interactions as they are manifested in the molecular geometry of  $CO_2$  interacting with the surrounding IL. In other words, one can determine the correct vibrational frequency shift for  $CO_2$  from the distortion of the  $CO_2$  geometry, but correctly determining the  $CO_2$  geometry requires an understanding of intermolecular interactions between  $CO_2$  and the IL solvent. These effects must be considered in the development of more reliable force fields that describe  $CO_2$ -IL solvation, and of empirical structure-spectra maps used for comparing MD results with results from ultrafast spectroscopies.

This publication is first in a series aiming to unravel the physics underlying  $CO_2$ -IL interactions as probed via vibrational spectroscopy and to develop a spectroscopic map to facilitate simulation of these spectra. The central point of the present publication is to establish a more refined picture of intermolecular interactions and their correlations with vibrational shifts by improving both the computational approach and the chemical model as described below. Some of the results from this publication inform the method choices for the subsequent paper in the series, where we develop and validate a spectroscopic map enabling one to reliably predict both the position and the width of the  $CO_2$  asymmetric vibrational peak within classical MD simulations.<sup>143</sup>

In this manuscript, we address the critical challenges needed to generalize our previous work. The key issues are: treating the condensed phase environment, testing the dependence on the electronic structure theory method and basis set, and addressing anharmonic effects.

First, we extend our previous results by analyzing both the convergence and stability of the calculations with respect to the computational approach. Our absolutely localized molecular orbital (ALMO) calculations<sup>100,102,103</sup> evaluated the impact of CT and other chemically intuitive components in the calculation of spectral signatures by using the modest B3LYP/6-31G(d,p) level of theory. Like most decomposition approaches, the ALMO results are expected to show some dependence on the underlying density functional approximation; in particular, it is known that the predicted amount of charge transfer depends on the amount of self-interaction error (SIE) present and the resulting (spurious) delocalization.<sup>104</sup> As a result, non-SIE corrected functionals are expected to overestimate the amount of CT, whereas the SIE-free Hartree–Fock approach can be used to estimate a lower bound for CT effects. Likewise, one can expect the CT contribution to depend on the basis set diffuseness, since the ALMO definition of CT is closely linked to the penetration of basis functions between different fragments. Thus, one goal of the present study is to quantify the method and basis set dependence of the calculated vibrational shifts and their effect on CT.

Although our previous density functional theory (DFT) calculations provided excellent agreement of predicted vibrational solvation shifts compared to experiment, these employed a minimalistic gas-phase cluster model consisting of only one CO<sub>2</sub> molecule together with a single cation/anion pair. Here we investigate the convergence of results with the size of the surrounding solvent shell both using a hybrid quantum mechanics molecular mechanics (QM/MM) approach with up to 195 atoms (6 molecular ion pairs) in the QM region and up to 8192 solvent atoms (256 molecular ion pairs) using classical point charges. In addition, we aim to assess the impact of solvent disorder by investigating different solvent geometries based on 85 statistically uncorrelated ( $R^2 = 0.0004$  for DVR-based vibrational frequency of snapshot N to vibrational frequency of snapshot N+1) snapshots sampled from a classical MD simulation (see paper II<sup>143</sup> for details). We use 1-butyl-3-methylimidazolium hexafluorophosphate ([C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>]) as a model IL in our calculations.

We will further analyze the impact of anharmonic effects, which we neglected in our previous (harmonic) calculations and which are necessary for a fair comparison to experiment. Here, anharmonic vibrational frequencies are obtained using the discrete variable representation (DVR) approach. The DVR method numerically solves the vibrational Schrödinger equation using a calculation of the  $CO_2$  stretch potential energy surface, resulting in vibrational frequencies that include anharmonicity to all orders. An additional advantage of DVR is that it can be applied rigorously to systems at non-equilibrium geometries, which allows us to include the disorder introduced by temperature for comparison with experiments carried out at temperatures above absolute zero.

The energy decomposition approaches we use add new and valuable physical insight into the origin of the vibrational frequency shifts. Many groups have used QM/MM approaches to estimate the condensed phase effects of a solvent on the transition energies of a chromophore, which provide a rich interpretation of the experiments.<sup>131,132,134,144,145</sup> Nevertheless, the interpretation for why the environment shifts the transition frequencies is difficult because many effects simultaneously determine the transition frequencies. The ALMO and symmetry-adapted perturbation theory (SAPT) energy decomposition approaches can separate the interactions of the vibrational chromophore with its environments into meaningful components allowing us to develop an empirical spectroscopic map and also understand its physical origins.

The paper is organized as follows. In section 3.3, we give a detailed account of the computational approaches used, including DFT calculations and DVR vibrational frequency calculations. In section 3.4, we analyze the dependence of the calculated  $CO_2$  vibrational frequencies on the computational approach and the chemical model. For the computational approach, we quantify both the impacts of the electronic structure method (density functional and basis set) as well as the inclusion of anharmonic effects via the DVR approach. We analyze the dependence on the chemical model by comparing our previous gas-phase cluster calculations with results obtained for extended solvent boxes both at the classical point charge and the hybrid quantum mechanics/molecular mechanics (QM/MM) level, where structures are sampled from extensive molecular dynamics (MD) simulations (details of the MD simulations will be discussed in a follow-up paper<sup>143</sup>). This way, we aim to include the most important effects of solvent electrostatics, exchange-repulsion, and solvent disorder. In section 3.5 we present concluding remarks and an outlook for future research.

# 3.3 COMPUTATIONAL METHODS

#### 3.3.1 Methods and Basis Sets

Similar to our previous work,<sup>27</sup> we choose gas-phase clusters consisting of one  $[C_4C_1im][PF_6]$ ion pair with CO<sub>2</sub> to quantify the effects of quantum chemical method and basis set on the quantum mechanically calculated harmonic frequencies. For methods, we employ the BLYP<sup>146,147</sup> generalized gradient approximation (GGA) and B3LYP<sup>94,95</sup> hybrid GGA density functionals, along with Hartree–Fock (HF) theory. This choice of methods allows us to test the dependence of the results on the percentage of exact (HF) exchange, as these methods have 0%, 20%, and 100% HF exchange, respectively. For basis sets, we choose 6-31G(d,p)<sup>96,97</sup> and 6-311++G(d,p)<sup>148–150</sup> to represent the commonly-used Pople-style basis sets (abbreviated as "small Pople" [SP] and "large Pople" [LP] in the following), along with Dunning's correlation-consistent basis sets from double- to quadruple- $\zeta$  quality (cc-pVXZ, where X = D,T,Q, abbreviated as VXZ).<sup>151,152</sup> Initial geometries were constructed using Avogadro<sup>153,154</sup> before optimization to local minima with or without charge transfer allowed between molecules (*vide infra*), followed by harmonic frequency calculations.

To examine solvent effects, we investigate the converge of QM-calculated harmonic frequencies as a function of the solvent box size, where we vary both the number of ionic liquid pairs treated explicitly ("QM pairs") and treated as point charges ("MM pairs"). A given combination is abbreviated as (n QM/m MM), where n and m are the number of QM and MM pairs, respectively. An ionic liquid pair, or briefly "ion pair", is defined as one cation  $([C_4C_1\text{im}]^+)$  plus one anion  $([PF_6]^-)$ . Ion pairs are included in the QM region based on the closest atom distance between individual cations and anions and the CO<sub>2</sub>. The geometries for these calculations are taken from MD snapshots (see paper II<sup>143</sup> for details). Point charges for MM pairs are also extracted from the MD simulations.

To identify the effects of intermolecular interactions such as charge transfer (CT), we employ two types of calculations: 1. standard self-consistent field (SCF) calculations, and 2. "molecular interaction" calculations (SCF-MI) within the absolutely localized orbital (ALMO) framework.<sup>100,102,103</sup> ALMOs are constructed to utilize only atomic orbitals localized

to individual fragments. This approach is in contrast to canonical molecular orbitals, which may be significantly delocalized over different fragments. One can therefore employ the ALMO results to define intermolecular charge transfer contributions and in the following we will denote ALMO/SCF-MI results with "CT off" and conventional SCF results with "CT on". We note that this definition of charge transfer is by no means unique, and it has been pointed out recently that constrained density functional theory (cDFT) predicts more reliable numbers for CT.<sup>155</sup> However, if applied consistently, we expect ALMO to provide qualitatively consistent trends across different systems, and in the present case it is beneficial to employ ALMO to allow comparison with our previous results. The decomposition results depend on the choice of interacting fragments. For ALMO-based calculations on the above gas-phase clusters, each individual molecule is chosen to be a separate fragment, whereas for all other calculations we chose two fragments —  $CO_2$  as the first and all IL molecules as the second. These choices were made on the one hand to allow comparability with our previous results, and on the other hand to allow comparison with SAPT.

For further decomposition of interaction energies between fragments, in particular to identify the dispersion contribution  $(E_{\text{disp}})$ , we use symmetry-adapted perturbation theory<sup>156</sup> (SAPT0<sup>157,158</sup>) as implemented in Psi4.<sup>159</sup> We employ the 6-31G(d,p) basis set to allow comparison to our DFT results within the same basis set, as well as jun-cc-pVTZ<sup>160</sup> for a more accurate comparison. Both primary basis sets use the jun-cc-pVTZ density fitting basis set during the SCF and SAPT iterations. CO<sub>2</sub> is treated as the first fragment, and two ionic liquid pairs are treated together as the second fragment, with no point charges included.

All other calculations employ a development version of the Q-Chem quantum chemistry program package.<sup>93</sup> Our DFT calculations use a numerical integration grid of (99,302) quality or higher throughout. Numerical tests suggest that vibrational frequencies are converged to within  $0.2 \text{ cm}^{-1}$  with this grid. All ALMO calculations use the Gianinetti projector<sup>161</sup> to ensure suppression of charge transfer. Harmonic frequencies with CT turned off calculate the Hessian by numerical differentiation of analytical gradients to avoid solving the coupled perturbed self-consistent field equations within the ALMO formalism. Calculations in the VQZ basis set also employ numerical Hessians due to restrictions in the high-angular momentum

derivative code. The reported harmonic frequencies are unscaled.

In order to reduce the number of the costliest calculations (harmonic frequencies and SAPT0 energies), we use a sampling and weighting scheme as follows. From the 1000 statistically independent MD snapshots, a distribution of B3LYP/6-31G(d,p) harmonic frequencies is calculated on the 0 QM/0 MM substructures. The snapshots are placed into five bins centered around the mean harmonic  $\nu_3$  frequencies, each with a width corresponding to the standard deviation of the population of harmonic  $\nu_3$  frequencies. The weight for each bin is calculated by dividing the count for each bin by the total number of values in the histogram so the weights sum to 1. Five snapshots are chosen randomly from each of the five bins, giving the 25 snapshots used for calculating the dependence of harmonic frequencies on MD box size. From this subset, the first three snapshots are chosen for the interaction energy breakdown using ALMO-EDA and SAPT. The reported harmonic frequencies are unweighted unless explicitly stated.

#### 3.3.2 Anharmonic Vibrational Frequency Calculations

We calculated anharmonic vibrational frequencies for the asymmetric stretch of  $CO_2$  in each of 1000 statistically independent snapshots sampled from the dilute  $CO_2/[C_4C_1im][PF_6]$  MD simulations using an approach developed previously for  $CD_2$  and  $PO_2$  groups.<sup>162,163</sup> In this procedure, one numerically solves for the eigenvalues of the two-dimensional Schrödinger equation with the Hamiltonian,

$$H = \frac{p_1^2}{2\mu} + \frac{p_2^2}{2\mu} + \frac{p_1 p_2 \cos\left(\theta\right)}{m_C} + V\left(r_1, r_2\right), \qquad (3.1)$$

using the DVR method.<sup>164,165</sup> In Eq. (3.1),  $r_1$  and  $r_2$  are the CO bond lengths,  $p_1$  and  $p_2$  are their conjugate momenta,  $\mu$  is the reduced mass of the CO bond,  $\theta$  is the OCO bond angle, and  $m_C$  is the mass of the carbon atom.

Our DVR analysis does not mix the stretching and bending vibrations. The anharmonic coupling between the stretches and bend is included classically; the quantum mechanically calculated stretch frequencies depend parametrically on the classical  $\theta$  coordinate. This is a reasonable approach to model infrared absorption experiments because the asymmetric stretch is far from the overtones of the bending mode. Our approach would not be appropriate to simulate Raman spectra of  $CO_2$ , where there is a Fermi resonance between the *symmetric* stretch and bend overtone. The separation of the stretch and bend could, in principle, be generalized by extending the dimensionality of the DVR potential energy surface to include the bend coordinates. Because the bend is doubly degenerate, the potential would become four-dimensional, however, and the computational cost to generate the potential would be infeasible.

The two-dimensional potential energy surface,  $V(r_1, r_2)$ , was obtained from density functional theory calculations performed as  $r_1$  and  $r_2$  were incremented from 0.955 to 1.45 Å in 0.045 Å steps, which corresponds to a 12 × 12 grid (Figure 16). All production calculations were performed at the B3LYP/LP level of theory. The DVR calculation provides the vibrational energy levels, { $\varepsilon_n$ }. The ground state has energy  $\varepsilon_0$ , the first excited state (the symmetric stretch) has energy  $\varepsilon_1$ , and the second excited state (the asymmetric stretch) has energy  $\varepsilon_2$ . The transition frequency for the asymmetric stretch frequency is then

$$\widetilde{\nu}_{AS} = \frac{\varepsilon_2 - \varepsilon_0}{hc}.$$
(3.2)

For CO<sub>2</sub> isolated in the gas phase, the calculated anharmonic asymmetric stretch vibrational frequency was calculated to be  $2383.7 \text{ cm}^{-1}$ , but is  $2349.1 \text{ cm}^{-1}$  experimentally, giving a ratio of 0.9855 for calculated to experimental frequencies, which was used as a scaling factor to correct the vibrational frequencies for these calculations where noted below.

The DVR calculation also returns vibrational wave functions calculated on the same grid of points as the potential energy surface. This information was used to find the expectation value of the bond lengths with respect to the ground-state vibrational wave function,

$$\langle r_{1,2} \rangle = \sum_{i=1}^{N} \sum_{j=1}^{N} r_{1,2}^{ij} |\psi_{ij}|^2$$
(3.3)

where  $r_1^{ij}$  or  $r_2^{ij}$  is the bond length at grid point (i, j), N = 12 is the number of grid points along each coordinate, and  $\psi_{ij}$  is the value of the ground-state wave function at grid point (i, j). Due to the anharmonicity of the potential energy surface, the expectation value of the bond lengths is longer than the bond length obtained from geometry optimizations. For instance, the optimized gas-phase bond length is 1.1608 Å, and the gas-phase DVR expectation value is 1.1647 Å. In the IL environment the vibrationally averaged CO<sub>2</sub> bond lengths vary from snapshot to snapshot. On average, the vibrationally averaged CO<sub>2</sub> bond length is 1.1648 Å in the IL. The average bond length from the classical MD simulation snapshots is 1.1610 Å, which is almost identical to the harmonic equilibrium bond length in the force field (1.1600 Å).

# 3.4 SENSITIVITY OF THE CALCULATED VIBRATIONAL SIGNATURES TO THE UNDERLYING COMPUTATIONAL AND CHEMICAL MODEL

In a previous publication<sup>27</sup> we identified the predominant role of CT for the asymmetric stretch frequency of  $CO_2$  in different ionic liquids. Here we aim to analyze whether our previous findings also hold when more sophisticated computational and chemical models are used. To this end, we investigate the impact of method, basis set, anharmonicity, electrostatics of the surrounding condensed phase, and solvent disorder on absolute and relative trends in the  $CO_2$  asymmetric stretch frequency.

#### 3.4.1 Method and Basis Set Dependence

The simplest system for examining the quantum chemical method and basis set dependence of geometries is  $CO_2$  in the gas phase. We first examine the sensitivity of the optimized geometry (Tab. 10). Increasing the fraction of HF exchange present in a given density functional leads to a decrease in bond lengths. This bond shortening can be attributed to the lack of dynamic correlation in HF, which leads to a tendency to underestimate bond lengths. An increase in basis set size also results in decreased bond lengths, with SP bond lengths slightly longer than those calculated using VDZ, and LP bond lengths similar to those calculated using VTZ.

Bond lengths for  $CO_2$  combined with a single ion pair are shown in the lower half of

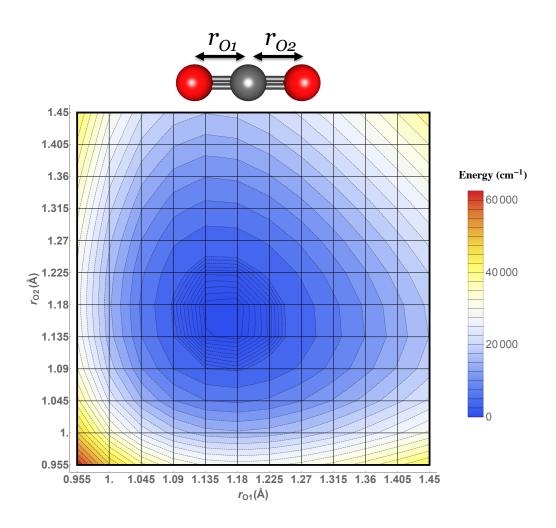


Figure 16: Contour plot of a discrete variable representation (DVR) of the Born– Oppenheimer potential energy surface of gas phase CO<sub>2</sub>. Density functional theory single point energy calculations with the B3LYP functional and the LP basis set were performed on carbon dioxide, incrementing each CO bond's length in steps of 0.045 Å, from 0.955 to 1.45 Å. Below a relative energy of  $2500 \text{ cm}^{-1}$ , contour lines are spaced by  $100 \text{ cm}^{-1}$ , above they are spaced by  $2500 \text{ cm}^{-1}$ . Mesh intersections indicate individual single point energy calculations. In order to calculate vibrational frequencies, this potential energy surface is incorporated into a discretized version of the Hamiltonian for the stretching modes of CO<sub>2</sub> (Eq. 3.1), which is then numerically diagonalized. The asymmetric stretch frequency is obtained from the differences between the energy levels (Eq. 3.2).

	$r_{\rm O1}$			$r_{\rm O1} + r_{\rm O2}$			
$\rm CO_2~(free)$	BLYP	B3LYP	HF	BLYP	B3LYP	HF	
SP	1.1828	1.1692	1.1433	2.3656	2.3383	2.2865	
LP	1.1744	1.1608	1.1357	2.3487	2.3216	2.2715	
VDZ	1.1815	1.1674	1.1406	2.3630	2.3348	2.2811	
VTZ	1.1736	1.1604	1.1362	2.3472	2.3208	2.2724	
VQZ	1.1720	1.1588	1.1345	2.3441	2.3176	2.2690	
		$r_{\rm O1}$		$r_{\mathrm{O1}} + r_{\mathrm{O2}}$			
$\mathrm{CO}_2/[\mathrm{BMIM}][\mathrm{PF}_6]$	BLYP	B3LYP	HF	BLYP	B3LYP	HF	
SP	1.1854	1.1723	1.1473	2.3649	2.3380	2.2871	
LP	1.1775	1.1646	1.1402	2.3485	2.3217	2.2725	
VDZ	1.1845	1.1710	1.1450	2.3622	2.3345	2.2819	
VTZ	1.1766	1.1639	1.1402	2.3464	2.3204	2.2727	
VQZ	1.1749	1.1622	1.1385	2.3434	2.3173	2.2694	

Table 10: Dependence of  $r_{O1}$  and  $r_{O1} + r_{O2}$  bond lengths on functional (BLYP, B3LYP, and HF) and basis set (SP, LP, VDZ, VTZ, and VQZ) for a gas-phase cluster consisting of CO<sub>2</sub> with a cation/anion pair. All values are in Å.

Table 11: Dependence of  $\nu_3$  harmonic frequencies on functional (BLYP, B3LYP, and HF) and basis set (SP, LP, VDZ, VTZ, and VQZ) for an optimized gas-phase cluster consisting of CO<sub>2</sub> and one cation/anion pair. All frequencies reported in cm<sup>-1</sup>. Reported frequencies are unscaled.

		Method	
Basis	BLYP	B3LYP	$_{ m HF}$
SP	2348.88	2437.23	2582.87
LP	2329.31	2419.80	2571.33
VDZ	2332.11	2422.71	2577.29
VTZ	2330.23	2417.28	2562.28
VQZ	2322.26	2409.34	2553.85

Table 10. Adding the ion pair leads to coordination of the  $CO_2$  to both the cation and anion, leading to asymmetry in the  $CO_2$  bond lengths. The effect is small, ranging from 0.006 Å at the BLYP/SP level to 0.008 Å at the HF/VDZ level. Trends in individual  $CO_2$  bond lengths with varying method and basis set agree for both ion pair-coordinated  $CO_2$  and free  $CO_2$ , even with the asymmetry. Based on these results, we estimate that the CO bond lengths presented here are converged to within 0.01 Å regarding basis set effects.

Next we investigate the impact of method and basis set on the harmonic vibrational frequencies for the  $\nu_3$  mode in a CO<sub>2</sub>–IL complex (Tab. 11). As expected, the absolute values of harmonic frequencies depend significantly on the method, overall the frequency can vary by more than 200 cm<sup>-1</sup> depending on the choice of HF exchange percentage. We find a linear and positive correlation ( $R^2 = 0.96$ ) with the fraction of HF exchange present in the method for all basis sets (SI). This correlation is consistent with the tendency of HF theory to overbind. Increasing the basis set size, on the other hand, results in decreasing the harmonic CO<sub>2</sub>  $\nu_3$  frequency. The convergence of frequencies with basis size is rather slow, and even from VTZ to VQZ we still observe a change of 8 to 9 cm<sup>-1</sup>. Overall, the sensitivity

of the absolute vibrational frequencies to the method and basis set choice is large compared to the accuracy required to quantitatively describe the frequency shifts for  $CO_2$  solvated in different ionic liquids, which is on the order of  $10 \text{ cm}^{-1}$ .

It is therefore imperative to investigate how sensitive the prediction of relative trends is with respect to the computational approach. To this end, we consider snapshots from MD simulations (see Ref. [143] for details), which allows us to test how well different computational approaches can predict *trends* in dependence of the local coordination environment around the CO<sub>2</sub> and the bulk solvent structure. Fig. 21 shows the CO<sub>2</sub>  $\nu_3$  harmonic frequencies calculated for 1000 statistically uncorrelated MD snapshots (0 QM/256 MM) using various SCF-type approaches, as compared to Møller–Plesset perturbation theory to second order (MP2) as the least expensive wave function-based method that incorporates dispersion effects.<sup>166</sup> The predicted harmonic frequencies in Fig. 21 are parallel to each other for most of the frequency range, independent of method and basis set choice. These results for relative trends in vibrational frequencies are highly encouraging. Aside from a multiplicative scaling factor, any of the common quantum chemical methods investigated here can qualitatively reproduce the distribution of harmonic frequencies.

Identifying the role of different intermolecular interactions in determining the vibrational signature of solvated  $CO_2$  is an important aspect of our previous and ongoing work.<sup>27,104,167</sup> In our previous publication,<sup>27</sup> we found that the CT contribution is decisive for discriminating between the vibrational signatures of  $CO_2$  solvated in different ionic liquids. We therefore end this section by investigating the method and basis set dependence of the CT contributions to relative shifts in the  $CO_2$  asymmetric stretch frequency due to solvation. As discussed in our previous publication,<sup>27</sup> CT can enter the frequency shift at two stages: (i) during the geometry optimization (i.e., influencing the geometries sampled by the solvated  $CO_2$ ), and (ii) during the frequency calculation (i.e., by modifying the curvature of the potential energy surface at the point where the frequency is calculated).

To quantify the sensitivity of both mechanisms to the computational approach, we investigated the CT contributions to the calculated frequencies for both mechanisms (Table 12). To assess the "geometry mechanism" (i), we calculated the frequency shift between geometries optimized using standard "CT on" and ALMO/SCF-MI "CT off" calculations, respectively. During the frequency calculation, we used the default "CT on" potential energy surface.

Our results show that the frequency shift varies by up to  $0.9 \text{ cm}^{-1}$  depending on the method and by up to  $1.53 \text{ cm}^{-1}$  depending on the basis set (Tab. 12, top). For the "curvature mechanism" (ii), we calculated the shift between standard "CT on" and "CT off" frequency calculations at the same, conventionally ("CT on") optimized geometries (Tab. 12, bottom). Here we find variations with the method of up to  $0.49 \text{ cm}^{-1}$  and up to  $1.86 \text{ cm}^{-1}$  with the basis set. Compared to the magnitude of the total CT frequency shifts, the basis set dependence is not negligible.

This finding is not surprising, because the definition of CT used within the ALMO approach is intimately linked to the locality of the basis set. However, we note that *all* methods and basis sets tested here provide qualitatively similar predictions, namely a negative frequency shift between -1.19 to -3.50 cm<sup>-1</sup> for the "geometry mechanism" and between -0.94 and -2.97 cm<sup>-1</sup> for the "curvature mechanism". For future work, it will be useful to consider alternative definitions of CT that are less dependent on basis set locality (see e.g. Ref. [155]).

The relative magnitudes of the "geometry" versus "curvature" mechanism results warrant some discussion, given that we found previously that the geometry contribution dominates the differentiation between different ionic liquids. According to the present results, the impact of CT via the geometry is typically bigger than the curvature effect by ~15 to 35% (with exception of the LP results, where the geometry effect is smaller than the curvature effect), but on the other hand this means the curvature effect still makes up a signification portion of the CT frequency shift. This finding may be surprising at first, but it is important to note that our previous discussion was not about the absolute magnitude of the shifts, but about the differentiation between different ionic liquids. In fact, the current results of -3.50 and  $-2.86 \text{ cm}^{-1}$  are in good agreement with those from our previous publication,  $-3.29 \text{ cm}^{-1}$  and  $-2.29 \text{ cm}^{-1}$ , respectively. While the absolute values of the CT shifts are largely caused by the impact of CT on the force constants during the frequency calculation, the modification of the geometry determines the *differentiation* between different ILs.

Table 12: Dependence of CT contributions to the  $\nu_3$  frequency based on functional (BLYP, B3LYP, and HF) and basis set (SP, LP, VDZ, VTZ, and VQZ). Calculations are on an optimized gas-phase cluster of CO<sub>2</sub> with a single cation/anion pair. All frequencies reported in cm<sup>-1</sup>. We distinguish two mechanisms by which CT can enter the frequency: (i) a "geometry mechanism" where CT determines the optimized geometry of the cluster, calculated as the difference between standard harmonic frequency results at the optimized standard ("CT on") and ALMO ("CT off") geometries. (ii) a "curvature mechanism" where CT enters by modifying the force constant at the optimized geometry, calculated as the difference between the "CT on" and "CT off" frequencies at the optimized standard ("CT on") geometry.

	(i) "Geometry Mechanism"			(ii) "Curvature Mechanism"			
	method				method		
Basis	BLYP	B3LYP	$\operatorname{HF}$	BLYP	B3LYP	HF	
SP	-3.16	-3.50	-3.33	-2.72	-2.86	-2.80	
LP	-2.80	-3.38	-3.72	-1.31	-1.25	-1.55	
VDZ	-2.46	-3.11	-2.93	-2.92	-2.97	-2.53	
VTZ	-1.90	-2.35	-1.19	-1.43	-1.33	-0.94	
VQZ	-2.44	N/A	N/A	-1.18	N/A	N/A	

#### 3.4.2 Anharmonicity

We employed a grid-based anharmonic (DVR) method to assess the effects of anharmonicity on the CO<sub>2</sub>  $\nu_3$  frequency. That is, we numerically solved for the vibrational wave function on the discretized potential energy surface spanned by two degrees of freedom for the  $CO_2$ molecule (along the OCO axis), constraining the degrees of freedom involved in CO<sub>2</sub> bending modes, as discussed earlier. Solving for the fully anharmonic vibrational wave function is important for connecting to experiment for the following reasons. First, an accurate comparison to experiment is only possible via anharmonic calculations because experiment probes vibrational transitions that take place on the full (anharmonic) potential energy surface. Second, harmonic frequencies change their physical interpretation as vibrational energy levels when calculated away from the minimum where they pick up contributions from non-zero forces and from higher-order derivatives. For these reasons, DVR calculations are essential for being able to calculate vibrational frequencies for different geometries (MD snapshots) that are consistent with experimental conditions sampling dynamical structures away from the equilibrium geometries. Consequently, the DVR approach is instrumental for the construction of a spectroscopic map as presented in Ref. [143], as it requires sampling various (non-equilibrium) geometries from MD simulations. In this section, we investigate the impact of anharmonicity on the frequency and geometry (i.e., position expectation values) of gas-phase  $CO_2$ .

Our goal is to separate the impact of anharmonicity from the numerical errors arising from using a discretized and reduced-dimensional (2D) potential energy surface. To this end, we performed standard harmonic calculations (using analytical derivatives on the fullydimensional surface), harmonic calculations on the discretized reduced-dimensional grid, and DVR calculations on the same grid (Tab. 13). All potential energy surfaces were calculated at the B3LYP/LP level. The standard (analytical) harmonic calculation yielded a vibrational frequency of  $2420 \,\mathrm{cm}^{-1}$  and an equilibrium bond length of  $1.161 \,\mathrm{\AA}$ .

For the harmonic grid-based calculations, we fit an accurate analytical potential to the grid-based potential and calculated analytical second (harmonic) derivatives. The analytical potential used an expansion in a local mode basis and included quadratic, cubic, and quartic

Table 13: Comparison of analytical harmonic (AH), grid-based harmonic (GH), and gridbased anharmonic (DVR) absolute  $\nu_3$  frequencies for CO<sub>2</sub> in the gas phase (B3LYP/LP potential energy surface). Reported frequencies are unscaled.

	$\nu_3 \ (\mathrm{cm}^{-1})$	$r_{\rm OC}$ (Å)
analytical harmonic (AH)	2420	1.161
grid-based harmonic (GH)	2414	1.159
grid-based anharmonic (DVR)	2384	1.165

diagonal terms, but not quartic terms in the off-diagonal (see the Supporting Information). This approach resulted in an excellent agreement with the discrete surface ( $R^2 = 0.9997$ ) and yielded a harmonic frequency of 2414 cm<sup>-1</sup> and an equilibrium CO bond length of 1.159 Å. This data suggests that the errors due to discretization and reduction of dimensionality are on the order of 6 cm<sup>-1</sup> and 0.002 Å, respectively. These results support that the grid-based approach largely captures the correct physics. In comparison, the effects of anharmonicity are much larger than the discretization errors: DVR predicts a vibrational frequency of 2384 cm<sup>-1</sup> (a 36 cm<sup>-1</sup> red shift) and an equilibrium bond length of 1.165 Å (a 0.004 Å bond lengthening). The red shift due to anharmonicity is significantly larger than the solvation shifts observed in our previous publication.<sup>27</sup>

As another point supporting the necessity for DVR calculations, we observe that the standard deviation of the calculated harmonic vibrational frequency distribution of  $\sim 100 \text{ cm}^{-1}$ (Tab. 17) is about an order of magnitude larger than the experimental distribution of  $\sim 6$  to  $10 \text{ cm}^{-1}$ . This large error arises from the fact that harmonic calculations pick up contaminations in the frequency that grow with the displacement from the minima. As we will show in the follow-up paper,<sup>143</sup> the anharmonic DVR calculations result in frequency distributions that are consistent with experiment. In summary, we conclude that the inclusion of anharmonic effects is imperative for constructing a spectroscopic map that allows meaningful comparison to experiment.

Table 14: Summary of DVR data averaged from 85 MD snapshots (SP = small Pople = 6-31G(d,p), LP = large Pople = 6-311++G(d,p)) at the QM/MM level, treating CO<sub>2</sub> plus 2 ion pairs quantum mechanically. Reported frequencies are unscaled.

PES	$\nu_3 \ (\mathrm{cm}^{-1})$	$r_{\rm O1}$ (Å)	$r_{\rm O2}$ (Å)	$r_{\rm O1} + r_{\rm O2}$ (Å)
B3LYP/SP, CT off	2399.4	1.1724	1.1729	2.3454
B3LYP/SP, CT on	2389.5	1.1728	1.1734	2.3462
B3LYP/LP, CT on	2373.9	1.1645	1.1650	2.3295

Since our previous results emphasized that CT is a decisive factor for the CO<sub>2</sub> solvation shift between different ionic liquids, it is important to investigate the significance of CT in the context of anharmonic calculations. The fact that DVR calculations are agnostic toward the level of theory used to generate the discretized potential energy surface allows us to perform DVR calculations on standard ("CT on") and ALMO/SCF-MI ("CT off") surfaces (Tab. 14). Excluding CT, we obtain a frequency of 2399.4 cm<sup>-1</sup> and bond lengths of 1.172 Å and 1.173 Å, respectively. The slight bond length asymmetry arises from the fact that we averaged over 85 snapshots taken from classical MD simulations, resulting in slightly non-symmetric solvation environments (see Ref. [143] for details). Upon turning CT on, the vibrational frequency decreases to  $2389.5 \text{ cm}^{-1}$ , whereas bond lengths remain almost unchanged at 1.173 and 1.173 Å, respectively. This  $9.9 \text{ cm}^{-1}$  red-shift is comparable in size to experimentally observed solvation shifts for CO<sub>2</sub> in ionic liquids,<sup>27,168</sup> which means that the anharmonic results are consistent with our earlier conclusion that CT is important to understand the vibrational signature of solvated CO<sub>2</sub>. We plan to quantify the *relative* effects of CT when studying ILs other than [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] in future work.

## 3.4.3 Molecular Mechanism of CO<sub>2</sub>–IL Interactions

We also studied the interplay between intermolecular interaction energies and the CO<sub>2</sub>  $\nu_3$  frequency in order to (1) further elucidate the molecular mechanism governing CO<sub>2</sub> solvation

in ILs and to (2) inform the selection of computational approaches used to construct the  $CO_2$ -IL spectroscopic map.<sup>143</sup>

3.4.3.1 Role of Charge Transfer and Basis Set Superposition Error We previously concluded<sup>27</sup> that the CT term, as defined in the ALMO approach, plays an important role in determining the relative frequency shifts of  $\nu_3$  in different ILs, primarily by modifying the CO<sub>2</sub>–IL cluster optimized geometry rather than by modifying the frequency calculated at a given geometry. To quantitatively analyze this conclusion, we compared predicted frequencies calculated with and without the ALMO approach (i.e., with CT on and off, respectively), at geometries again calculated with ALMO turned off and on, respectively (Fig. 17). At the SCF geometry (i.e., geometry optimized with CT on, Fig. 17a), the predicted frequencies for both ALMO (CT off) and standard DFT (CT on) are linearly correlated ( $R^2 = 0.978$ ). At the ALMO geometry (i.e., geometry optimized with CT off, Fig. 17b), however, neither standard DFT nor ALMO (CT off) frequency calculations correlate with the standard frequency/geometry result ( $R^2 = 0.116$  and 0.011 respectively).

These findings quantitatively support our earlier conclusions that (a) CT during the frequency calculation is not significant for differentiating  $\nu_3$  experiencing different IL solvation environments and that (b) CT is crucial for determining the correct geometry, because removing CT during the geometry optimization eliminates this frequency differentiation.

However, ALMO simultaneously corrects for CT as well as the basis set superposition error (BSSE). We therefore performed counterpoise (CP) corrected geometry optimizations and frequency calculations to isolate artificial BSSE from physical CT effects (Fig. 18).<sup>169,170</sup> The frequencies calculated at CP-corrected geometries and CP-uncorrected geometries correlate well ( $R^2 = 0.888$ , Fig. 18a). This finding suggests that the impact of BSSE on the geometry is small, at least as far as it is probed by the vibrational frequency. Consequently, we infer that indeed CT causes the geometry change leading to differentiation of  $\nu_3$  between different IL solvation environments (and not a BSSE artifact).

The CP-corrected frequency calculations show a somewhat smaller correlation with the CP-uncorrected frequencies ( $R^2 = 0.629$ , Fig. 18b). We believe that, for the given combination of systems and computational methodologies, the CP-uncorrected frequencies are

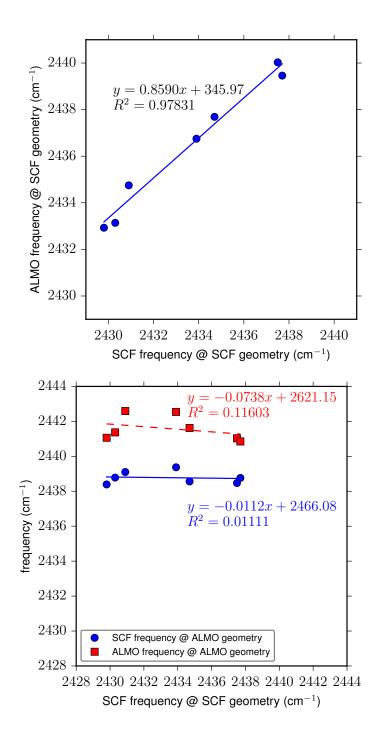


Figure 17: Comparison of B3LYP/SP frequencies calculated (a, top) within the ALMO (CT off) approach versus standard SCF (CT on) at the standard SCF-optimized geometry and (b, bottom) at the ALMO-optimized geometry versus standard SCF-optimized geometry with Hessian within the ALMO approach (red squares) versus Hessian using standard DFT (blue triangles). The frequencies are unscaled.

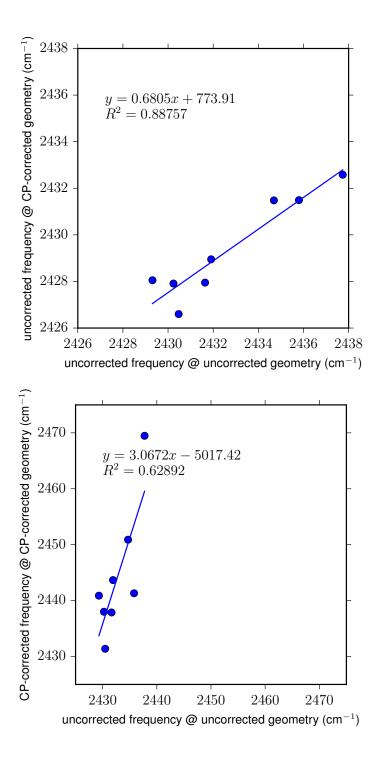


Figure 18: Comparison of B3LYP/SP frequencies (a, top) calculated at counterpoise (CP) corrected geometries versus uncorrected geometries and (b, bottom) calculated using CP-corrected Hessians at CP-corrected geometries versus uncorrected Hessians at uncorrected geometries. The frequencies are unscaled.

actually more accurate than the CP-corrected frequencies for a number of reasons: (1) The trends in CP-corrected frequencies contradict our ALMO-frequency results, where ALMO predicts a *negligible* impact of CT+BSSE in the frequency calculation step, whereas the CP-corrected frequency calculations suggest a significant impact of BSSE on the relative frequencies. DFT integration grid superposition errors can be excluded here because we did not find significant dependence on the grid size. (2) We suspect that the CP-correction overestimates the impact of BSSE for the given systems and computational approaches, because a detailed analysis of intermolecular interaction energies shows that, with the CP correction applied, one obtains unphysical, repulsive CT energies (see the SI): ALMO-CT should always be non-repulsive, because a system would not undergo CT if it were energetically unfavorable. However, after applying a CP correction to the ALMO delocalization energy, one obtains repulsive CT energies for several MD snapshots. We conclude that the CP correction overestimates the amount of BSSE for the given system. Similar conclusions have been drawn before, for example arguing<sup>171</sup> that the CP overcorrects for BSSE, or that BSSE is actually beneficial because it reduces basis set incompleteness.<sup>172</sup>

These fundamental problems in the CP-corrected frequencies manifest themselves in two findings (Table 21): (1) overestimation of the solvatochromic shifts for  $\nu_3$  in different ILs, and (2) incorrect ordering of the CP-corrected frequencies compared with experiment. The CPcorrected frequencies overestimate the range of solvatochromic shifts for  $\nu_3$  by a factor of  $5.9 \times$ when compared with experiment ( $38.1 \text{ cm}^{-1}$  versus  $6.5 \text{ cm}^{-1}$ ), whereas the CP-uncorrected shifts give agree much more closely ( $8.4 \text{ cm}^{-1}$ ). Furthermore, the ordering of the CP-corrected frequencies is incorrect. For example, the lowest experimental  $\nu_3$  frequency is found in [C<sub>4</sub>C<sub>1</sub>im][SCN] ( $2336 \text{ cm}^{-1}$ ), while the CP-corrected frequencies predict the lowest result in [C<sub>4</sub>C<sub>1</sub>im][DCA]. The CP-uncorrected frequencies correctly predict [SCN]<sup>-</sup> as causing the largest shift. Furthermore, anions that cause identical experimental frequencies ([Tf<sub>2</sub>N]<sup>-</sup> and [BF<sub>4</sub>]<sup>-</sup>:  $2341.7 \text{ cm}^{-1}$ ) differ by  $9.6 \text{ cm}^{-1}$  in the CP-corrected prediction (and only by  $1.1 \text{ cm}^{-1}$  in the uncorrected calculation).

# 3.4.4 Energetics of $CO_2$ -IL Interactions and Dependence on Decomposition Approach

To understand how the choice of decomposition method affects the predicted solute–solvent interactions, we decomposed the CO<sub>2</sub>–IL interaction energies of 15 representative MD snapshots using both ALMO and symmetry adapted perturbation theory (SAPT) calculations (Tab. 15). Because of computational cost, the SAPT calculations were performed within the uncorrelated monomer approximation (SAPT0). While individual terms in the ALMO and SAPT0 energies do not have direct correspondence, we combined contributions into roughly comparable terms describing (a) frozen-fragment interactions (electrostatics plus Pauli repulsion,  $E_{\rm frz}$ ), (b) polarization plus Pauli repulsion ( $E_{\rm pol}$ ), (c) charge transfer plus Pauli repulsion ( $E_{\rm CT}$ ), (d) dispersion plus Pauli repulsion ( $E_{\rm disp}$ ), and (e) the total interaction energy ( $E_{\rm int}$ ).

Our results show that  $E_{\rm frz}$  between CO<sub>2</sub> and the IL is, on average, repulsive. ALMO predicts repulsion between +0.08 and 0.50 kcal mol<sup>-1</sup>, whereas SAPT0 predicts somewhat larger repulsion between 0.59 and 1.47 kcal mol<sup>-1</sup>. The attractive interaction of -2.45 kcal mol<sup>-1</sup> at the SAPT0/SP MCBS level is likely due to an underestimation of inter-monomer overlap effects, which would result in a smaller contribution from Pauli repulsion that is recovered at the SAPT0/SP DCBS level. The finding of an overall repulsive  $E_{\rm frz}$  is not surprising given that CO<sub>2</sub> is a neutral, non-polar molecule, which should have little electrostatic attraction to the surrounding ions when polarization or charge delocalization are excluded.

The polarization energies contribute, as expected, to the binding. ALMO predicts polarization energies between -1.24 and -1.30 kcal mol<sup>-1</sup>, whereas SAPT0 predicts somewhat more attractive energies between -1.91 and -2.47 kcal mol<sup>-1</sup>.

The largest qualitative differences between predictions from ALMO and SAPT0 are found for charge transfer and dispersion energies. The ALMO-HF CT  $(-0.10 \text{ kcal mol}^{-1})$  is comparable in magnitude to the SAPT0 CT  $(-0.28 \text{ kcal mol}^{-1})$ , whereas the ALMO-DFT CT is significantly larger  $(-1.18 \text{ kcal mol}^{-1})$ . Overestimation of CT effects is expected for DFTbased ALMO because of self-interaction error, leading to spurious delocalization of electrons. The dispersion component does not exist in the SCF-based ALMO approach used here and

Table 15: Comparison of ALMO- versus SAPT0-decomposed interaction energies averaged over 15 representative molecular dynamics snapshots. ALMO calculations were performed within the SP basis to allow comparison to results from Ref. [27]. For SAPT0, we report both monomer-centered basis set (MCBS) and dimer-centered basis set (DCBS) results. Energies are reported in kcal mol<sup>-1</sup>.

			SAPT0/SP		SAPT0/	'jun-cc-pVTZ
component	ALMO-DFT/SP	ALMO-HF/SP	MCBS	DCBS	MCBS	DCBS
$E_{\rm el}^{(10)}$			-5.295	-7.018	-6.097	-6.154
$E_{\rm exch}^{(10)}$		_	2.845	7.611	7.106	7.622
$\mathrm{E_{frz}}$	0.500	0.082	-2.450	0.593	1.009	1.468
$E_{\rm ind}^{(20)}$		_	-1.218	-3.636	-2.593	-3.916
$E_{\rm ind-exch}^{(20)}$		_	0.009	2.147	0.921	2.041
$\delta_{ m HF}$			-0.839	-0.421	-0.801	-0.507
${ m E_{pol}}$	-1.241	-1.303	-2.049	-1.910	-2.473	-2.382
$\mathbf{E}_{\mathbf{CT}}$	-1.177	-0.102	-0.2	280	-	0.203
$E_{\rm disp}^{(20)}$			-4.193	-5.197	-7.323	-8.084
$E_{\rm disp-exch}^{(20)}$			0.058	0.483	0.393	0.671
$\mathrm{E}_{\mathrm{disp}}$			-4.135	-4.714	-6.930	-7.413
$\mathbf{E_{int}}$	-1.918	-1.323	-8.634	-6.031	-8.394	-8.326

can therefore not be compared.

We note, importantly, that SAPT0 predicts the dispersion contribution of -4.14 to  $-7.41 \text{ kcal mol}^{-1}$  to be the major binding contribution for the CO<sub>2</sub>-IL interactions. In contrast, ALMO-DFT predicts polarization and CT to be the dominant and equally important contributions to the overall binding, and ALMO-HF predicts polarization to be the largest contribution. Overall, the ALMO total binding energies range from -1.32 to  $-1.92 \text{ kcal mol}^{-1}$ , whereas SAPT0 binding energies within the MCBS and DCBS are -6.03 and  $-8.63 \text{ kcal mol}^{-1}$ , respectively. Given the magnitude of the dispersion interaction, it is not surprising that SAPT0 predicts a much more attractive total binding energy.

The three approaches used here disagree on the dominating mechanism of binding: ALMO-HF favors polarization, ALMO-DFT polarization in combination with CT, and SAPT0 predicts dispersion as the most important binding component. Interestingly, though, individual energy contributions that exist both in ALMO and SAPT0 agree qualitatively. We expect that the SAPT0/jun-cc-pVTZ DCBS numbers are the most accurate of the results reported here because these results are free of SIE (unlike ALMO-DFT) and explicitly account for inter-monomer correlation (dispersion) effects.

The conclusion changes when comparing relative trends in binding energies between different MD snapshots. Comparing the correlation coefficients for linear regression analysis between individual energy components and the total energies (Tab. 16a), all of the methods predict that the frozen monomer electrostatics plus Pauli repulsion component  $(E_{\rm frz})$  is the single most important contribution to trends in the total energy  $(R^2 = 0.870 - -0.944)$ . This finding implies that, although ALMO and SAPT0 disagree on the identity of the largest absolute energy component, they agree that the  $E_{\rm frz}$  is most important to capture differential effects between different MD snapshots. This finding is somewhat surprising, given that  $E_{\rm frz}$ is a rather small energy contribution on an absolute scale, whereas dispersion makes up the largest contribution to the total binding energy. However, this trend shows that dispersion varies less than the frozen-fragment interaction across different points on the potential energy surface.

These findings have at least two important implications. Since ALMO-DFT, ALMO-HF and SAPT0 qualitatively agreed on the  $E_{\rm frz}$  component, all of these methods should correctly

Table 16: Correlation coefficients  $(R^2)$  between different solute-solvent interaction energy components as calculated at the ALMO-DFT (B3LYP), ALMO-HF, and SAPT0 level within the SP basis. (a) Comparison between individual components and the total interaction energy  $(E_{tot})$  calculated for each methodology. (b) Correlation coefficients between contributions to the CO<sub>2</sub>–IL interaction energy calculated via ALMO as compared to the corresponding SAPT0 energy terms. Reported SAPT0 results are within the dimer-centered basis set (DCBS), except for the charge transfer component, which is calculated as the difference between monomer- and dimer-centered basis set results for the induction energy.

(a) Component	ALMO-DFT	ALMO-HF	SAPT0				
$E_{\rm frz}$	0.887	0.944	$0.870^{1}$				
$E_{ m pol}$	0.170	0.087	0.073				
$E_{\rm CT}$	0.225	0.270	0.093				
$E_{\rm disp}$			0.150				
$^{1}E_{\rm el}$ : 0.602, $E_{\rm exch}$ : 0.073							
(b) Component (ALM	ALMO-DF	Г ALMO-H					
$E_{\rm frz} - E_{\rm el} + E_{\rm exch}$	0.989	0.993					
$E_{\rm pol} - E_{\rm ind} + E_{\rm ind-exc}$	0.887	0.927					
$E_{\rm CT} - E_{\rm CT}$	0.720	0.383					
$E_{\rm tot} - E_{\rm tot}$		0.913	0.927				

describe relative trends in the energetics across different MD snapshots. That is, despite selfinteraction error and the lack of dispersion interactions, DFT is expected to correctly capture energetic trends across different snapshots along the potential energy surface. Furthermore, any spectroscopic map (*i.e.* a map between CO<sub>2</sub> geometry and vibrational frequency) must contain an electrostatic term to capture these leading-order relative effects. ALMO and SAPT approaches predict the CT and dispersion terms to be the second most important for relative frequency trends, respectively ( $R^2 = 0.225 - -0.270$  for ALMO-CT and  $R^2 =$ 0.150 for SAPT-dispersion), which are expected to show a different geometry dependence. Consequently, adding a Lennard-Jones type potential to the spectroscopic map may allow implicit collection of these non-electrostatic terms.

The good correlation between ALMO and SAPT0 electrostatic plus Pauli repulsion terms is also demonstrated by a term-by-term comparison (Tab. 16b): ALMO-DFT has a correlation coefficient of 0.989 with SAPT0, and ALMO-HF has one of 0.993. Polarization energies also correlate well ( $R^2 = 0.887$  and 0.927, respectively). The lowest agreement is found for the charge transfer term ( $R^2 = 0.720$  and 0.383, respectively). This low degree of correlation is somewhat surprising, since the formal definitions of charge transfer are very similar between ALMO and SAPT0 — both involve the difference between energetics calculated for a monomer-centered and a dimer-centered basis set. Furthermore, the absolute magnitude of the ALMO-HF CT term agrees better with SAPT0, but it shows less correlation across different MD snapshots. The ALMO-DFT CT term, on the other hand, is much larger than in SAPT0, but seems to correlate better with trends across MD snapshots, although one would expect the ALMO-DFT results to be less reliable due to self-interaction error. This large difference between ALMO-DFT and SAPT0 CT energies remains even with the use of range-separated density functionals, but we note that adding a dispersion correction leads to a good agreement between DFT-D and SAPT0 (Table 19).

Interestingly, the ALMO total binding energies correlate well with SAPT0 binding energies ( $R^2 = 0.913$  and 0.927, respectively), even though ALMO binding energies are generally much smaller than SAPT0 energies. This good correlation can be understood by considering that the major discrepancy between ALMO and SAPT0 binding energies comes from the dispersion term, which, despite its large magnitude, is relatively constant across MD snapshots and therefore does not correlate strongly with the total binding energy.

In summary, despite shortcomings in capturing the nuanced physics of intermolecular  $CO_2$ -IL binding, DFT- and even HF-based approaches are expected to produce qualitatively correct trends, if the goal is to compare binding energies across different MD snapshots. Consequently, we expect that DFT will capture qualitative trends in the potential energy landscape, and can be safely used to generate DVR potential energy surfaces for DVR used to construct and validate a spectroscopic map for  $CO_2$  in ionic liquids.

#### 3.4.5 Electrostatic Interactions with the Extended Solvent Phase

Our previous publication<sup>27</sup> used a rather crude gas-phase cluster model for the solvated  $CO_2$ . Here we investigate the effect of adding a more extended solvation environment by varying the MM region (Fig. 19). Calculations were performed at the B3LYP/SP level of theory, with the ionic liquid molecules represented as point charges. Each data point is an average from 25 snapshots, which were selected using the sampling scheme previously described.

As expected, the largest frequency shifts occur when the first few solvent ion pairs are added to the solvated CO<sub>2</sub>. The frequency is converged to within  $1 \text{ cm}^{-1}$  at a solvent layer size of ~32 ion pairs, which corresponds to a solvent droplet of radius ~14 Å. This relatively fast convergence (from the perspective that the solvent molecules are charged) is attributed to electrostatic screening due to the solvent.

We observe qualitatively the same trends and convergence patterns independent of whether a pure point charge embedding is used or whether one or two ion pairs are included at the QM level. This finding indicates that solvation boxes including  $\sim 32$  or more ion pairs are sufficient to converge electrostatic effects on the vibrational frequency independent of how many solvent molecules are treated at the QM level. However, we notice that there is a significant shift in frequencies depending on the size of the QM region. The fact that increasing the solvent box (treated as classical point charges) does not cause the differently sized QM regions to reconcile indicates that the underlying effects are quantum mechanical (as opposed to purely electrostatic) in nature. It is therefore indicated to further investigate the dependence of the frequency on the size of the QM region.

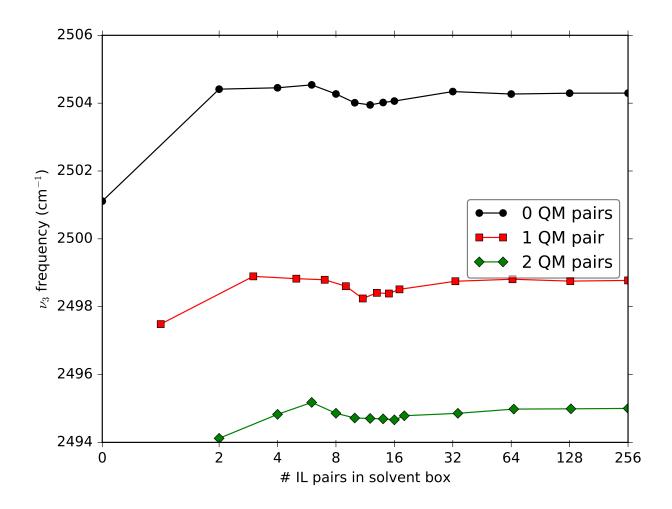


Figure 19: Dependence of harmonic  $\nu_3$  frequencies (unscaled) on the solvent box size (B3LYP/SP potential energy surface).

#### 3.4.6 Quantum Mechanical Interactions with the Solvation Shell

To test for convergence of the asymmetric frequency with respect to the size of the QM region, we selected a subset of 10 snapshots from the MD trajectories and carried out QM/MM harmonic frequency calculations with increasing numbers of anion–cation pairs treated quantum mechanically (Fig. 20). These snapshots were carefully selected to sample the entire range of local vibrational frequencies encountered in the MD trajectories and were averaged by weighting with the appropriate probabilities for each frequency bin. We therefore expect the following results to be representative of large parts of the entire potential energy surface sampled. We tested several functions to fit the mean frequency  $\bar{\nu}$  (i.e., the weighted average over all sampled frequencies) versus the QM region size, and found that an exponential decay function yields the best overall fit,

$$\overline{\nu}\left(n\right) = a\exp\left(-kn\right) + c$$

where n is the size of the QM region (measured in number of ion pairs) and a, k, and c are constants. The quality of the resulting fit was excellent ( $R^2 = 0.99$ ), which allowed us to extrapolate the average frequency to infinite QM region size with high confidence. This extrapolated frequency then allows us to assess the accuracy (convergence) of QM/MM calculations with differently sized QM regions.

We determine the converged frequency to be  $c = 2388.8 \pm 1.5 \text{ cm}^{-1}$  (Fig. 20). This data indicates that the 6 QM calculations are nearly numerically converged ( $\overline{\nu}(6) - \overline{\nu}(\infty) = 0.3 \text{ cm}^{-1}$ ). To test the qualitative accuracy of the calculations using smaller QM regions, we examined the correlation between frequencies calculated with n = 0 - 5 QM pairs and 6 QM pairs for each snapshot (for details, see Supporting Information). We find that the n = 0 - 1 results do not correlate well with the n = 6 benchmark ( $R^2 = 0.41$  and 0.66, respectively). The n = 2 calculations yield an acceptable correlation coefficient of  $R^2 = 0.82$ at a ~9-fold reduced computational cost compared to n = 6 (~0.8 versus ~7 CPU hours for a single point calculation). The n = 3 - 4 calculations show even better correlations with  $R^2 = 0.87 - 0.96$ , respectively, but the computational cost increase to ~3 CPU hours does not appear justified. In summary, the n = 2 calculations reproduce trends in the CO<sub>2</sub>

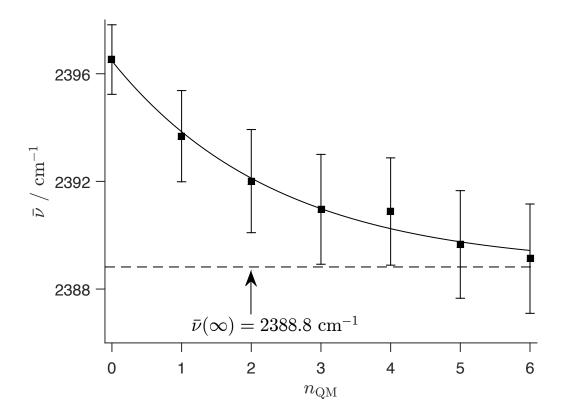


Figure 20: Dependence of DVR  $\nu_3$  mean frequency ( $\overline{\nu}$ ) on the number of solvent ion pairs treated quantum mechanically  $(n_{QM})$ . Mean frequencies were calculated from N = 10 representative MD snapshots using a B3LYP/SP potential energy surface. Error bars represent the standard deviation of the mean  $(SD_{\overline{x}} = \sigma_x/\sqrt{N})$ . The data were fitted to an exponential decay ( $\overline{\nu}_{QM} = A \exp(-kn_{QM}) + \overline{\nu}_{converged}$ ), with weights of  $1/SD_{\overline{x}}^2$  ( $R^2 = 0.99$ ). The resulting estimate for the fully converged frequency at this level of theory is 2388.8 ± 1.5 cm<sup>-1</sup>.

asymmetric stretch frequency reasonably well and offer a good balance between accuracy and cost for our DVR calculations.

#### 3.4.7 Predicted Solvation Shift

A central objective of this publication is to establish a computational approach that will allow us to develop a reliable spectroscopic map for the prediction and interpretation of 2D-IR spectroscopic signatures for CO<sub>2</sub> solvated in ionic liquids. While the spectroscopic map and its validation are the subject of the second publication in this series, we can use the predicted solvation shift (i.e., the frequency shift between gas-phase  $CO_2$  and dissolved in  $[C_4C_1im][PF_6]$ ) as a first indicator for the quality of the computational and chemical model. We note that absolute frequencies are very hard to reproduce with all but the most sophisticated quantum chemical approaches, which are prohibitively expensive for the present application. We therefore scale the calculated frequencies by a factor of 0.9855 so the DVR/B3LYP/LP gas-phase result of  $2384 \,\mathrm{cm}^{-1}$  (Tab. 13) agrees with the experiment  $(2349 \,\mathrm{cm}^{-1})$ . At the proposed DVR/B3LYP/LP level (within a QM/MM approach with n = 2 ion pairs in the QM region and sampling from 85 MD snapshots for the solvated CO<sub>2</sub>), the scaled frequency of the solvated  $CO_2$  is  $2339 \,\mathrm{cm}^{-1}$  (Tab. 14). The predicted solvation frequency shift is then  $-10 \,\mathrm{cm}^{-1}$ , which is in good agreement with the experimental solvation shift of  $-6.8 \text{ cm}^{-1}$ . We note that these results were calculated from only 85 MD snapshots and are therefore probably not statistically converged. We will present an in-depth validation of convergence with respect to number of MD steps in the subsequent paper. The already rather nice agreement makes us optimistic that an accurate spectroscopic map can be developed using the computational approach proposed here.

#### 3.5 CONCLUSIONS

This work provides fundamental insights into the molecular origins of the vibrational frequency shifts of  $CO_2$  in ionic liquids. First, we validated the computational methodology used for predicting vibrational frequencies — as defined by basis set, wave function or density functional method, size of the QM region, and the role of anharmonicity. Second, we analyzed the physical origins of  $CO_2$ -IL binding and its interplay with the vibrational frequency shifts using ALMO and SAPT energy decomposition schemes. Our calculations provide insights that are perhaps quite surprising, but definitely nuanced. In a previous publication we concluded that, unlike for other vibrational chromophores, electrostatics alone poorly predict the vibrational frequency shifts for  $CO_2$  in different ILs. From ALMO-EDA we concluded that this frequency shift between different ionic liquids is actually not driven by the electrostatics, but by charge transfer from the anion. This work confirms that our previous results are qualitatively independent from the choices of basis set, ab initio method, and treatment of anharmonicity, confirming the validity of our previous results within the ALMO framework. For different points on the potential energy surface of a *single* ionic liquid (here:  $[C_4C_1im][PF_6]$ ), however, the energetics are dominated by electrostatics plus Pauli repulsion. This frequency shift mechanism is surprising, firstly because it is fundamentally different from the mechanism that drives the  $CO_2$  frequency shift between different ILs, and secondly because electrostatics plus Pauli repulsion is a relatively small energetic contribution compared to, e.g., dispersion interactions, which one would therefore expect to dominate the frequency shifts. An important practical consequence of this finding is that density functional theory is expected to be sufficiently accurate for constructing potential energy surfaces for  $CO_2$  in  $[C_4C_1im][PF_6]$ , as needed for the DVR calculations to construct a reliable spectroscopic map.

Similarly, we established appropriate computational and chemical models for treating the extended solvent environment. Our calculations show that a QM/MM treatment with  $CO_2$  plus 2 cation–anion pairs treated quantum mechanically yields vibrational frequencies that are sufficiently close to the converged QM results. Furthermore, adding around 32 ion pairs to the MM solvent box leads to vibrational frequencies converged to within  $1 \text{ cm}^{-1}$ .

In summary, this work elucidated the molecular binding mechanism of  $CO_2$  in the  $[C_4C_1\text{im}][PF_6]$  ionic liquid and its interplay with the  $CO_2$  asymmetric stretch frequency  $\nu_3$ , and established computational protocols for the reliable construction of spectroscopic maps for simulating ultrafast 2D-IR data of  $CO_2$  solvated in ILs. For future publications, it

will be interesting to employ similar energy decomposition schemes to analyze the energetics and spectral signatures of other chromophores such as  $SCN^-$ ,  $N_3^-$ , amides, and phosphates.

#### 3.6 ACKNOWLEDGEMENTS

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### 3.7 SUPPORTING INFORMATION

Statistics on calculated harmonic frequencies across different MD snapshots, bin sizes and weights for 15-25 representative structures sampled from MD snapshots, method and basis set dependence, QM/MM box size convergence, quartic fit of the DVR potential energy surface, and effects of BSSE and CP on harmonic frequencies of CO<sub>2</sub> asymmetric stretch across different ionic liquids.

Table 17: Statistics for dependence of  $CO_2$  asymmetric stretch frequencies on quantum chemical method and basis set dependence on 1000 MD snapshots, 0 QM/256 MM. All frequencies in cm<sup>-1</sup>.

method	basis set	min	max	range	mean	median	standard deviation (population)	standard deviation (sample)
BLYP	6-31G(d,p)	2179.26	2915.23	735.97	2551.84	2552.16	112.92	112.86
TPSS	6-31G(d,p)	2247.16	2967.72	720.56	2611.68	2612.06	110.39	110.33
B3LYP	6-31G(d,p)	2141.31	2892.22	750.91	2522.55	2522.96	115.09	115.03
$\omega B97X-D$	6-31G(d,p)	2138.86	2894.15	755.29	2523.38	2523.93	114.14	114.08
$\operatorname{HF}$	6-31G(d,p)	1990.89	2814.31	823.42	2415.50	2416.41	125.46	125.40
RI-MP2	6-31G(d,p)	2264.73	2964.82	700.09	2615.07	2615.27	107.68	107.62
BLYP	cc- $pVTZ$	2083.99	2802.55	718.56	2448.66	2449.17	110.15	110.10
TPSS	cc- $pVTZ$	2164.75	2871.70	706.95	2523.22	2523.74	108.27	108.22
B3LYP	cc- $pVTZ$	2047.30	2781.22	733.92	2420.89	2421.51	112.37	112.31
$\omega B97X-D$	cc- $pVTZ$	2048.35	2787.24	738.89	2425.06	2425.52	111.67	111.61
$\operatorname{HF}$	cc- $pVTZ$	1908.93	2714.98	806.05	2325.54	2326.49	122.60	122.54
RI-MP2	cc-pVTZ	2165.68	2842.63	676.95	2504.51	2504.63	104.39	104.34

Table 18: Weights and bin counts for each quantum chemical method and basis set, 0 QM/256 MM. Weights from B3LYP/6-31(d,p) are used for selecting the structures for box size dependence and SAPT calculations.

method	basis set	bin edges	histogram	weights	sum (histogram)
BLYP	6-31G(d,p)	[2269.54 2382.46 2495.38 2608.30 2721.23 2834.13]	[59 245 398 224 64]	$\begin{bmatrix} 0.05959596 & 0.24747475 & 0.40202020 \\ 0.22626263 & 0.06464646 \end{bmatrix}$	990
TPSS	6-31G(d,p)	[2335.71 2446.10 2556.49 2666.88 2777.27 2887n.66]	$[59\ 244\ 400\ 223\ 64]$	$\begin{bmatrix} 0.05959596 & 0.24646465 & 0.40404040 \\ 0.22525253 & 0.06464646 \end{bmatrix}$	990
B3LYP	6-31G(d,p)	[2234.82 2349.91 2465.00 2580.09 2695.18 2810.27]	$[59 \ 245 \ 398 \ 224 \ 64]$	$\begin{bmatrix} 0.05959596 & 0.24747475 & 0.40202020 \\ 0.22626263 & 0.06464646 \end{bmatrix}$	990
$\omega B97X-D$	6-31G(d,p)	$\begin{bmatrix} 2238.04 & 2352.18 & 2466.31 \\ 2580.45 & 2694.59 & 2808.72 \end{bmatrix}$	$[57 \ 241 \ 401 \ 225 \ 63]$	$\begin{bmatrix} 0.05775076 & 0.24417427 & 0.40628166 \\ 0.22796353 & 0.06382979 \end{bmatrix}$	987
HF	6-31G(d,p)	[2101.85 2227.31 2352.77 2478.23 2603.69 2729.15]	[61 240 399 228 63]	$\begin{bmatrix} 0.06155399 & 0.24217962 & 0.40262361 \\ 0.23007064 & 0.06357215 \end{bmatrix}$	991
RI-MP2	6-31G(d,p)	$\begin{bmatrix} 2345.88 & 2453.56 & 2561.23 \\ 2668.91 & 2776.58 & 2884.26 \end{bmatrix}$	$[59 \ 246 \ 398 \ 223 \ 64]$	$\begin{bmatrix} 0.05959596 & 0.24848485 & 0.40202020 \\ 0.22525253 & 0.06464646 \end{bmatrix}$	990
BLYP	cc- $pVTZ$	[2173.29 2283.44 2393.59 2503.74 2613.89 2724.04]	$[59 \ 245 \ 398 \ 224 \ 64]$	$\begin{bmatrix} 0.05959596 & 0.24747475 & 0.40202020 \\ 0.22626263 & 0.06464646 \end{bmatrix}$	990
TPSS	cc- $pVTZ$	$\begin{bmatrix} 2252.54 & 2360.81 & 2469.09 \\ 2577.36 & 2685.64 & 2793.91 \end{bmatrix}$	$[59 \ 245 \ 396 \ 226 \ 64]$	$\begin{bmatrix} 0.05959596 & 0.24747475 & 0.40000000 \\ 0.22828283 & 0.06464646 \end{bmatrix}$	990
B3LYP	cc- $pVTZ$	[2139.97 2252.34 2364.70 2477.07 2589.44 2701.80]	$[59 \ 244 \ 399 \ 224 \ 64]$	$\begin{bmatrix} 0.05959596 & 0.24646465 & 0.40303030 \\ 0.22626263 & 0.06464646 \end{bmatrix}$	990
$\omega$ B97X-D	cc- $pVTZ$	[2145.89 2257.56 2369.22 2480.89 2592.56 2704.22]	$[57 \ 243 \ 399 \ 225 \ 63]$	$\begin{bmatrix} 0.05775076 & 0.24620061 & 0.40425532 \\ 0.22796353 & 0.06382979 \end{bmatrix}$	987
HF	cc- $pVTZ$	$\begin{bmatrix} 2019.04 & 2141.64 & 2264.24 \\ 2386.84 & 2509.44 & 2632.04 \end{bmatrix}$	[61 240 401 226 63]	$\begin{bmatrix} 0.06155399 & 0.24217962 & 0.40464178 \\ 0.22805247 & 0.06357215 \end{bmatrix}$	991
RI-MP2	cc-pVTZ	[2243.53 2347.92 2452.32 2556.71 2661.11 2765.50]	$[59 \ 247 \ 394 \ 226 \ 64]$	$\begin{bmatrix} 0.05959596 & 0.24949495 & 0.39797980 \\ 0.22828283 & 0.06464646 \end{bmatrix}$	990

#### 3.7.1 Method and Basis Set Dependence of Harmonic Frequencies

It is imperative to investigate how sensitive the prediction of relative trends is with respect to the computational approach. To this end, we consider snapshots from MD simulations (see Ref. [143] for details), which allow us to test how well different computational approaches can predict *trends* in dependence of the local coordination environment around the  $CO_2$ and the bulk solvent structure. Fig. 21 shows the CO<sub>2</sub>  $\nu_3$  harmonic frequencies calculated for 1000 statistically uncorrelated MD snapshots (0 QM/256 MM) using various SCF-type approaches, as compared to Møller-Plesset perturbation theory to second order (MP2) as the least expensive wave function-based method that incorporates dispersion effects.  $^{166}$  The predicted harmonic frequencies in Fig. 21 are parallel to each other for most of the frequency range, independent of method and basis set choice. In fact, there is almost complete overlap between the B3LYP/SP and  $\omega$ B97X-D/SP distributions, and to a lesser degree for B3LYP/VTZ and  $\omega$ B97X-D/VTZ. There is minor crossing of curves in two instances, 1. TPSS/VTZ with  $\omega$ B97X-D/SP, and 2. HF/SP with both B3LYP/VTZ and  $\omega$ B97X-D/VTZ, but nevertheless the conservation of qualitative trends seems excellent. The ordering of calculated frequencies is, from smallest to largest, HF, B3LYP,  $\omega$ B97X-D, BLYP, TPSS, and MP2, using the SP basis set. Within the VTZ basis, the ordering of MP2 and TPSS is interchanged. As expected, the MP2 results are most sensitive to the basis set size, as wave-function based correlation methods require larger basis sets for convergence compared to self-consistent field approaches (HF and DFT). The VTZ basis set predicts frequency distributions that are red-shifted compared to the SP basis set, in agreement with the trends observed from Table 11.

These results for relative trends in vibrational frequencies are highly encouraging. Aside from a multiplicative scaling factor, any of the common quantum chemical methods investigated here can qualitatively reproduce the distribution of harmonic frequencies. The similarity in performance between B3LYP and  $\omega$ B97X-D is somewhat surprising, as the former is a global hybrid with a fixed fraction of HF exchange over all interelectronic distances, and  $\omega$ B97X-D is a range-separated functional with a variable fraction of HF exchange. An explanation of this observation will be provided together with the SAPT results.

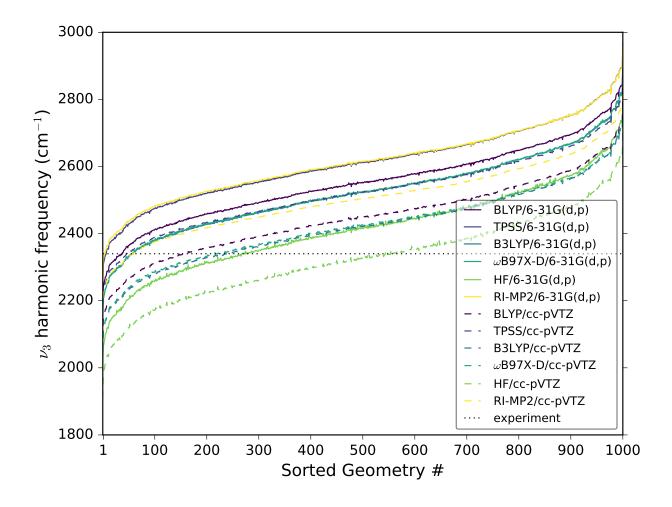


Figure 21: Harmonic  $\nu_3$  frequencies (unscaled) for different methods and basis sets, ordered from lowest to highest frequency according to MP2/VTZ (0 QM/256 MM). The TPSS meta-GGA<sup>175</sup> and the  $\omega$ B97X-D<sup>176</sup> hybrid GGA density functionals are included as representatives of more recent functionals.  $\omega$ B97X-D is both a range-separated functional, with a minimum 22% HF exchange at  $r_e = 0$ , increasing smoothly to 100% as  $r_e \rightarrow \infty$ , and it includes an empirical dispersion correction. To aid in recognizing trends, we have ordered the structures by increasing MP2/VTZ frequency. MP2 calculations use the resolution of the identity (RI) approximation<sup>177-179</sup> and the cc-pVQZ-RI fitting basis set.<sup>180</sup>

To confirm that the good agreement in relative trends is not an artifact of the reordering, CO<sub>2</sub>  $\nu_3$  harmonic frequencies for the first 50 of 1000 MD snapshots are shown in Fig. 22 (0 QM/256 MM, VTZ basis set). Although there are large absolute jumps between snapshots due to the 50 ps time step between them, the ordering between quantum chemical methods does not change, and the gaps between each method are constant.

#### 3.7.2 Potential Energy Surface Fitting

We fitted the discrete variable representation (DVR) of the Born-Oppenheimer potential energy surface of gas phase CO<sub>2</sub> to a vibrational potential expanded in the local modes basis using a nonlinear least squares method. The potential energy expansion was truncated at fourth order, and off-diagonal fourth order terms (e.g.  $c_3[(x - x_0)^2(y - y_0)^2])$  were omitted, using the following form:

$$V(x,y) = a_1(x - x_0)^2 + a_2(y - y_0)^2 + a_3(x - x_0)(y - y_0)$$
  
+  $b_1(x - x_0)^3 + b_2(y - y_0)^3 + b_3[(x - x_0)^2(y - y_0) + (x - x_0)(y - y_0)^2]$   
+  $c_1(x - x_0)^4 + c_2(y - y_0)^4$ 

The resulting fit to the data was excellent  $(R^2 = 0.9997)$ . The parameters are given in Table 24.

The force constants and internal coordinates were calculated (the F matrix) and multiplied by the appropriate mass weighting (G matrix). The product was diagonalized to obtain eigenvalues and eigenvectors, which give the normal modes and frequencies of the symmetric stretch ( $\nu_1 = 1377 \,\mathrm{cm}^{-1}$ ) and antisymmetric stretch ( $\nu_3 = 2414 \,\mathrm{cm}^{-1}$ ).

# 3.7.3 $\nu_3$ Frequency Convergence with Increasing QM Size

To test the qualitative accuracy of the calculations using smaller QM regions, we examined the correlation between frequencies calculated with n = 0 - 5 QM pairs and 6 QM pairs for each snapshot. The data were fitted using a linear regression analysis.

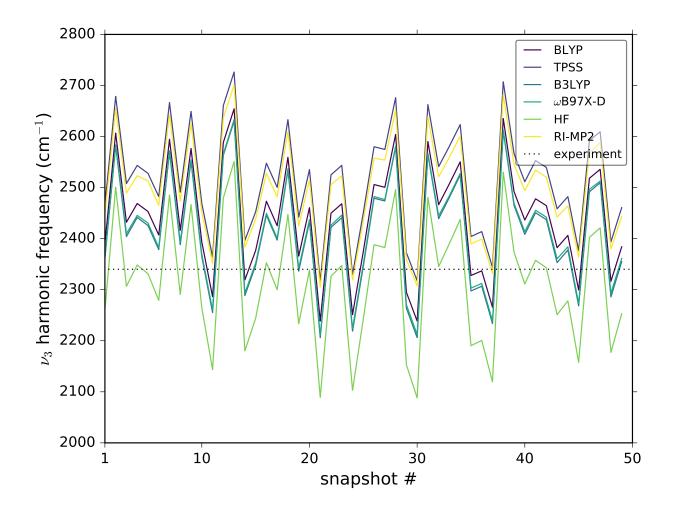


Figure 22: Harmonic  $\nu_3$  frequencies (unscaled) for the first 50 (out of 1000) snapshots calculated with different methods and the cc-pVTZ basis set (0 QM/256 MM).

Table 19: Effect of empirical and self-consistent dispersion corrections on ALMO-decomposed interaction energies with comparison to SAPT0. Values are weighted averages over the same 15 snapshots as in Table 15. Energies are reported in kcal  $mol^{-1}$ .

method	$E_{\rm frz}$	$E_{\rm pol}$	$E_{\rm CT}$	$E_{\rm disp}$	$E_{\rm tot}$
HF/6-31G(d,p)	0.082	-1.303	-0.102		-1.323
B3LYP/6-31G(d,p)	0.500	-1.241	-1.177		-1.918
B3LYP-D2/6-31G(d,p)	0.500	-1.241	-1.177	-6.269	-8.187
B3LYP-D3/6-31G(d,p)	0.500	-1.241	-1.177	-6.464	-8.382
$\omega B97X\text{-}D/6\text{-}31G(d,p)$	-3.343	-1.245	-1.168		-5.757
$\omega B97X\text{-}D/cc\text{-}pVTZ$	-3.114	-1.617	-1.209		-5.941
$\omega B97M\text{-}V/6\text{-}31G(d,p)$	-5.494	-1.256	-0.523		-7.274
$\omega B97M\text{-}V/\text{cc-}\text{pVTZ}$	-5.149	-1.649	-0.889		-7.687
SAPT0/6-31G(d,p)/MCBS	-2.450	-2.049	-0.280	-4.135	-8.634
SAPT0/6-31G(d,p)/DCBS	0.593	-1.910	-0.280	-4.714	-6.031
SAPT0/jun-cc-pVTZ/MCBS	1.009	-2.473	-0.203	-6.930	-8.394
SAPT0/jun-cc-pVTZ/DCBS	1.469	-2.382	-0.205	-7.413	-8.326

Table 20: Effect of allowing or disallowing charge transfer using the ALMO approximation when applied during geometry optimization and/or the harmonic frequency calculation. on the CO<sub>2</sub>  $\nu_3$  harmonic frequency. Clusters are with 1 CO<sub>2</sub>, 1 MMIM cation, and 1 anion. All frequencies are in cm<sup>-1</sup> and unscaled. All calculations were performed using B3LYP/SP with a (100,302) grid.

Anion	full	ALMO geom SCF Hessian	ALMO geom ALMO Hessian	SCF geom ALMO Hessian
$[BF_4]^-$	2434.70	2438.56	2441.62	2437.69
$[DCA]^-$	2430.90	2439.10	2442.59	2434.75
$[\mathrm{PF}_6]^-$	2437.50	2438.47	2441.03	2440.03
$[SCN]^-$	2430.30	2438.78	2441.37	2433.14
$[TFA]^{-}$	2429.80	2438.39	2441.06	2432.93
$[Tf_2N]^-$	2437.70	2438.76	2440.85	2439.46
$[TfO]^{-}$	2433.90	2439.37	2442.54	2436.75

Table 21: Effect of counterpoise correction on  $\text{CO}_2 \nu_3$  harmonic frequency when applied during geometry optimization and/or the harmonic frequency calculation. Clusters are with 1 CO<sub>2</sub>, 1 MMIM cation, and 1 anion. All frequencies are in cm<sup>-1</sup> and unscaled. The first column is from our previous paper. CP-corrected calculations were performed using Cuby as a driver for Turbomole 6.6 at the B3LYP/SP level with numerical integration grid 7.

anion	no/no	yes/no	no/yes	yes/yes
TFA	2429.31	2428.05	2457.238	2440.879
SCN (S-coordinated)	2430.24	2427.91	2445.642	2438.003
DCA	2430.47	2426.60	2436.113	2431.383
SCN (N-coordinated)	2431.64	2427.95	2432.691	2437.876
TfO	2431.91	2428.95	2441.921	2443.665
$BF_4$	2434.69	2431.48	2454.767	2450.890
$Tf_2N$	2435.80	2431.49	2451.851	2441.309
$\mathrm{PF}_{6}$	2437.74	2432.58	2479.806	2469.473

CP-correction for geometry? / CP-correction for frequencies?

Table 22: Counterpoise correction analysis for  $[C_1C_1im][BF_4]$ . All calculations use B3LYP/SP. The CP geometry is from Cuby driving Turbomole. The no CP geometry is from Q-Chem. (100,302) is the grid used in all calculations for the 1st paper.<sup>27</sup>

Geometry?	Hessian?	Program	XC grid	Frequency $(cm^{-1})$
CP	CP	Cuby (Turbomole)	7	2450.89
CP	CP	Cuby (Turbomole)	m5	2450.871
CP	no CP	Cuby (Turbomole)	7	2435.634
CP	no CP	Turbomole	7	$2434.72^{-1}$
CP	no CP	Q-Chem	(75, 302)	2431.55
CP	no CP	Q-Chem	(100, 302)	2431.48 <sup>2</sup>
CP	no CP	Q-Chem	(99, 590)	2431.77 <sup>3</sup>
no CP	no CP	Q-Chem	(100, 302)	2434.69
no CP	CP	Cuby (Turbomole)	7	2454.767

 $^1$  Difference Hessian no CP/CP: 2450.89 – 2434.72 = 16.17

 $^{2}(100, 302) - (75, 302) = -0.07$ 

 $^{3}(99,590) - (75,302) = 0.22$ 

Table 23: Counterpoise correction analysis for  $[C_1C_1im][PF_6]$ . All calculations use B3LYP/SP. The CP geometry is from Cuby driving Turbomole. The no CP geometry is from Q-Chem. (100,302) is the grid used in all calculations for the 1st paper.<sup>27</sup>

Geometry?	Hessian?	Program	XC grid	Frequency $(cm^{-1})$
	messian.	1 TOgram	no griu	riequency (em )
CP	CP	Cuby (Turbomole)	7	2469.473
CP	no CP	Cuby (Turbomole)	7	2436.846
CP	no CP	Turbomole	7	2435.93 <sup>1</sup>
CP	no CP	Q-Chem	(75, 302)	2432.81
CP	no CP	Q-Chem	(100, 302)	2432.58 <sup>2</sup>
CP	no CP	Q-Chem	(99, 590)	2432.99 <sup>3</sup>
no CP	no CP	Q-Chem	(100, 302)	2437.74
no CP	CP	Cuby (Turbomole)	7	2479.806

<sup>1</sup> Difference Hessian no CP/CP: 2469.473 - 2435.93 = 33.543

 $^{2}(100, 302) - (75, 302) = -0.23$ 

 $^{3}(99,590) - (75,302) = 0.18$ 

Table 24: Best fit parameters for DVR representation of the gas phase  $CO_2$  potential energy surface.

coefficient name	value (with 95% confidence bound)
$a_1$	$1.8834 \pm 0.0178  E_{\rm h}  {\rm \AA}^{-2}$
$a_2$	$1.8834\pm 0.0178E_{\rm h}{\rm \AA}^{-2}$
$a_3$	$0.3305\pm0.0087E_{\rm h}{\rm \AA}^{-2}$
$b_1$	$-5.0013\pm0.1124E_{\rm h}{\rm \AA}^{-3}$
$b_2$	$-5.0005\pm0.1123E_{\rm h}{\rm \AA}^{-3}$
$b_3$	$-0.2205\pm0.0330E_{\rm h}{\rm \AA}^{-3}$
$c_1$	$6.3508\pm0.4031E_{\rm h}{\rm \AA}^{-4}$
$c_2$	$6.3485\pm0.4031E_{\rm h}{\rm \AA}^{-4}$
$x_0$	$1.1594 \pm 0.0009{\rm \AA}$
$y_0$	$1.1594 \pm 0.0009 \text{\AA}$

$n_{\rm QM}(1)$	$n_{\rm QM}(2)$	fitting results			
			Estimate	Standard Error	
		Intercept	-20.915	1024.4	
0	6	Slope	1.0056	0.42745	
		Root Mean Squa	red Error:	5.52	
		-	R-squared: 0.409, Adjusted R-Squared: 0.335 Estimate Standard Error		
		Intercept	60.512	593.34	
1	6	Slope	0.97282	0.24788	
		Root Mean Squa			
		R-squared: 0.6	58, Adjust Estimate	ed R-Squared: 0.615 Standard Error	
		Intercept	98.181	384	
2	6	Slope	0.95775	0.16053	
		Root Mean Squa	red Error:	3.08	
		R-squared: 0.8	R-squared: 0.816, Adjusted R-Squared: 0.794 Estimate Standard Error		
		Intercept	173.5	306.89	
3	6	Slope	0.92667	0.12835	
Root Mean Squared Error: 2.62					
		R-squared: 0.8	67, Adjust Estimate	ed R-Squared: 0.85 Standard Error	
		Intercept	2.1463	172.16	
4	6	Slope	0.99837	0.072008	
		Root Mean Squa	red Error:	1.44	
		R-squared: 0.9	6, Adjuste Estimate	d R-Squared: 0.955 Standard Error	
		Intercept	-26.98	85.681	
5	6	Slope	1.0111	0.035855	
		Root Mean Squa	red Error:	0.717	
R-squared: 0.99, Adjusted R-Squared: 0.9					

Table 25: Fitting results for correlation of QM/MM harmonic frequencies of 10 MD snapshots, with increasing numbers of anion-cation pairs  $(n_{\rm QM})$  treated quantum mechanically.

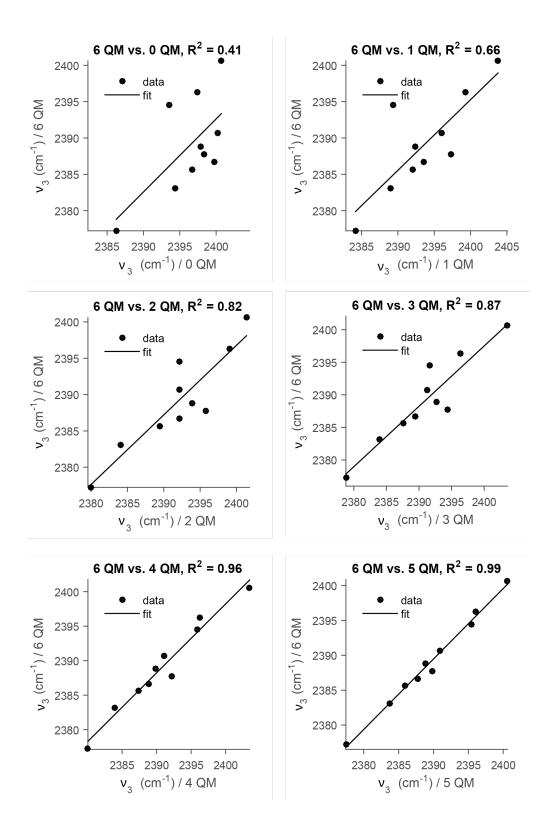


Figure 23: Correlation plots for QM/MM harmonic frequencies of 10 MD snapshots, with increasing numbers of anion-cation pairs treated quantum mechanically.

# 4.0 MODELING CARBON DIOXIDE VIBRATIONAL FREQUENCIES IN IONIC LIQUIDS: II. SPECTROSCOPIC MAP

The text in this chapter has been adapted from Daly, C. A.; Berquist, E. J.; Brinzer, T.; Garrett-Roe, S.; Lambrecht, D. S.; Corcelli, S. A. Modeling Carbon Dioxide Vibrational Frequencies in Ionic Liquids: II. Spectroscopic Map. J. Phys. Chem. B 2016, 120, 12633–12642, DOI: 10.1021/acs.jpcb.6b09509, and is copyright the American Chemical Society. The author's contribution to the work included performing the symmetry-adapted perturbation theory (SAPT) calculations and decomposing each empirical spectroscopic map term in terms of quantum mechanical phenomena.

#### 4.1 SUMMARY

The primary challenge for connecting molecular dynamics (MD) simulations to linear and two-dimensional infrared (2D-IR) measurements is the calculation of the vibrational frequency for the chromophore of interest. Computing the vibrational frequency at each time step of the simulation with a quantum mechanical method like density functional theory (DFT) is generally prohibitively expensive. One approach to circumnavigate this problem is the use of spectroscopic maps. Spectroscopic maps are empirical relationships that correlate the frequency of interest to properties of the surrounding solvent that are readily accessible in the MD simulation. Here, we develop a spectroscopic map for the asymmetric stretch of  $CO_2$  in the 1-butyl-3-methylimidazolium hexafluorophosphate ( $[C_4C_1im][PF_6]$ ) ionic liquid (IL). DFT is used to compute the vibrational frequency of 500 statistically independent  $CO_2$ - $[C_4C_1im][PF_6]$  clusters extracted from an MD simulation. When the map was tested on a 500 different  $\text{CO}_2$ -[C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] clusters, the correlation coefficient between the benchmark frequencies and the predicted frequencies was R = 0.94 and the root mean squared error was 2.7 cm<sup>-1</sup>. The calculated distribution of frequencies also agrees well with experiment. The spectroscopic map required information about the CO<sub>2</sub> angle, the electrostatics of the surrounding solvent, and the Lennard-Jones interaction between the CO<sub>2</sub> and the IL. The contribution of each term in the map was investigated with symmetry-adapted perturbation theory (SAPT) calculations.

#### 4.2 INTRODUCTION

Ionic liquids (ILs) have attracted tremendous attention because of their properties as environmentally friendly alternatives to volatile organic solvents, and their applications involving the production, storage, and efficient utilization of energy.<sup>35,36,181–183</sup> ILs exhibit unique physical properties relative to conventional liquids in terms of vapor pressure, viscosity, electrical and thermal conductivity, solubility of polar and nonpolar molecules, and melting point.<sup>36,184–187</sup> Moreover, these properties can be tuned to specific applications by chemically modifying the molecules that comprise the liquid. For example, by functionalizing the molecules of an IL to react with CO<sub>2</sub>, improved design for preferentially separating CO<sub>2</sub> from gas mixtures was achieved.<sup>39–41,187,188</sup> Thus, ILs offer a promising new direction for the removal of environmentally harmful CO<sub>2</sub> from postcombustion flue gas.

It is essential that the fundamental structure and dynamics of ILs be understood to aid in the design of new ILs for unique applications. Unlike conventional solvents, ILs exhibit heterogeneous structure and dynamics that have profound implications for their physical properties. Two-dimensional infrared (2D-IR) spectroscopy offers several unique advantages for interrogating the structure and dynamics of liquids because of its exquisite time and spatial resolution.<sup>67,69,77,189</sup> The spatial resolution results from the size of suitably chosen vibrational chromophores. The vibrational frequencies of these reporters depend sensitively on their local environment.<sup>77,127,144,162,168,190</sup> As that local environment evolves, so too will the vibrational frequency of the probe — a process called spectral diffusion. 2D-IR spectroscopy measures these frequency fluctuation dynamics, which relate back to the intrinsic dynamics of the surroundings of the vibrational chromophore.

Recently, Brinzer *et al.* have demonstrated that the asymmetric stretch of CO<sub>2</sub> ( $\nu_3$  is an excellent vibrational reporter of its local environment in ILs.<sup>27</sup> In particular, these experiments have established (1) that the asymmetric stretch of CO<sub>2</sub> exhibits a significant solvatochromic shift with respect to the choice of anion in a series of imidazolium-based ILs, (2) that the CO<sub>2</sub> vibrational population lifetime is sufficiently long to measure 2D-IR spectra on a 100 ps timescale, and (3) that the longest spectral diffusion timescale correlates empirically with the viscosity of the IL.<sup>27</sup> Fayer and coworkers have also studied CO<sub>2</sub> in ILs with 2D-IR spectroscopy, including detailed measurements and modeling of the rotational dynamics of CO<sub>2</sub> and how this motion results in reorientational-induced spectral diffusion (RISD). Through analysis of polarization-selective 2D-IR measurements, the RISD contribution to the overall spectral diffusion process was quantified.<sup>119,191</sup> The RISD analysis assumed that shifts in the CO<sub>2</sub> vibrational frequency were governed by a second-order Stark effect.

Among the great successes of multidimensional vibrational spectroscopy is revealing the dynamics of hydrogen-bond network rearrangements in liquid water.<sup>128,192–204</sup> However, these profound insights from experiment were only possible in conjunction with a robust theoretical effort.<sup>176,190,194–196,205–223</sup> Much of that theoretical effort focused on the development and application of empirical relationships connecting the instantaneous vibrational frequency of interest to structural properties — usually the electrostatics — of the surrounding condensed-phase environment.<sup>127,133,206</sup> Such relationships have come to be known as "spectroscopic maps." With a spectroscopic map in hand, quantities such as the linear IR absorption spectrum, 2D-IR spectra, and the frequency fluctuation correlation function that quantifies spectral diffusion, can be readily calculated in a conventional molecular dynamics (MD) simulation.<sup>133,134,211</sup> With the emergence of 2D-IR measurements on  $CO_2$  in ILs, there is ample motivation to develop a spectroscopic map for the asymmetric stretch of  $CO_2$  in an IL.

In paper I,<sup>135</sup> we developed and validated a robust quantum mechanics/molecular mechanics (QM/MM) protocol for calculating anharmonic CO<sub>2</sub> vibrational frequencies in the 1-butyl-3-methylimidazolium hexafluorophosphate ( $[C_4C_1im][PF_6]$ ) IL. Here, we have used the protocol to calculate the asymmetric stretch vibrational frequency of  $CO_2$  in 1000 statistically independent snapshots extracted from an MD simulation. For each frequency calculation, the  $CO_2$  molecule and two pairs of IL molecules are treated quantum mechanically with density functional theory (DFT). The rest of the solvent is included in the calculation as point charges that polarize the quantum mechanical region. The two-dimensional potential energy surface for the  $CO_2$  stretches is constructed on a  $12 \times 12$  grid and the resulting vibrational Schrödinger equation is solved using a discrete variable representation (DVR) method. Once the vibrational frequencies were calculated, 500 of these snapshots were used to parameterize the spectroscopic map and the other 500 snapshots were used to quantify the accuracy of the spectroscopic map.

Previous spectroscopic maps have primarily been based on electrostatics,  $^{168,207,224-228}$  but our initial quantum chemistry investigations<sup>27,135</sup> indicate that the antisymmetric stretch of CO<sub>2</sub> is sensitive to other physical effects, including charge transfer, dispersion, exchange repulsion, and electrostatics. Accordingly, we found that a suitably accurate spectroscopic map could not be constructed using only electrostatic properties of the IL environment. Instead, we had to include both electrostatic and Lennard-Jones (LJ) terms in the map. Błasiak and Cho previously found that including dispersion interactions resulted in an improved spectroscopic map for the amide I vibration of *N*-methylacetamide.<sup>229</sup> In addition, since the CO<sub>2</sub> molecule was modeled as flexible in solution, the map also has a dependence on the CO<sub>2</sub> bend angle whose contribution was investigated in detail.

Spectroscopic maps are inherently empirical and can, in principle, utilize any variable that is sufficiently correlated with the vibrational frequencies, even if that variable is not the cause of the vibrational frequency shifts. Therefore, the dual goals of this work are to develop and validate a spectroscopic map, and to understand how the causal variables manifest themselves in the map. To achieve the first goal, the average frequency and distribution of vibrational frequencies were compared to inhomogeneous vibrational spectra extracted from 2D-IR measurements. To achieve the second goal a selection of snapshots were analyzed with symmetry adapted perturbation theory (SAPT)<sup>156–158</sup> calculations.

In addition to the intermolecular interactions,  $CO_2$  has an important intramolecular degree of freedom, the bending mode. Our previous work<sup>27</sup> has implicated the bending mode

in the experimentally observed solvatochromic shifts. At room temperature, the bending mode has an energy of approximately  $3k_BT$ , placing it in an intermediate regime where it is not clear if a flexible (classical) or a rigid (quantum) model should be more appropriate. To better understand the role of CO<sub>2</sub> flexibility in the spectroscopic map, we calculated histograms of vibrational frequencies for a rigid (bond angle =  $180^{\circ}$ ) and a flexible model of CO<sub>2</sub> in the [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] IL. We also examined a third possibility where the CO<sub>2</sub> is modeled as flexible in the MD simulation, but the bend angle is relaxed prior to applying the spectroscopic map.

The paper is organized as follows. In Section 4.3 the details of the MD simulations and the anharmonic vibrational frequency calculations are described. In Section 4.4, the spectroscopic map is constructed. In Section 4.5, the spectroscopic map is validated by comparison to experiment. In Section 4.6, the contributions of the electrostatic, exchange repulsion, and dispersive interactions in the spectroscopic map are analyzed with ALMO and SAPT calculations. Finally, in Section 4.7 we provide some concluding remarks.

#### 4.3 COMPUTATIONAL METHODS

Molecular dynamics (MD) simulations were performed using the large-scale atomic/molecular massively parallel simulator (LAMMPS)<sup>230</sup> with a time step of 2 fs. 256 ion pairs of  $[C_4C_1im][PF_6]$  and one molecule of CO<sub>2</sub> were simulated at 300 K in a cubic box with periodic boundary conditions. Previous studies have confirmed that 256 ion pairs is a sufficiently large simulation box to mitigate finite-size effects.<sup>231</sup> The original atomic coordinates and box size (45 Å) were generated from a previous study of  $[C_4C_1im][PF_6]$  containing a single water solute, which had been subjected to a rigorous equilibration protocol.<sup>134</sup> The water was replaced with a CO<sub>2</sub> solute, and was subjected to the following equilibration procedure: (1) 1 ns in the NVT ensemble at 300 K, (2) heating to 600 K over 1 ns, (3) cooling to 300 K over 1 ns, (4) 1 ns in the NVT ensemble at 300 K, and (5) 1 ns in the NVE ensemble. Production run trajectories were collected in the NVE ensemble. Energy conservation was excellent, with fits to the energy and temperature over 10 ns revealing slopes of  $3.3 \times 10^{-5}$  kcal mol<sup>-1</sup> ps<sup>-1</sup> and  $9.8 \times 10^{-6} \,\mathrm{K\,ps^{-1}}$ , respectively. All molecules were modeled as fully flexible except for bonds containing hydrogen, which were held fixed at their equilibrium lengths using the SHAKE algorithm.<sup>232,233</sup> Also, in certain cases (see below), the CO<sub>2</sub> bond lengths and angle were held fixed at their equilibrium values using the LAMMPS rigid integrator.<sup>230</sup> The force fields for  $[C_4C_1im][PF_6]$  were the same as in our previous simulation studies involving this IL.<sup>134</sup> Briefly, the bends, bonds, dihedrals, and Lennard-Jones parameters for  $[C_4C_1im]^+$ are from the generalized Amber force field (GAFF),<sup>234,235</sup> and partial charges were obtained from DFT calculations.<sup>236</sup> The  $[PF_6]^-$  force field parameters were from the work of Liu *et al.*<sup>237</sup> Charges on the ions were scaled by 0.84 to empirically account for charge transfer and polarization effects in the IL.<sup>238,239</sup> CO<sub>2</sub> was modeled using the TraPPE force field, with additional terms developed by Perez-Blanco and Maginn for flexible bond lengths and angle.<sup>240,241</sup> Lennard-Jones interactions were truncated at 15 Å and the long-ranged electrostatics were computed using particle-mesh Ewald summation with a 15 Å real space cutoff.<sup>242</sup>

In order to create a spectroscopic map, 1000 statistically independent snapshots separated by 50 ps were collected from a pair of 50 ns simulations, one with a fully flexible  $CO_2$ and a second with a fully rigid  $CO_2$ . For each snapshot, the Born-Oppenheimer potential energy surface (PES) for CO<sub>2</sub> stretching modes was obtained from single point energy calculations performed as the CO bond lengths were stretched from 0.955 to 1.45 Å in 0.045 Å steps. During these calculations, the nearest two pairs of ions by center of mass were included quantum mechanically, and the remaining ions within 20 Å were included as their point charges from the MD force field. The resulting PES was included in a discretized construction of the Hamiltonian for CO stretches, which was then diagonalized, producing the asymmetric stretch frequency. More details about this method can be found in paper 1 of this series. Least squares multiple linear regression was used to empirically fit the electric field due to the anions and cations along the CO bonds and the Lennard-Jones potential energy on the  $CO_2$  carbon and oxygens to the asymmetric stretch of  $CO_2$  for 500 of the flexible snapshots, and the accuracy of the resulting fit was tested using the remaining 500 snapshots. 500 of the rigid snapshots were used as a secondary test set. This is described in more detail in section 4.5. In certain cases, the  $CO_2$  angle from the flexible simulation was relaxed holding all other degrees-of-freedom and the  $CO_2$  center of mass fixed prior to vibrational frequency

calculations for further analysis. This is discussed further in Section 4.6.2.

# 4.4 SPECTROSCOPIC MAP FOR CO<sub>2</sub> VIBRATIONS

Empirical spectroscopic maps relate the instantaneous vibrational frequency of an IR reporter to properties of its surroundings that can be readily accessed in MD simulations.<sup>134,211,243</sup> Once a spectroscopic map has been parameterized, it can be used to calculate IR absorption spectra, 2D-IR spectra, and frequency fluctuation time correlation functions from a MD simulation. For the asymmetric stretch of  $CO_2$  in  $[C_4C_1\text{im}][PF_6]$ , we were unable to obtain a suitably accurate spectroscopic map from electrostatics alone. Instead, we needed to include information about the  $CO_2$  bend angle, as well as the Lennard-Jones (LJ) interactions between  $CO_2$  and the surrounding IL. The spectroscopic map has the following form

$$\omega_a = \omega_g + \Delta \omega_\theta + \Delta \omega_{\text{solvent}} \tag{4.1}$$

where  $\omega_a$  is the predicted CO<sub>2</sub> asymmetric stretch vibrational frequency,  $\omega_g$  is the experimental gas phase frequency (2349.1 cm<sup>-1</sup>),  $\Delta \omega_{\theta}$  is the dependence of the frequency on the OCO bend angle, and  $\Delta \omega_{\text{solvent}}$  captures the change in the vibrational frequency due to interactions with the IL solvent. Figure 24 shows the dependence of the CO<sub>2</sub> asymmetric stretch vibrational frequency on the OCO angle,  $\theta$ , calculated for CO<sub>2</sub> isolated in the gas-phase. The calculated data are fit exquisitely well ( $R^2 = 0.999$ ) by the single-parameter function

$$\Delta\omega_{\theta} = a(1 + \cos\theta) \tag{4.2}$$

where  $a = -1160.9 \,\mathrm{cm}^{-1}$ .

Figure 24 also shows the vibrational frequency of 500 statistically independent  $CO_2$ in  $[C_4C_1im][PF_6]$  snapshots. The vibrational frequencies were calculated using the DVR approach described in paper 1 in this series. In these calculations, the  $CO_2$  and the closest two pairs of  $[C_4C_1im][PF_6]$  molecules — determined using the distance between the centerof-mass of the IL molecule and the  $CO_2$  carbon atom — were treated quantum mechanically at the B3LYP/6-311++G(d,p) level of theory. Any IL molecule whose center-of-mass was within 20 Å was modeled using its molecular mechanics partial atomic charges, which then polarize the quantum mechanical region. IL molecules were added to the molecular mechanics region in pairs to maintain charge neutrality. The overall trend in the vibrational frequencies roughly follows the angle dependence in the gas phase, but there is significant scatter due to interactions with the IL.

A map for the solvent effects on the asymmetric  $CO_2$  vibrational frequency was constructed assuming the following form,

$$\Delta\omega_{\rm solvent} = b_1 E_{\rm O}^{\rm Cation} + b_2 E_{\rm O}^{\rm Anion} + c_1 U_{\rm O} + c_2 U_{\rm C} \tag{4.3}$$

where E and U represent contributions from the electric field and Lennard-Jones (LJ) interactions with the solvent, respectively. The subscript, C or O, indicates whether the interaction is computed at the location of the CO<sub>2</sub> central carbon or at the oxygen atoms. For  $E_{\rm O}$  and  $U_{\rm O}$ , the value used in Eq. (4.3) is the average for the two CO<sub>2</sub> oxygen sites. The LJ interaction is computed using the expression,

$$U = \sum_{j} \varepsilon_{j} \left[ \left( \frac{\sigma_{j}}{r_{j}} \right)^{12} - \left( \frac{\sigma_{j}}{r_{j}} \right)^{6} \right]$$
(4.4)

where the sum is over all atoms in the surrounding liquid,  $\varepsilon_j$  and  $\sigma_j$  are the LJ parameters for the atom, and  $r_j$  is the distance to the atom. The electric fields are calculated with respect to the oxygen atoms of CO<sub>2</sub> and are projected along the relevant CO bond,

$$E = \hat{r}_{\rm CO} \cdot \sum_j \frac{q_j \hat{r}_j}{r_j^2} \tag{4.5}$$

where the sum is over all relevant atoms in in the surrounding liquid (i.e. those associated with the cations for  $E_{\rm O}^{\rm Cation}$  and those associated with the anions for  $E_{\rm O}^{\rm Anion}$ ),  $q_j$  is the partial atomic charge,  $r_j$  is the distance to the charge,  $\hat{r}_j$  is a unit-vector directed toward the site of the charge, and  $\hat{r}_{\rm CO}$  is a unit vector from the carbon atom of CO<sub>2</sub> to the relevant oxygen atom. Long range electrostatics are corrected using the damped shifted force method.<sup>244</sup>

The four parameters,  $b_1$ ,  $b_2$ ,  $c_1$ , and  $c_2$ , in Eq. (4.3) were determined empirically by applying multiple linear regression using the 500 calculated frequencies in the training set (Table 26). The quality of the fit was evaluated using the 500 different frequencies contained

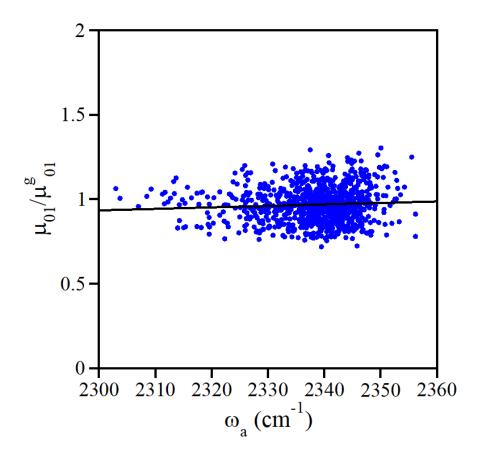


Figure 24: Transition dipole moment integral,  $\mu_{01}$ , of the asymmetric stretch of CO<sub>2</sub> in 1000 CO<sub>2</sub>-[C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] clusters versus the asymmetric stretch vibrational frequency,  $\omega_a$ , where  $\mu_{01}^g$  is the transition dipole moment integral of the asymmetric stretch of CO<sub>2</sub> in the gas-phase (blue circles). A linear fit of the data (black line) has a slope close to zero indicating that the Condon approximation is reasonable for the asymmetric stretch of CO<sub>2</sub> in the [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] IL.

Table 26: Parameters of the spectroscopic map for the CO<sub>2</sub> asymmetric stretch frequency in  $[C_4C_1\text{im}][PF_6]$ . This map predicts the CO<sub>2</sub> with a regression coefficient R = 0.94 and a root mean squared error of  $2.7 \text{ cm}^{-1}$ . The average shift,  $\langle \Delta \omega \rangle$ , and standard deviation,  $\sigma(\Delta \omega)$ , are reported for each term in the map.

		$\langle \Delta \omega \rangle \ (\mathrm{cm}^{-1})$	$\sigma(\Delta\omega) \ ({\rm cm}^{-1})$
$\omega_g$	$2349.1{\rm cm}^{-1}$	0.0	0.0
a	$-1160.9{\rm cm}^{-1}$	-6.6	7.0
$b_1$	$64.4{\rm cm^{-1}a.u.^{-1}}$	-0.1	0.4
$b_2$	$93.2 \mathrm{cm}^{-1} \mathrm{a.u.}^{-1}$	-1.8	0.7
$c_1$	$4.70{\rm cm^{-1}kcal^{-1}mol}$	-9.5	2.0
$c_2$	$-3.55\mathrm{cm^{-1}kcal^{-1}mol}$	7.3	2.1

in the test set (Figure 25). The root-mean-square (RMS) deviation between the test set frequencies and those predicted by Eq. (4.3) was  $2.7 \,\mathrm{cm}^{-1}$ , and the value of correlation coefficient for the fit was R = 0.94. By both metrics, the quality of the spectroscopic map for predicting the CO<sub>2</sub> asymmetric stretch vibrational frequencies in the [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] IL is as good or better than previously published maps for other vibrational reporters in conventional solvents. Additionally, when 500 rigid CO<sub>2</sub> snapshots are used as the test set, the same level of accuracy is obtained.

The Condon approximation, that the magnitude of the transition dipole moment is independent of the vibrational frequency of a mode, fails for some solutes that interact in a strong local way with their environment. The most important example is the OH stretch of liquid water. The hydrogen bonds in water polarize the OH bond, increasing the oscillator strength on the red side of the vibrational band, which has a significant effect on the IR absorption line shape.<sup>225,226,245</sup> Similar to the hydrogen bonding of water, the strong local interactions of  $CO_2$  with the ionic liquid anion could, in principle, cause the Condon approximation to fail. However, we find that the Condon approximation for the main band

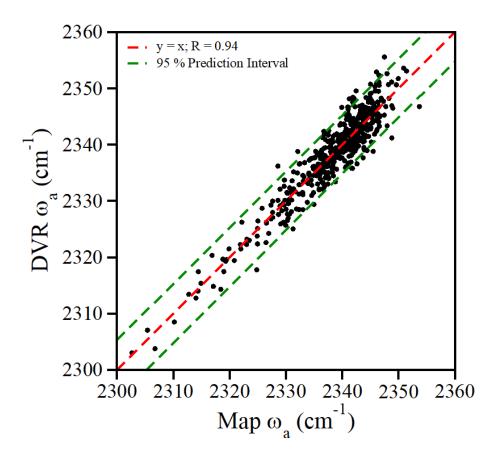


Figure 25: Relationship between CO<sub>2</sub> asymmetric stretch frequencies in the  $[C_4C_1\text{im}][PF_6]$ IL calculated using the DVR method and those calculated using the spectroscopic map for the 500 test set clusters (black circles). The red line represents a perfect correlation and the 95% prediction interval is indicated with green lines. The spectroscopic map has a regression coefficient of R = 0.94 and a root means squared error of  $2.7 \text{ cm}^{-1}$ .

is adequate (Figure 24). We calculated the transition dipole moment integral,  $\mu_{01}$ , of the asymmetric stretch of CO<sub>2</sub> in 1000 CO<sub>2</sub>-[C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] clusters. The details of the transition dipole moment integral calculations are provided in the Supporting Information (SI). A plot of  $\mu_{01}$  scaled by  $\mu_{01}^{g}$ , the transition dipole moment integral of the asymmetric stretch of CO<sub>2</sub> in the gas-phase, versus the asymmetric stretch vibrational frequency,  $\omega_a$ , has a slope close to zero. This confirms that it is reasonable to regard the transition dipole as a constant factor that scales the intensity of linear and non-linear spectra but does not modify their shapes. As a result, we do not treat the environmental dependence of the transition dipole moment in our spectroscopic map; we need only treat the vibrational frequencies.

#### 4.5 PHYSICAL INTERPRETATION OF THE SPECTROSCOPIC MAP

The average contribution to the  $CO_2$  asymmetric stretch vibrational frequency from each of the map components is listed in Table 27. This data demonstrates that the Lennard-Jones potential energy is an important predictor of the vibrational frequency of  $CO_2$  solvated in  $[C_4C_1\text{im}][PF_6]$ , while the electrostatic potential plays a secondary role. This contrasts many prior spectroscopic maps where solvatochromic frequency shifts were based purely on the electrostatics of the environment.<sup>211,224,246</sup> This finding is perhaps surprising at first, because one might expect electrostatics to dominate the interactions of a solute with charged solvent molecules; however, one has to consider that (1)  $CO_2$  is not dipolar or charged, and as such will not interact with uniform electric fields very strongly, and (2) the ionic liquid, particularly the  $[C_4C_1\text{im}]^+$  butyl tails, have large domains where the dominant interactions are dispersive. These points make it conceivable that van der Waals effects dominate the  $CO_2$ -IL interaction.

To further unravel the origin of the impact of CO<sub>2</sub>-IL interactions on the vibrational signature of CO<sub>2</sub>, we use the fact that the LJ contributions to the spectroscopic map can be further decomposed. In particular, we separate the LJ term into its repulsive ( $\sim r^{-12}$ ) and attractive ( $\sim r^{-6}$ ) contributions (Table 27). We find that the attractive and repulsive LJ terms contribute  $-7.0 \,\mathrm{cm}^{-1}$  and  $+4.9 \,\mathrm{cm}^{-1}$ , respectively, to the overall LJ vibrational

LJ Component	Site	$\langle \Delta \omega \rangle \ ({\rm cm}^{-1})$
Attractive	0	-21.7
	$\mathbf{C}$	14.8
	Sum	-6.9
Repulsive	Ο	12.3
	$\mathbf{C}$	-7.4
	Sum	4.9
Total	Ο	-9.4
	$\mathbf{C}$	7.3
	Sum	-2.1

Table 27: Decomposition of the average LJ contribution to the spectroscopic map for the  $CO_2$  asymmetric stretch frequency in  $[C_4C_1\text{im}][PF_6]$  into attractive and repulsive components.

shift of  $-2.1 \text{ cm}^{-1}$ . The large contribution from the repulsive LJ term is yet another surprise. To aid in identifying the physical origins of the large repulsive LJ contribution, we performed symmetry adapted perturbation theory  $(\text{SAPT})^{158}$  calculations that decompose the total interaction energy into physically meaningful components. This analysis should be contrasted with the empirical spectroscopic map, where a good fit implies correlation but not necessarily causation. Our SAPT calculations yield energy contributions, but it should nevertheless be possible to estimate the relative importance of different interactions for vibrational frequencies. The SAPT decomposition supports the previous discussion in that electrostatic interactions (electrostatics, induction) plus the exchange (exchange repulsion, exchange-induction) roughly cancel (total  $-1.3 \text{ kcal mol}^{-1}$ ), whereas dispersive interactions dominate the interaction (total  $-4.7 \text{ kcal mol}^{-1}$  from dispersion plus exchange-dispersion). However, the SAPT data also reveals that exchange-dispersion (the repulsive dispersion part) is over an order of magnitude smaller than the attractive dispersion contribution (10.1% of the total dispersion interaction). This result has to be contrasted with the  $\sim 40\%$  contribution

that the repulsive LJ potential makes to the vibrations. Since the repulsive LJ contribution is the dominant repulsive interaction incorporated in our model, the SAPT results suggest that the repulsive part of the LJ potential fits an agglomerate of exchange (Pauli) repulsion stemming from charge overlap (74.7% of the repulsive interactions), exchange induction (20.7%) plus exchange dispersion (4.6%).

It is likely that LJ components will be an important component of a spectroscopic map for any neutral and nonpolar solute, or any solvent where dispersive interactions, quantum effects (Pauli exchange, for instance), or higher order electrostatic interactions are particularly important. In our case, it seems logical that a higher potential at the carbon would increase the optimal length of the CO bonds, thus decreasing the local mode and normal mode frequencies. Meanwhile, at the oxygen, a larger potential would generally shorten the bond, increasing the frequency. A similar finding was observed by Brinzer et al.<sup>27</sup> However, these components only allow the  $CO_2$  vibration to respond to local effects — the electric field components allow it to respond to longer-range interactions. As in prior works for different solvents and solutes, the coefficients for the two electric field components are different from each other, in this case by a substantial margin. It has been previously established that  $CO_2$ interacts with the anions more strongly than with the cations in an ionic liquid.  $^{39,42,101,247-249}$ This is reflected in the magnitude of the coefficients related to the two components, and in their average frequency contribution (Tables 26 and 27). In particular,  $CO_2$  is a Lewis acid and should generally interact with negatively charged moieties differently from positively charged ones.

#### 4.6 VALIDATION

# 4.6.1 Experimental Frequency Distribution

In order to compare our calculated distributions of  $CO_2$  vibrational frequencies with experiment, we must account for the effects that broaden or narrow the IR absorption line shape beyond the underlying distribution of frequencies. The finite population lifetime of the asymmetric stretch vibration, reorientation of the  $CO_2$  molecule, and a variety of other effects can broaden the absorption spectrum. On the other hand, fast dynamics can narrow the absorption spectrum (i.e. motional narrowing). A faithful comparison to experiment requires a deconvolution of these contributions to estimate the range of instantaneous frequencies experienced by  $CO_2$ .

2D-IR spectra contain sufficient information to recover the distribution of frequencies, which would be difficult to extract from the linear IR absorption spectrum alone.<sup>27</sup> Within the Kubo multi-exponential ansatz, the width of the frequency distribution is determined by the frequency fluctuation correlation function

$$\langle \delta \omega(t) \delta \omega(0) \rangle = \sum_{i}^{N} \Delta_{i}^{2} \exp\left(-\frac{t}{\tau_{i}}\right)$$
(4.6)

where  $\Delta_i^2$  are the variances of frequency modulations, and  $\tau_i$  are the timescales for the respective frequency fluctuations. The width of the frequency distribution is the sum of squares of the different broadening processes

$$\left<\delta\omega^2\right> = \sum_i^N \Delta_i^2 \tag{4.7}$$

The contribution of homogeneous processes whose frequency fluctuations are too fast to be resolved (specifically when  $\Delta_i \tau_i \ll 1$ ) can be approximated as  $\delta(t) \Delta_H^2 \tau_H$ , which results in a frequency correlation function:

$$\langle \delta\omega(t)\delta\omega(0)\rangle = \delta(t)\Delta_H^2 \tau_H + \sum_i^{N-1} \Delta_i^2 \exp\left(-\frac{t}{\tau_i}\right) = \frac{\delta(t)}{T_2^*} + \sum_i^{N-1} \Delta_i^2 \exp\left(-\frac{t}{\tau_i}\right)$$
(4.8)

where  $T_2^* \equiv (\Delta_H^2 \tau_H)^{-1}$  is the pure dephasing time and  $\delta(t)$  is the Dirac delta function. The pure dephasing time depends on the variance of the fast frequency fluctuations,  $\Delta_H^2$ , and the correlation time for fast motions,  $\tau_H$ , and the two parameters cannot be independently determined. Analyzing the change in shape of the 2D-IR spectra as a function of the waiting time can directly determine the magnitude of frequency modulations related to the sum of exponential decays,  $\sum_i^{N-1} \Delta_i^2$ , in Eq. (4.8). For CO<sub>2</sub> in [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] this sum is approximately  $2 \text{ cm}^{-1}$ .<sup>27</sup> Determining the magnitude of frequency modulations that give rise to the first term in Eq. (4.8) is more complicated. The pure dephasing time  $(T_2^*)$  is only one contributor to the experimentally determined dephasing time  $(T_2)$ , which also depends on the population  $(T_1)$ , and reorientational  $(T_{or})$  motions of the molecule,

$$\frac{1}{T_2} = \frac{1}{T_2^*} + \frac{1}{2T_1} + \frac{1}{3T_{or}}$$
(4.9)

The experimental dephasing time,  $T_2$ , of the asymmetric stretch of CO<sub>2</sub> in the [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] IL is 3.3 ps.<sup>27</sup> Since the experiment was performed in an all-parallel polarization, we cannot unambiguously determine the population and orientation relaxation times. We can estimate them, however, based on the rate of signal decay and the orientational correlation functions determined in a similar ionic liquid.<sup>119,191</sup> Estimates of  $T_1 = 20$  ps and  $T_{or} = 10$  ps, suggest that vast majority contribution to  $T_2$  for CO<sub>2</sub> in [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] comes from pure dephasing. Population relaxation and orientational relaxation have a minor effect on the total dephasing time. We estimate a pure dephasing time of  $T_2^* = 4$  ps.

Finally, the variance of the frequency fluctuations,  $\Delta_H^2$ , can be limited to a range by physical constraints on the values of  $\tau_H$ . The lower limit on  $\tau_H$  is governed by the inertial motions of CO<sub>2</sub> and its ionic liquid solvent shells. The timescale of the inertial response in liquid water is in the sub-60 fs range, while that of acetonitrile is 70 fs.<sup>194,250,251</sup> Using 70 fs as a lower limit for  $\tau_H$  places an upper limit on  $\Delta_H$  of 9.7 cm<sup>-1</sup>. Fits to analytical response functions suggests that  $\Delta_H \tau_H \approx 0.2$  is a reasonable estimate of the dynamics that can be resolved using global fitting of the experimental data, which gives an upper limit on  $\tau_H$  of 200 fs, with a corresponding lower limit on  $\Delta_H$  of 6 cm<sup>-1</sup>. Our estimate for the homogeneous width is thus,  $6 < \Delta_H < 10 \text{ cm}^{-1}$ . Combining the broadening due to fast and slow motions, the experimentally estimated total frequency width for CO<sub>2</sub> in [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] is between 6.3 to 10.2 cm<sup>-1</sup> (Figure 26).

#### 4.6.2 Calculated Frequency Distributions

Figure 27a shows the distribution of  $CO_2$  asymmetric stretch vibrational frequencies computed using the spectroscopic map for 1000 statistically independent snapshots collected

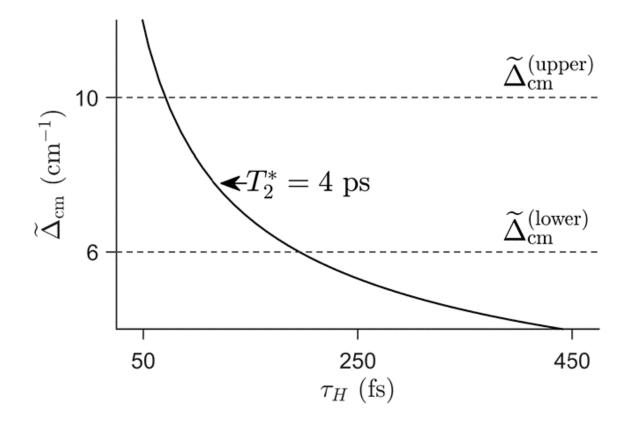


Figure 26: Homogeneous instantaneous linewidth as a function of correlation time for fast motions, with  $T_2^* = 4$  ps, with upper and lower bounds estimated for  $\widetilde{\Delta}_H$ . The upper bound, based on an estimated fastest allowed inertial response timescale, and the lower bound, based on a threshold value of  $\Delta_H \tau_H$ , are indicated by dashed horizontal lines. The resulting instantaneous frequency range for homogeneous motions is between 6 to  $10 \text{ cm}^{-1}$ .

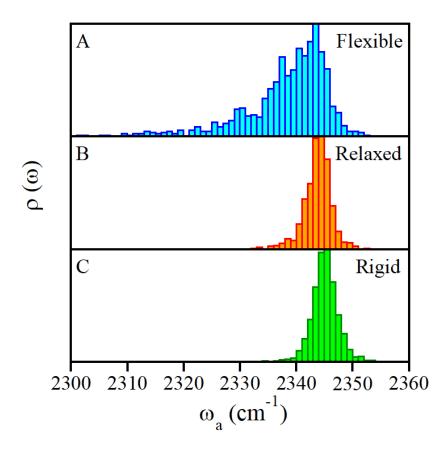


Figure 27: Histograms of the CO<sub>2</sub> asymmetric stretch vibrational frequency,  $\omega_a$ , for 1000 CO<sub>2</sub>-[C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] clusters. (a) Clusters extracted from an MD simulation of flexible CO<sub>2</sub> in the [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] IL. (b) Clusters extracted from an MD simulation of flexible CO<sub>2</sub> in the [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] IL, but where the CO<sub>2</sub> geometry is relaxed. (c) Clusters extracted from an MD simulation of rigid CO<sub>2</sub> in the [C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] IL.

from an MD simulation of flexible  $\text{CO}_2$  in  $[\text{C}_4\text{C}_1\text{im}][\text{PF}_6]$ . These are the same snapshots that were used to parametrize and validate the spectroscopic map in Section 4.4. The distribution is peaked at approximately 2344 cm<sup>-1</sup> and its standard deviation is 7.4 cm<sup>-1</sup>. Both of these values are in reasonable agreement with experiment (2342.5 cm<sup>-1</sup> and 6.3 to 10.2 cm<sup>-1</sup>). Qualitatively, the distribution exhibits a significant asymmetry with a mean frequency of 2339.9 cm<sup>-1</sup> that is about 4 cm<sup>-1</sup> to the red of the peak frequency. The experimental IR absorption line shape, however, does not show signs of such asymmetry in the underlying distribution of frequencies.

The source of the asymmetry in the distribution of frequencies in Figure 27a is the contribution to the spectroscopic map from the CO<sub>2</sub> bend angle, Eq. (4.2). This is illustrated in Figure 27c, where we have calculated the distribution of CO<sub>2</sub> asymmetric stretch vibrational frequencies for 1000 statistically independent snapshots collected from an MD simulation of rigid CO<sub>2</sub> in  $[C_4C_1\text{im}][PF_6]$ . Since the CO<sub>2</sub> molecule has an angle of 180° in each of the snapshots, the contribution to the calculated vibrational frequency from the CO<sub>2</sub> bend angle is zero. The resulting distribution is correctly symmetric with a mean frequency of 2346.5 cm<sup>-1</sup> and a standard deviation of 2.3 cm<sup>-1</sup>. The calculated distribution is centered 4 cm<sup>-1</sup> to the blue of the experimental distribution, and it is narrower than the lower estimate of the experimental distribution by 4 cm<sup>-1</sup>.

The results in Figure 27a and 27c represent two extremes — one where the  $CO_2$  bend is treated classically (Figure 27a) and another where the  $CO_2$  bend is effectively neglected (Figure 27c). When the  $CO_2$  bend is classical, it is assumed that the  $CO_2$  asymmetric stretch vibrational frequency depends on the instantaneous value of the bend angle, Figure 28 and Eq. (4.2). However, the asymmetric distribution suggests that this approach is incorrect. In fact, a simple thought experiment reinforces the problems associated with regarding the  $CO_2$  bend as a classical variable. Consider a non-rotating  $CO_2$  molecule isolated in the gas phase. If all of the vibrations of the  $CO_2$  molecule are quantum mechanical, the distribution of each of the four vibrations is a delta function. However, if the bend is classical with a kinetic energy commensurate with room temperature, the distribution of asymmetric stretch vibrational frequencies will incorrectly have a finite width. One solution to this conundrum is to adopt a fully quantum mechanical treatment of the  $CO_2$  vibrations. This would require the construction of a four-dimensional potential energy surface for each of the 1000 benchmark  $CO_2$ - $[C_4C_1im][PF_6]$  clusters, which is computationally intractable.

An alternate strategy is to treat the influence of the  $CO_2$  bend on the asymmetric stretch vibrational frequency using first-order perturbation theory. Instead of utilizing the instantaneous CO<sub>2</sub> angle in Eq. (4.2),  $\theta$ , we would instead use the average angle,  $\langle \theta \rangle = \langle \varphi_0 | \theta | \varphi_0 \rangle$ , where  $\varphi_0(\theta)$  is the ground vibrational wavefunction for the CO<sub>2</sub> bend. Returning to the  $CO_2$  in the gas-phase thought experiment, the average angle is constant and equal to  $180^{\circ}$ . Thus, there would correctly be no contribution to  $CO_2$  asymmetric stretch vibrational frequency. In contrast, the instantaneous average bend angle will fluctuate away from 180° in an IL because of asymmetric solvation by the solvent. Of course, we do not have access to vibrational wavefunction for the  $CO_2$  bend for the benchmark  $CO_2$ -[C<sub>4</sub>C<sub>1</sub>im][PF<sub>6</sub>] clusters, nor when we wanted to utilize the spectroscopic map to analyze an MD simulation. An additional approximation is necessary. If we were to regard the  $CO_2$  bend as harmonic, then the average angle is given by the instantaneous distortion of the  $CO_2$  geometry by the environment. For the benchmark clusters, the geometry distortion can be determined by optimizing the geometry of the  $CO_2$  molecule using the classical MD force field and a conjugate gradient minimization while holding fixed both the center-of-mass of the  $CO_2$ , as well as the configuration of the IL solvent. The map is then used to calculate the vibrational frequency for the relaxed snapshot.

Figure 27b shows the distribution of  $CO_2$  asymmetric stretch vibrational frequencies computed using the spectroscopic map for 1000 statistically independent snapshots collected from an MD simulation of flexible  $CO_2$  in  $[C_4C_1\text{im}][PF_6]$  where the  $CO_2$  bend angle has been relaxed. On average, the relaxed bend angle is 178.4°, and the distribution of frequencies is nearly symmetric with a mean frequency of 2343.8 cm<sup>-1</sup> and a standard deviation of 2.4 cm<sup>-1</sup>. The mean frequency is in excellent agreement with experiment and differs by only  $1.3 \text{ cm}^{-1}$ . Note that this agreement implies that the spectroscopic map is able to accurately capture the solvatochromic shift of the  $CO_2$  asymmetric stretch vibrational frequency from the gas-phase to the  $[C_4C_1\text{im}][PF_6]$  IL. The width of the distribution is too narrow compared to the estimated width of the experimental distribution of 6.3 to  $10.2 \text{ cm}^{-1}$ . There are several possible sources for the discrepancy in the width of the distribution, including inaccuracies associated

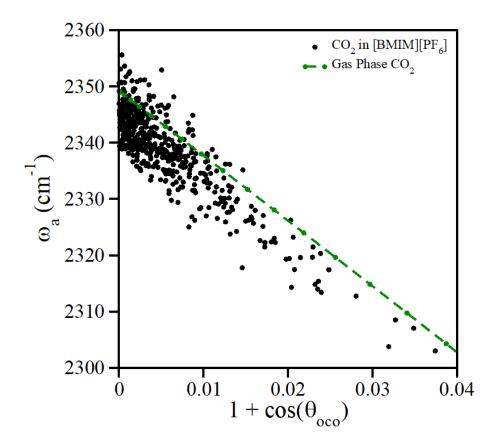


Figure 28: Relationship between the  $CO_2$  asymmetric stretch vibrational frequency and the OCO angle,  $\theta_{OCO}$ , for  $CO_2$  in the gas-phase (green circles) and in the  $[C_4C_1\text{im}][PF_6]$ IL (black circles). The gas-phase data are perfectly correlated with  $1 + \cos \theta_{OCO}$ ). The vibrational frequencies for  $CO_2$  in the  $[C_4C_1\text{im}][PF_6]$  solvent also show this relationship, but additional solvation effects on the frequency are also present.

with the approximate perturbative approach for the effect of the bend on the asymmetric stretch frequency. However, the overall agreement with experiment is encouraging.

It is instructive to compare the distributions in Figures 27b (relaxed  $CO_2$ ) and 27c (rigid  $CO_2$ ). Both distributions are symmetric and they have nearly the same widths:  $2.4 \text{ cm}^{-1}$  and  $2.3 \text{ cm}^{-1}$ , respectively. Thus, within the approximate perturbative approach, the bend has very little influence on the width of the distribution. The averages of the distributions differ more significantly:  $2343.8 \text{ cm}^{-1}$  and  $2346.5 \text{ cm}^{-1}$ , respectively. The bend shifts the distribution to the red and into better agreement with experiment. Overall, the role of the bend is relatively minor resulting in a redshift of the distribution by  $2.7 \text{ cm}^{-1}$ . These results suggest several options for how the bend is treated when the map is applied in conjunction with MD simulations to understand the spectroscopy and spectral diffusion dynamics of  $CO_2$  in the  $[C_4C_1\text{im}][PF_6]$  IL in Paper III<sup>252</sup> in this series. The simplest strategy is to hold the  $CO_2$  rigid and to shift the calculated frequencies by  $2.7 \text{ cm}^{-1}$ . In essence, this would just account for the average effect of the  $CO_2$  angle on the asymmetric stretch frequencies. A more computationally intensive strategy is a simulation with  $CO_2$  flexible but where the geometry of the  $CO_2$  is optimized using the classical force field. The efficacy of these approaches will be evaluated in Paper III.<sup>252</sup>

#### 4.7 CONCLUSIONS

In this paper we have developed and validated a spectroscopic map that is the foundation for a molecular interpretation of ultrafast vibrational spectroscopy of  $CO_2$  in ionic liquids. In addition, we have established important insights into the solvatochromic shift of the  $CO_2$  asymmetric stretch vibrational frequency in ILs. We analyzed the physical origin of the vibrational frequency shifts using SAPT energy decomposition schemes. Unlike other vibrational chromophores, such as the OH stretch of HOD in liquid water,<sup>196</sup> electrostatics alone poorly predicts the vibrational frequency. This is consistent with recent studies of the amide I vibration in peptides<sup>229</sup> and nitrile vibrations,<sup>253</sup> where exchange repulsion and dispersion interactions are important for properly describing solvatochromic shifts. While the most important contributor to the electrostatic part of the spectroscopic map is the field from the anion, both attractive dispersion interactions and repulsive charge overlap forces (Pauli repulsion) play additional important roles. Finally, while the  $CO_2$  bend angle influences the asymmetric stretch frequency, we have shown that the geometry of the  $CO_2$ molecule is only slightly perturbed by the IL, so regarding the  $CO_2$  as rigid is generally sufficient to capture the structural relaxation of the IL relative to the  $CO_2$ .

### 4.8 ACKNOWLEDGEMENTS

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# 4.9 SUPPORTING INFORMATION

Details regarding the transition dipole moment integral calculations in Figure 24.

#### 4.9.1 Transition Dipole Moment Calculations

The intensity of a vibrational transition,  $\tilde{\nu}_{if}$ , is related to the dipole moment matrix element between the two states,  $\langle \vec{\mu}_{if} \rangle$ 

$$I\left(\tilde{\nu}_{if}\right) = \frac{8\pi^3 N_A}{3hc \left(4\pi\epsilon_0\right)} \tilde{\nu}_{if} \left|\vec{\mu}_{if}\right|^2 \left(N_i - N_f\right)$$

$$\tag{4.10}$$

where  $N_A$  is Avogadro's number,  $N_k$  is the number of particles in the *k*th state and  $|\vec{\mu}_{if}|^2$  is the squared norm of the transition dipole moment (TDM) integral between the two states.<sup>254</sup> Because all values in equation 4.10 are constant (at a specific temperature) vibrational intensities for particular transitions are proportional to the squared norm of the TDM vector. Thus, the central property to calculate in order to evaluate the strength of the Condon approximation is  $\langle \vec{\mu}_{if} \rangle$ .

We can calculate the matrix elements of the dipole moment operator in a similar fashion as the bond length matrix elements were calculated in paper 1. Before, we used the value of the bond length at each grid point as a representation of the bond length operator. Similarly, we use the x, y, and z components of the dipole moment at each grid point (reported by a quantum chemistry program — in this case, Q-Chem<sup>93</sup> — as the appropriate integral over the entire charge density) as a representation of the dipole moment operator,

$$\vec{\mu} = \sum_{k=1}^{3} \mu^k \hat{k} \tag{4.11}$$

where  $\hat{k}$  is the  $k^{\text{th}}$  Cartesian basis vector. The dipole moment matrix elements are, for a two dimensional grid,

$$\langle \vec{\mu}_{if} \rangle = \sum_{k=1}^{3} \sum_{l=1}^{N} \sum_{j=1}^{N} \psi_{jl}^{i} \mu_{jl}^{k} \hat{k} \psi_{jl}^{f}$$
(4.12)

where the  $\psi_{jl}^n$  are the vibrational wavefunctions for state n on grid point (j, l) returned by the DVR method. We have evaluated the accuracy of this method for CO<sub>2</sub> in two ways. First, we calculate the norm of the TDM integral for the symmetric and asymmetric stretches of CO<sub>2</sub> in the gas phase and compare these to experiment.<sup>255</sup> The results are shown in Table 28, and the accuracy is excellent.

Next, we evaluated the accuracy of this method for  $CO_2$  in solution. A previously used method for evaluating the Condon approximation for vibrational reporters in solution is to (1) optimize the vibrational subsystem of interest with DFT while freezing all other degrees of freedom, (2) calculate the harmonic vibrational frequency and intensity for the vibrational subsystem using the same DFT method, then (3) repeat this for many statistically independent snapshots of the reporter in solution.<sup>226</sup> This process was completed for 25 snapshots of  $CO_2$  in IL solution for the asymmetric stretch. DVR asymmetric stretch frequencies and TDMs were also calculated for the 25 optimized (post step 1) snapshots. In order to facilitate comparison, the square roots of the intensities were taken. The resulting values and the TDMs were divided by their respective gas phase values. These values are plotted against each other in figure 29. The agreement between the two methods is excellent (R = 0.994). This new method has the advantage of being essentially computationally free to perform anytime a DVR calculation has already been done. Due to the possibility of parallelization, DVR calculations can be much more computationally inexpensive than regular vibrational frequency calculations.

Table 28: Transition dipole moments for gas phase stretching modes of  $CO_2$ .

Mode	DVR(D)	Experiment $(D)^{255}$
$\omega_s$	$1.1 \times 10^{-13}$	0.0
$\omega_a$	$3.4 \times 10^{-1}$	$3.3 \times 10^{-1}$

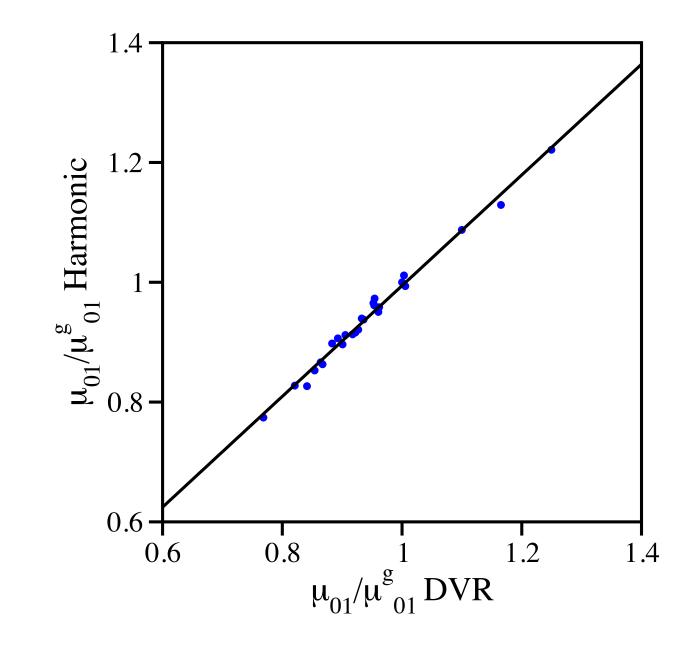


Figure 29: Normalized transition dipole moment for the asymmetric stretch of CO<sub>2</sub> as calculated by a quantum chemistry program and as calculated by the DVR method (blue dots). The black line is the best fit line, y = 0.97x + 0.07. The correlation coefficient is 0.994.

# 5.0 A FIRST PRINCIPLES APPROACH FOR PARTITIONING LINEAR RESPONSE PROPERTIES INTO ADDITIVE AND COOPERATIVE CONTRIBUTIONS

The text in this chapter has been adapted from Berquist, E. J.; Lambrecht, D. S. A First Principles Approach for Partitioning Linear Response Properties into Additive and Cooperative Contributions. 2018, DOI: 10.26434/chemrxiv.5773968.v1. The author's contribution to the work included deriving the equations, implementing the algorithm, performing all calculations, and writing the manuscript.

### 5.1 SUMMARY

We present the analytic implementation of linear response equations on top of absolutely localized molecular orbitals (ALMOs) as part of libresponse, a library for solving the non-orthogonal molecular response equations for arbitrary operators. In the spirit of the original SCF(MI) and TDDFT(MI) formulations, our method is called linear response for molecular interactions, or LR(MI). Charge transfer was discovered to play an equally significant role in both the ground-state and response iterations.

## 5.2 INTRODUCTION

Experimental spectroscopy is a powerful tool for understanding the structure and function of molecular systems, especially when combined with theory and computation.<sup>2,4,257</sup> Absolutely

localized molecular orbitals (ALMOs)<sup>100</sup> and their associated energy decomposition analysis (ALMO-EDA)<sup>102</sup> provide a intuitive picture of how interactions at the microscopic scale translate to physical insight at the macroscopic scale. ALMO-EDA is capable of separating the total interaction energy of two or more user-defined arbitrary fragments into the following components:

$$\Delta E_{\rm int} = \Delta E_{\rm gd} + \Delta E_{\rm frz} + \Delta E_{\rm pol} + \Delta E_{\rm CT}, \qquad (5.1)$$

where

- $\Delta E_{\rm gd}$  is the energy raising due to the distortion from each fragment's isolated geometry into the cluster geometry;
- $\Delta E_{\text{frz}}$  is the "frozen density" interaction, which accounts for classical electrostatics and Pauli repulsion between the fragments, and is usually positive;
- $\Delta E_{\text{pol}}$  is the polarization energy, which is the self-consistent response of each fragment's electron density in the field of the other fragments, and is always negative;
- $\Delta E_{\rm CT}$  is the charge transfer interaction/energy, and is always negative.

This separation is achieved via a constrained self-consistent field calculation, called SCF for molecular interactions (SCF(MI)), producing ALMOs that incorporate fragment polarization but not charge transfer. There are multiple approximations to  $\Delta E_{\rm CT}$ , which can be further broken apart into a perturbative correction and higher-order effects stemming from a self-consistent treatment, where all orbital constraints are lifted and supersystem SCF iterations are performed (equation 5 in ref. [103]):

$$\Delta E_{\rm CT} = \Delta E_{\rm CT}^{\rm RS} + \Delta E_{\rm CT}^{\rm HO}.$$
(5.2)

Each of these terms can be broken apart further into a sum of a true electron delocalization term and a BSSE term:

$$\Delta E_{\rm CT}^{\rm RS} = \Delta E_{\rm del}^{\rm RS} + \Delta E_{\rm BSSE}^{\rm RS},$$
  
$$\Delta E_{\rm CT}^{\rm HO} = \Delta E_{\rm del}^{\rm HO} + \Delta E_{\rm BSSE}^{\rm HO}.$$
  
(5.3)

Such an energy decomposition is made possible due to the bottom-up construction of ALMOs, where each ALMO is formed from atomic orbitals (AOs) only on a specific fragment,

leading to MOs that are spatially localized onto fragments. In a previous work,<sup>27</sup> we showed that a similar decomposition is possible for peaks in vibrational spectra according to

$$\omega_{\text{tot}} = \omega_{\text{free}} + \Delta\omega_{\text{int}},$$

$$\Delta\omega_{\text{int}} = \Delta\omega_{\text{gd}} + \Delta\omega_{\text{frz}} + \Delta\omega_{\text{pol}} + \Delta\omega_{\text{CT}},$$
(5.4)

where each term has an analogous meaning to the original ALMO-EDA, except changes in the vibrational frequencies  $\{\omega\}$  rather than the interaction energy are used. We seek a more general decomposition of response properties, starting with those based on linear response (LR), where each  $\omega$  in eq. (5.4) is replaced with  $\langle \langle \hat{P}; \hat{Q} \rangle \rangle_{\omega_Q}$ , representing the influence of a perturbation  $\hat{Q}$  with frequency  $\omega_Q$  on  $\hat{P}$ .

This is not the first work to seek a fragment- or subsystem-based decomposition of molecular response properties. The LoProp method<sup>258,259</sup> starts from canonical orbitals and performs a series of localizations followed by orthogonalizations, leading to atom- and atom pair-centered contributions. While a top-down approach with only post-SCF localization avoids difficulties with a localized SCF implementation, the use of localized charges and dipole moments requires a finite difference approach beyond first derivatives. Several bottom-up approaches, where localized orbitals or subsystems are formed during the SCF iterations, also exist. More closely related to a many-body expansion (MBE) is the fragment molecular orbital (FMO)<sup>260</sup> calculation of frequency-dependent polarizabilities. The use of MBE-derived expressions requires a response calculation for each term in the fragment expansion, where ALMO-based LR solves the equations for all fragments simultaneously. Response equations have also been formulated within subsystem density functional theory (sDFT).<sup>261,262</sup> sDFT requires the use of an additional kinetic energy functional, while ALMObased LR can be used with all common exchange-correlation functionals. A comprehensive adaptation of response equations up to dynamic first and second hyperpolarizabilities  $^{263}$  has been performed with nonorthogonal localized molecular orbitals (NOLMOs).<sup>264</sup> NOLMOs are not connected to an EDA, preventing a property decomposition into EDA-like terms that are the foundation of ALMO-based LR. An attractive fragment-based method designed specifically for the decomposition of molecular interaction energies is symmetry-adapted perturbation theory (SAPT),<sup>265</sup> which is systematically improvable due to its foundations

in perturbation theory. However, because the fragment orbitals are not variationally optimized together (unlike  $\Delta E_{\text{pol}}^{\text{ALMO-EDA}}$ ), the formulation of derivatives even at the uncorrelated monomer approximation (SAPT0) is nontrivial.

The most related methods are those also built on top of ALMOs, specifically ALMO-CIS,<sup>266</sup> ALMO-CIS+CT,<sup>267</sup> TDDFT(MI),<sup>268</sup> and LEA-TDDFT.<sup>269</sup> Compared to ALMO-CIS, our method is more consistent with the index restrictions in TDDFT(MI), and similarly to LEA-TDDFT, we can select individual fragments for allowing charge transfer. For this reason, our method is termed linear response for molecular interactions, or LR(MI).

To this end, we have developed libresponse, a molecular response library for nonorthogonal orbitals and arbitrary operators, in the spirit of the RESPONSE module of DAL-TON.<sup>270</sup> It is capable of both singlet<sup>271</sup> and triplet<sup>272</sup> response for restricted and unrestricted wavefunctions using Hartree–Fock (HF) or density functional theory (DFT). Properties can be calculated using either the full time-dependent Hartree–Fock (TDHF) or random phase approximation (RPA) equations, or with the configuration interaction with singles (CIS) approximation.<sup>273</sup> Our current implementation is limited to linear response and static properties ( $\omega = 0$ ), with both non-linear response and dynamic properties under current development.

#### 5.3 THEORY

For the remainder of the paper, unless otherwise stated, the indices i, j, k, l, ... correspond to unoccupied MOs, a, b, c, d, ... correspond to virtual/unoccupied MOs,  $\mu, \nu, \lambda, \sigma, ...$  correspond to AOs, and I, J, ... correspond to fragments. There is no distinction between canonical MO and ALMO indices. Comma-separated indices such as ia, jb correspond to a matrix with a compound index ia and another compound index jb.

## 5.3.1 Linear response formalism

The linear response of a molecule in its ground state  $|0\rangle$  to perturbations corresponding to operators  $\hat{P}$  and  $\hat{Q}$  can be written as the sum over all excited states  $\{n\}$ ,

$$\left\langle \left\langle \hat{P}; \hat{Q} \right\rangle \right\rangle_{\omega} = -\sum_{n>0} \left[ \frac{\left\langle 0 | \hat{P} | n \right\rangle \left\langle n | \hat{Q} | 0 \right\rangle}{\omega_n - \omega} + \frac{\left\langle 0 | \hat{Q} | n \right\rangle \left\langle n | \hat{P} | 0 \right\rangle}{\omega_n + \omega} \right],\tag{5.5}$$

where  $\omega$  is the frequency of the perturbation  $\hat{Q}$  and  $\omega_n = E_n - E_0$ . Examples of second-order response properties include the polarizability  $(\hat{P} = \hat{Q} = \hat{\mu})$ , magnetizability  $(\hat{P} = \hat{Q} = \hat{m})$ , vibrational frequencies  $(\hat{P} = \hat{Q} = \hat{x})$ , etc. This paper focuses on molecular response within the static limit ( $\omega = 0$ ),

$$\langle\langle \hat{P}; \hat{Q} \rangle\rangle_0 = -\mathrm{Tr}\left\{\mathbf{P}^{\dagger}\mathbf{G}^{-1}\mathbf{Q}\right\} = -\mathrm{Tr}\left\{\mathbf{P}^{\dagger}\mathbf{X}\right\},$$
(5.6)

where  $(\mathbf{P})_{ia} = \langle i | \hat{P} | a \rangle$  and  $(\mathbf{Q})_{ia} = \langle i | \hat{Q} | a \rangle$ .  $\mathbf{X} = \mathbf{G}^{-1}\mathbf{Q}$  is the "response vector" corresponding to orbital rotations induced by perturbation  $\hat{Q}$ . The orbital Hessian matrix  $\mathbf{G}$  is defined as

$${}^{RR}\mathbf{G}^{\sigma} = \mathbf{A}^{\sigma} + \mathbf{B}^{\sigma}$$

$${}^{II}\mathbf{G}^{\sigma} = \mathbf{A}^{\sigma} - \mathbf{B}^{\sigma}$$

$$(5.7)$$

for real (*R*) and imaginary (*I*) perturbations, respectively.<sup>274</sup> The spin case  $\sigma$  can either be singlet ( $\sigma = s$ ) or triplet ( $\sigma = t$ ) depending on whether the perturbation operator conserves or flips spin, respectively:

$$A_{ia,jb}^{s} = \Delta_{ia} + 2(ia|jb) - (ij|ab)$$
  

$$A_{ia,jb}^{t} = \Delta_{ia} - (ij|ab)$$
(5.8)

$$B_{ia,jb}^{s} = 2(ia|jb) - (ib|ja)$$

$$B_{ia,jb}^{t} = -(ib|ja)$$
(5.9)

where  $\Delta_{ia} = (\varepsilon_a - \varepsilon_i)\delta_{ia,jb}$  is an orbital energy difference. The CIS or Tamm-Dancoff approximation (TDA) is recovered when  $\mathbf{B} = \mathbf{0}$ . Rather than directly inverting the orbital

Hessian, which would cost  $\mathcal{O}(o^3v^3)$ , one solves iteratively for **X** by expanding the inverse, for example in the real singlet case

$$X_{ia}^{(n+1)} = \frac{Q_{ia} - [4(ia|jb) - (ij|ab) - (ib|ja)] X_{jb}^{(n)}}{\Delta_{ia}}$$
(5.10)

Repeated indices imply summation (Einstein sum convention). Here, the superscript in parentheses denotes the iteration number. To avoid the expensive transformation of twoelectron repulsion integrals from atomic orbital into molecular orbital basis, one performs the contraction over orbital pair jb in the atomic orbital basis,

$$\left(\mathbf{A}^{s} + \mathbf{B}^{s}\right)_{ia,jb} X_{jb} = C_{\mu i} \left[4(\mu\nu|\lambda\sigma)D_{\lambda\sigma}^{X} - (\mu\lambda|\nu\sigma)D_{\lambda\sigma}^{X} - (\mu\sigma|\lambda\nu)D_{\lambda\sigma}^{X}\right] C_{\nu a}$$
(5.11)

with the perturbed density matrix  $D_{\mu\nu}^X = C_{\lambda j} X_{jb} C_{\sigma b}$ .

To work with non-orthogonal orbitals, we replace the  $\Delta_{ia}^{-1}$  denominator in eq. (5.10) with a full matrix inversion of

$$E_{ia,jb} = F_{ab}S_{ij} - F_{ij}S_{ab}, ag{5.12}$$

where  $\mathbf{F}$  and  $\mathbf{S}$  are the MO-basis Fock and overlap matrix, respectively

## 5.3.2 Adaptation of linear response equations for absolutely localized MOs

The first requirement for adapting the non-orthogonal linear response equations to the ALMO formalism is the projection of the occupied subspace from the virtual subspace. This is because the original fragment-local virtual ALMOs are not orthogonal to occupied ALMOs on other fragments. We form "modified" or "projected" virtual orbitals,

$$|\phi_a\rangle = N_a \left(1 - \hat{D}_{\text{occ}}\right) |\psi_a\rangle$$
 (5.13)

where  $\hat{D}_{\text{occ}} \to (\mathbf{D}_{\text{occ}})_{\mu\nu} = C_{\mu i} C_{\nu i}$ . Otherwise, this contamination would manifest as spurious low-lying excited states, leading to artificial poles in the polarizability. This requirement for projection is unimportant for ground-state SCF(MI) calculations, where the virtual orbitals do not have an effect on the final result (energy). The second requirement is to maintain consistency with the fragment-local nature of SCF(MI), where CT is not allowed. Each occupied-virtual MO contribution to the molecular response is restricted to be within the same fragment. This corresponds to forcing all *ia* (or *jb*) pairs to be zero when  $i \in F_I$ ,  $a \in (F_J \neq F_I)$ . Algorithmically, we do this by always working in the full CT-allowed basis, then zeroing out CT-disallowed matrix elements. For the energy denominator, the zero rows and columns must be removed to avoid introducing artificial singularities. The advantage of working in the full CT basis and zeroing matrix elements is twofold: it prevents code duplication due to no need for separate non-orthogonal and ALMO-based response routines, and it enables selection of individual fragments to quantify their CT contribution to the final response property. This is in contrast to ALMO-CIS+CT,<sup>267</sup> which starts from the reduced CT-disallowed basis and adds a distance-dependent CT correction. An outline of the algorithm is available in the SI.

Perhaps the most important fundamental distinction between our formulation of the ALMO response equations and the ALMO-CIS formulation is in the two-electron contribution, where we restrict MO indices but do not restrict AO indices. This means that for a given  $J^X_{\mu\nu} = (\mu\nu|\lambda\sigma)D^X_{\lambda\sigma}$ , summations run over AO indices on all fragments, and both  $(\mu\nu|\lambda\sigma)$  and  $D^X_{\lambda\sigma}$  for  $\lambda \in F_I, \sigma \in (F_J \neq F_I)$  may be non-zero. Additionally, AO indices cannot be restricted due to the projection in eq. (5.13), where each MO can have contributions from all AOs.

In principle, the ALMO formulation presented here can be extended to arbitrary-order response, as long as each compound *ia* index is constrained to be within a fragment.

## 5.3.3 Decomposition of linear response properties into local contributions and interaction mechanisms

As with other localized orbital schemes, there is a question of how to define charge transfer. Our implementation allows for the introduction of CT in several stages. This allows for further decomposition of the CT term into qualitative contributions from individual fragments. This is done by starting from the polarized SCF(MI) wavefunction and allowing transitions between the occupied space of a single fragment into the virtual space of all fragments. This can be denoted as "frz + pol + CT( $F \rightarrow all$ )", where F is an individual fragment. The difference between this result and "frz + pol" can be viewed as how important CT is for that specific fragment F. From the symmetry-adapted perturbation theory<sup>275</sup> perspective, it can also be viewed as a BSSE correction; the larger the difference, the more deficient the fragment-localized basis is. CT can also be allowed during the response calculation even if it was not during the wavefunction calculation; this corresponds to performing non-orthogonal response with no restrictions using the polarized SCF(MI) wavefunction, represented as "frz + pol + CT(all  $\rightarrow$  all) [blocked]". The sum over all fragments should be qualitatively equal to "frz + pol + CT(all  $\rightarrow$  all) [blocked]", though it will not be exactly equal due to higher-order effects, similar to the  $\Delta E_{\rm CT}^{\rm HO}$  term in ALMO-EDA. Finally, "frz + pol + CT(all  $\rightarrow$  all) [blocked]" corresponds to an unrestricted response calculation on top of the fully-relaxed SCF wavefunction, analogous to a supersystem calculation. The difference between the blocked result and the supersystem result shows the effect of allowing CT in the underlying wavefunction.

This multi-step decomposition of the CT term is similar to our previous work on the effect of CT on the vibrational spectra of  $CO_2$  in ionic liquids.<sup>27,276</sup> Being able to turn CT on and off during the geometry optimization and numerical Hessian calculation allowed us to see how CT contributes to the potential energy surface at multiple stages, but our analytic formulation of the response equations has significant advantages. It enables the identification of fragment-specific contributions to the total response, which is not possible in a numerical response calculation, even with an underlying SCF(MI) wavefunction. This is in addition to all the other advantages of solving analytic rather than numerical equations, namely calculation time, uncoupled and perturbative approximations to fully iterative results, lack of finite-difference error, frequency-dependent perturbations, and response to applied magnetic fields without complex energies; see ref. [1] for a discussion.

Borrowing terminology from ref. [276], CT may enter the response calculation through multiple mechanisms. We consider two: the "wavefunction mechanism", where CT is (dis)allowed during the SCF iterations, corresponding to either an SCF(MI) or a canonical SCF calculation, and the "response mechanism", where CT is (dis)allowed during the response calculation by restricting occupied-virtual MO contributions to be within fragments as discussed in section 5.3.2. This results in four principal permutations of (dis)allowing CT effects, abbreviated as "a/b", where a represents the wavefunction mechanism, b represents the response mechanism, and  $a, b \in \{\text{on, off}\}$ :

- "on/on" is a standard response calculation, and is the "frz + pol + CT(all  $\rightarrow$  all) [super]" result.
- "off/off" is the most consistent with SCF(MI) and TDDFT(MI), and is the "frz + pol" result.
- "off/on" attempts to recover CT effects during the response calculation that are missing from the underlying SCF(MI) wavefunction, and is the "frz + pol + CT(all → all) [blocked]" result. This is not the same as the single perturbative Roothaan step (RS) correction in SCF(MI), but is a fully-iterative response calculation on top of ALMOs.
- "on/off" corresponds to allowing CT during SCF iterations but not the response calculations. This decomposition is not considered, as neither the occupied nor the virtual canonical orbitals can generally be assigned to specific fragments.

For the purposes of this work, we also do not consider the effect of disallowing CT during geometry optimization through the "geometry mechanism", though in principle it is technically feasible and potentially non-negligible. See ref. [277] for an in-depth analysis of the different potential energy surfaces that comprise ALMO-EDA. Neglecting the geometry mechanism means our approach is consistent with a vertical decomposition rather than an adiabatic one.

## 5.4 METHODS

HF was used for all calculations as a proof of concept to avoid spurious overdelocalization and CT effects due to self-interaction error. As a result, it should provide a lower bound on any possible CT effects during the SCF(MI) calculation. For basis sets, we chose the Karlsruhe def2- family,<sup>278,279</sup> in particular def2-SVP and def2-SVPD. It is well-known that the original ALMO procedure has a strong basis-set dependence, with overestimation of  $\Delta E_{\rm pol}$  and underestimation of  $\Delta E_{\rm CT}$  due to the overlapping tails of AOs on different fragments, allowing electron density to "leak" across fragments during SCF(MI).<sup>280</sup> As a result, there is no clear basis set limit to  $\Delta E_{\rm pol}$ . This informs our basis set choices, which should give qualitatively correct results within the original ALMO definition, with a check on minimal augmentation optimized for use in electric field response calculations.

For a test property, we chose the static dipole polarizability, defined as

$$\alpha_{ab}(0) = -\left\langle \left\langle \hat{\mu}_a; \hat{\mu}_b \right\rangle \right\rangle_0 = -\left. \frac{\partial^2 E}{\partial \varepsilon_a \partial \varepsilon_b} \right|_{\varepsilon_a, \varepsilon_b = 0},\tag{5.14}$$

where  $a, b \in \{x, y, z\}$  and the energy derivative method based on derivatives with respect to applied electric fields  $\varepsilon$  is equivalent to the linear response calculation.

For a test system, the argon—lithium cation dimer, Ar····Li<sup>+</sup>, was chosen due to the reasonable polarizability of the bare (closed-shell) argon atom, which should be quantitatively influenced by the almost unscreened nuclear charge of the lithium cation. The optimized distances are 2.4106 Å using def2-SVP and 2.4297 Å using def2-SVPD. For the distance dependence results, points are spaced at 0.05 Å from 1.25 to 5.00 Å, then spaced at 0.25 Å from 5.00 to 10.00 Å.

All calculations were performed using a development version of Q-CHEM<sup>93</sup> compiled with **libresponse**, our generalized non-orthogonal molecular response library. Thresholds were set to  $10^{-14}$  for integral screening,  $10^{-11}$  for the DIIS error norm in SCF convergence, and  $10^{-8}$  for the DIIS error norm in the analytic response iterations. The Stoll projector equations were used for minimizing the underlying SCF(MI) wavefunction.<sup>100,281</sup> For numerical polarizability calculations, 2nd-order finite difference from energies was used, unless otherwise stated, as differences between 1st- and 2nd-order results were below  $10^{-7} a_0^3$  in all cases. Both 1st- and 2nd-order finite difference polarizability calculations used a finite field step size of  $1.88973 \times 10^{-5} a_0^3$ . All SCF(MI) analytic polarizability calculations use projected virtual orbitals as defined by eq. (5.13).

	analytical			numerical		
def2-SVP	$\alpha_{\perp}$	$lpha_{\parallel}$	$\alpha_{\rm iso}$	$lpha_{\perp}$	$lpha_{\parallel}$	$\alpha_{\rm iso}$
monomer A (Ar)	4.3702	4.3702	4.3702	4.3702	4.3702	4.3702
monomer B (Li <sup>+</sup> )	0.1593	0.1593	0.1593	0.1593	0.1593	0.1593
A + B	4.5295	4.5295	4.5295	4.5295	4.5295	4.5295
frz + pol	4.5042	4.5581	4.5222	4.5036	4.5696	4.5256
$+ CT(A \rightarrow all)$	4.7040	5.5191	4.9757			
$+ CT(B \rightarrow all)$	0.1594	0.1586	0.1591			
+ CT(all $\rightarrow$ all) [blocked]	4.8409	5.7540	5.1452			
+ CT(all $\rightarrow$ all) [super]	5.2142	7.8649	6.0978	5.2142	7.8649	6.0978

Table 29: Polarizability results for the argon—lithium cation dimer at the HF/def2-SVP level. The geometry is optimized at the same level. All values have units of  $a_0^3$ .

## 5.5 RESULTS AND DISCUSSION

### 5.5.1 Equilibrium distance

Tables 29 and 30 show equilibrium distance results for the argon—lithium cation dimer at the HF/def2-SVP and HF/def2-SVPD levels, respectively. Due to molecular symmetry, two of the three polarizability tensor principal components are identical; these correspond to the perpendicular polarizability  $\alpha_{\perp}$ , or how easy it is to shift the electron density perpendicular to the interatomic axis. The parallel polarizability  $\alpha_{\parallel}$  corresponds to the principal component that lies along the axis of interaction between the two atoms and corresponds to the bond polarizability. Monomer A and B refer to the isolated atoms; parallel and perpendicular axes have no meaning here due to their spherical symmetry, as all principal components are identical. An approximation to the frozen density interaction in response is the sum of the response of the isolated fragments (atoms), shown as "A + B". Note that this is not the true frozen monomer response.<sup>277</sup> "frz + pol" is where CT is disallowed between fragments

		analytical	l	numerical		
def2-SVPD	$lpha_{\perp}$	$lpha_{\parallel}$	$\alpha_{\rm iso}$	$lpha_{\perp}$	$lpha_\parallel$	$\alpha_{\rm iso}$
monomer A (Ar)	10.3735	10.3735	10.3735	10.3735	10.3735	10.3735
monomer B $(Li^+)$	0.1603	0.1603	0.1603	0.1603	0.1603	0.1603
A + B	10.5338	10.5338	10.5338	10.5338	10.5338	10.5338
frz + pol	10.0787	10.6399	10.2658	10.0875	10.6599	10.2783
$+ \operatorname{CT}(A \to \operatorname{all})$	10.0157	10.4900	10.1738			
$+ CT(B \rightarrow all)$	0.1606	0.1614	0.1609			
+ CT(all $\rightarrow$ all) [blocked]	10.1395	10.8004	10.3598	_	_	
+ CT(all $\rightarrow$ all) [super]	10.0724	11.0645	10.4031	10.0724	11.0645	10.4031

Table 30: Polarizability results for the argon—lithium cation dimer at the HF/def2-SVPD level. The geometry is optimized at the same level. All values have units of  $a_0^3$ .

using the algorithm described above, consistent with the original SCF(MI) and conceptually analogous to TDDFT(MI). The remaining entries are those described in section 5.3.3.

5.5.1.1 Validation of analytic ALMO results As a correctness check, our analytic formulation is validated against finite-field calculations in the last three columns. An advantage of the analytic formulation is the ability to further decompose the CT term; it is not possible to perform the "CT(A  $\rightarrow$  all)", "CT(B  $\rightarrow$  all)", and "CT(all  $\rightarrow$  all) [blocked]" calculations with a finite-field approach. For both basis sets presented, there is no quantitative difference between the analytic and numerical polarizabilities except for "frz + pol". This should not be interpreted as an error, since our definition of the response equations differs from the no-CT formulation presented by ALMO-CIS, and there is a slight delocalization of the virtual space due to the projection (see section 5.6). Still, the largest percent difference is 0.25% and 0.19% in  $\alpha_{\parallel}$  for def2-SVP and def2-SVPD, respectively, showing our definition should be valid as long as the ALMO approximation holds.

Table 31: Percentage changes in  $\alpha_{\parallel}$  due to the two CT mechanisms. The reference (denominator) polarizability used is shown in *italics*. All calculations used a bond length of 2.4297 Å.

	bas	is set
percentage change due to mechanism	def2-SVP	def2-SVPD
response ( $off/on - off/off$ )	20.8	1.5
wavefunction $(on/on - off/on)$	26.8	2.4

**5.5.1.2 CT mechanism analysis** From tables 29 and 30, the importance of charge transfer via both the wavefunction and response mechanisms can be calculated as the difference between "frz + pol", "CT(all  $\rightarrow$  all) [blocked]", and "CT(all  $\rightarrow$  all) [super]"; these are "off/off", "off/on", and "on/on", respectively. The effect of each mechanism is shown in table 31.

For def2-SVP, it is clear that each successive relaxation of CT restrictions has a nonnegligible effect on the final property, where  $\alpha_{\parallel}^{\text{frz} + \text{pol}}$  is 58.0% and 96.2% of the supermolecular value for the two basis sets. This representation makes it clear that in addition to larger polarizabilities (~ 2×), there are other fundamental differences caused by the use of diffuse functions in def2-SVPD.

Calculated this way, the wavefunction mechanism may include some higher-order effects, as the pure wavefunction mechanism, calculated as "on/off" - "off/off", cannot be isolated due to the "on/off" term (see section 5.3.3). The size of these higher-order effects in the wavefunction can be estimated by the percent contribution of higher-order effects in ALMO-EDA charge transfer, shown in table 32.

Using the uncorrected results for consistency, the new estimates of percentage changes due to the wavefunction mechanism become 20.3% and 2.0%, showing the presence of CT in the underlying wavefunction and in the response calculation are equally important in predicting molecular properties.

	basis set			
BSSE corrected?	def2-SVP	def2-SVPD		
no	24.2	17.1		
yes	25.0	19.4		

Table 32: Percentage of ALMO-EDA charge transfer due to higher-order effects, calculated as  $100 * \frac{\Delta E_{\rm CT}^{\rm HO}}{\Delta E_{\rm CT}^{\rm RS} + \Delta E_{\rm CT}^{\rm HO}}$ . All calculations used a bond length of 2.4297 Å.

5.5.1.3 Basis set dependence The results in table 31 show that charge transfer, or electron delocalization across fragments, is relatively unimportant when using the diffuse basis set. This may be indicative of either basis set incompleteness or overlap between the tails of the diffuse basis functions (see section 5.4). The former argument is supported by the BSSE term being 50% of the total CT term with def2-SVP but only 18% with def2-SVPD, while the latter argument is supported by a doubling of  $\Delta E_{\text{pol}}$  from -3.3 to -6.6 kcal mol<sup>-1</sup> when adding the diffuse functions (see the SI for all ALMO-EDA results).

To investigate these effects directly on the polarizability, rather than through an EDA, table 33 shows the decoupled effect of the nuclear charge and basis functions provided by the lithium cation on the argon. Since the lithium cation is not very polarizable ( $\alpha^{\text{Li}^+}$  is  $\approx 4\%$  of  $\alpha^{\text{Ar}}$  at the HF/def2-SVP level), only effects on the argon atom are considered. Also presented are the lowest singlet and triplet excitation energies calculated using RPA (TD-HF). Percentages of each value compared to the full Ar····Li<sup>+</sup> result within each basis set are shown in the SI.

In order to test the importance of nuclear charge without the influence of basis functions, the "PC(+)" and "PC(-)" entries represent replacing the lithium atom with positive and negative point charges of unit magnitude, respectively. To test the importance of the basis set without the influence of a nuclear charge, "Gh(Li)" represents replacing the full lithium atom with only its basis functions, leaving a "ghost atom" with no (effective) nuclear charge. This should separate the Ar·····Li<sup>+</sup> interaction into a purely electrostatic effect from the nucleus, a delocalization-like effect due to increased spatial flexibility for motion of electrons during SCF and response iterations, and some non-additive effects.

As expected, compared to a bare argon atom, the presence of a ghost function both increases the polarizability and decreases the first excitation energy. Intuitively, there are now additional molecular orbitals within reasonable spatial distance that electron density can spread on to as part of the ground-state calculation and can be excited to as part of the excited-state calculation. The difference is much less pronounced for the diffuse basis, where it is the presence of point charges that has the larger effect. This indicates that there is overlap with the tails of only the additional diffuse basis functions at the distance of the lithium center, and is caused by basis set incompleteness present even at the canonical SCF level. The point charges are in comparatively empty space in the non-diffuse basis, and the ghost function is unimportant for the diffuse basis. There,  $\alpha_{\parallel}^{PC(+)} \gg \alpha_{\parallel}^{Ar\cdots Li^+}$  due to electron screening on the lithium atom, which leads to a reduced effective nuclear charge that is less capable of polarizing the argon atom.

As further confirmation that any basis set effects are not due to a breakdown in the original ALMO formulation, we performed ALMO-EDA calculations where the polarization term does not suffer from CT contamination and has a well-defined basis set limit.<sup>282</sup> With this second-generation EDA, the CT energy increases by only  $10^{-4}$  kcal mol<sup>-1</sup> in both basis sets. Since there is no mixing of one fragment's ALMOs into the other due to overlapping AO tails, these differences are true basis set effects as long as the fragment electron densities are not penetrating each other.

### 5.5.2 Distance dependence

An extension of the validation in section 5.5.1.1 is to compare our analytic implementation of "ALMO frz + pol" with finite field calculations using both energies and dipole moments as a function of interatomic distance. Short-range results for both basis sets are presented in figure 30. Only at shorter than equilibrium distances is there visible deviation between the analytic and numerical "ALMO frz + pol" results, most likely due to the virtual space delocalization. However, this is near the region where the electron clouds of the two atoms

Table 33: Decomposition of polarizabilities into point charge and basis function contributions. All calculations used canonical MOs and a distance of 2.4297 Å from argon to the other center(s).

basis set	structure	$\alpha_{\perp}$ (a.u.)	$\alpha_{\parallel}$ (a.u.)	$\bar{\alpha}$ (a.u.)	${}^{\mathrm{t}}E_{0 \to \mathrm{lowest}}^{\mathrm{RPA}}$ (eV)	${}^{\mathrm{s}}E^{\mathrm{RPA}}_{0 \to \mathrm{lowest}} \ \mathrm{(eV)}$
def2-SVP	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(-)$	4.38	4.35	4.37	23.26	25.09
def2-SVP	Ar	4.37	4.37	4.37	23.69	25.50
def2-SVP	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(+)$	4.36	4.38	4.37	23.42	25.24
def2-SVP	$\mathrm{Ar}\mathrm{\cdots}\mathrm{Gh}(\mathrm{Li})$	4.89	6.23	5.34	12.26	12.58
def2-SVP	$\mathrm{Ar}\mathrm{\cdots}\mathrm{Li}^+$	5.21	7.88	6.10	11.90	12.18
def2-SVPD	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(-)$	10.94	10.33	10.74	10.92	11.68
def2-SVPD	Ar	10.37	10.37	10.37	12.61	13.22
def2-SVPD	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(+)$	10.04	11.94	10.67	9.90	10.48
def2-SVPD	$\mathrm{Ar}\mathrm{\cdots}\mathrm{Gh}(\mathrm{Li})$	10.39	10.42	10.40	12.05	12.41
def2-SVPD	$\mathrm{Ar}\mathrm{\cdots}\mathrm{Li}^+$	10.07	11.06	10.40	11.98	12.34

penetrate each other, and  $\Delta E_{\rm frz}$  is an order of magnitude larger than either  $\Delta E_{\rm pol}$  or  $\Delta E_{\rm CT}$  due to Pauli repulsion, so this difference does not detract from the accuracy of the analytic implementation.

Figure 31 shows how the different forms of CT restriction vary as a function of interatomic distance. Similar to the counterpoise (CP) correction for interaction energies, the "BSSE-corrected canonical" polarizability for two monomers A and B is defined as

$$\alpha^{\text{BSSE-corrected}} = \alpha^{AB}(AB) - \left[ \left( \alpha^A(AB) - \alpha^A(A) \right) + \left( \alpha^B(AB) - \alpha^B(B) \right) \right], \tag{5.15}$$

where, for example,  $\alpha^A(AB)$  is the polarizability of monomer A in the combined (supermolecular) basis of both monomers.

The difference from the BSSE correction is large in def2-SVP but negligible in def2-SVPD, confirming our results from section 5.5.1.3. For both basis sets, the argon polarizability is the major contributor, provided that the entire dimer basis virtual space is available. The difference between the argon and blocked ALMO curves is due to the small but non-zero polarizability of the lithium cation, plus a mutual or higher-order polarization effect that appears at shorter than equilibrium distances for def2-SVP. Most notably, there is a quantitative difference between the blocked ALMO and canonical results even with def2-SVPD, showing that the wavefunction mechanism is large, and only allowing CT during the response calculation cannot recover these effects.

## 5.6 CONCLUSIONS AND FUTURE WORK

We have presented an implementation of linear response molecular properties for ALMOs, along with a decomposition of charge transfer effects, applied to a system with a substantial CT interaction. We discovered that for the static polarizability, charge transfer plays an equally important role in the response calculation as it does in the underlying wavefunction. Additionally, our results confirm that the ALMO and LR(MI) approximations are valid as long as the basis set is not deficient for the system, as is the case with def2-SVP.

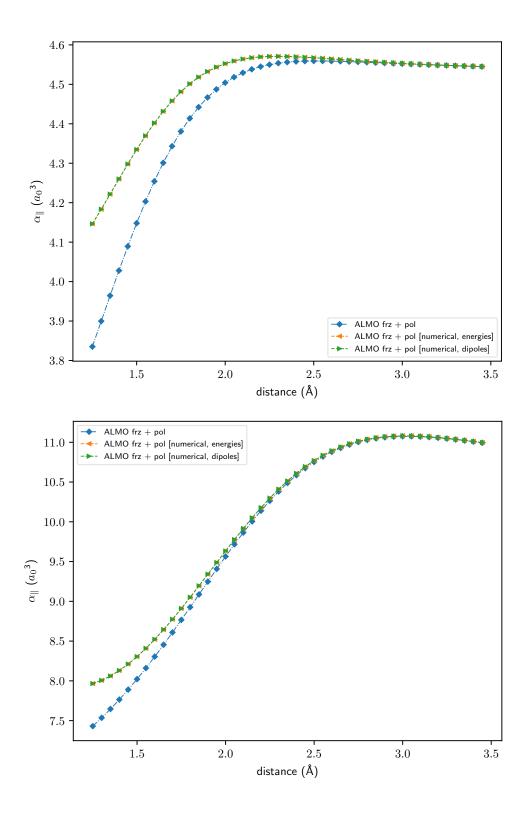


Figure 30: Distance dependence of analytic and numerical ALMO polarizabilities for both basis sets.

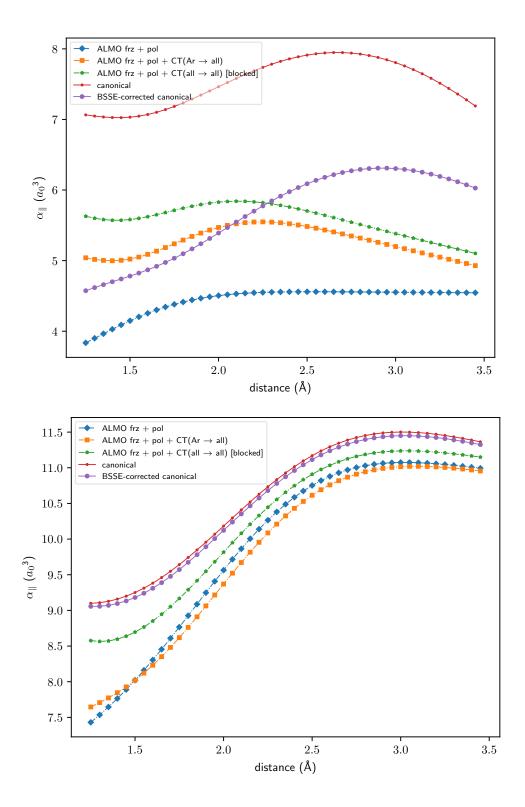


Figure 31: Distance dependence of CT restrictions on polarizabilities for both basis sets.

A question not addressed in this work or other ALMO-based work on excitation energies<sup>266,268</sup> is the effect of non-locality on the projected virtual space. To properly assign fragment-localized contributions to molecular response, both the occupied and virtual AL-MOs must be spatially localized to individual fragments. Projecting the occupied space out of the virtual space ensures occupied-virtual orthogonality between fragments, but removes the fragment locality of the virtual space; that is, each virtual MO can no longer be uniquely assigned to a specific fragment. However, we expect that the error introduced by a delocalized virtual space is small compared to the error from using unprojected orbitals, which are less representative of the true potential energy surface for the reasons discussed in section 5.3.2. Future work will use LoProp-type approaches on top of projected ALMOs to investigate the magnitude of these effects. In this way, LR(MI) can be a sensitive test for how modification of the virtual space affects molecular properties.

Our development of a library for calculating molecular response properties of arbitrary operators with non-orthogonal orbitals opens many doors for future development. libresponse is available in Q-CHEM 5.0.2 and at https://github.com/LambrechtLab/libresponse under the 3-clause BSD license as an Armadillo-based<sup>283</sup> C++ library. It can also be used as a PSI4<sup>284</sup> plugin.

## 5.7 ACKNOWLEDGEMENTS

E.J.B. thanks Q-CHEM for a summer internship opportunity, Evgeny Epifanovsky for help with the initial DIIS implementation, and cclib<sup>285,286</sup> for the analysis framework.

## 5.8 SUPPORTING INFORMATION

ALMO-EDA results and analysis, additional ghost basis and point charge analysis, additional distance dependence results, sample input files, pseudocode for algorithm.

As a sanity check for all results, we expect certain physical behavior over the range of

	basis set			
ALMO-EDA term	def2-SVP	def2-SVPD		
$\Delta E_{\rm frz}$	1.20	2.18		
$\Delta E_{\rm pol}$	-3.32	-6.61		
$\Delta E_{\rm del}^{\rm RS}$	-4.07	-0.89		
$\Delta E_{\rm BSSE}^{\rm RS}$	1.38	0.16		
$\Delta E_{\rm CT}^{\rm RS}$	-2.69	-0.74		
$\Delta E_{\rm int}^{\rm RS}$	-4.81	-5.17		
$\Delta E_{\rm del}^{ m SCF}$	-5.38	-1.08		
$\Delta E_{\mathrm{BSSE}}^{\mathrm{SCF}}$	1.79	0.16		
$\Delta E_{\mathrm{CT}}^{\mathrm{SCF}}$	-3.59	-0.91		
$\Delta E_{\rm int}^{ m SCF}$	-5.70	-5.35		
$\Delta E_{\rm HO}^{\rm SCF}$	-0.90	-0.18		

Table 34: ALMO-EDA results. Energy units are kcal mol<sup>-1</sup>. All calculations used Hartree–Fock with a bond length of 2.4297 Å.

Table 35: Analysis of ALMO-EDA terms from table 34.

	basis set		
	def2-SVP	def2-SVPD	
$\Delta E_{\rm pol} + \Delta E_{\rm CT}^{\rm RS} \; (\rm kcal/mol)$	-6.01	-7.34	
$\Delta E_{\rm pol} + \Delta E_{\rm CT}^{\rm SCF}$ (kcal/mol)	-6.91	-7.52	
100 * $\Delta E_{\mathrm{BSSE}}^{\mathrm{RS}}$ / $\Delta E_{\mathrm{CT}}^{\mathrm{RS}}$ (%)	-51.4	-21.2	
100 * $\Delta E_{\mathrm{BSSE}}^{\mathrm{SCF}}$ / $\Delta E_{\mathrm{CT}}^{\mathrm{SCF}}$ (%)	-49.9	-17.7	
100 * $\Delta E_{\rm CT}^{\rm RS}$ / ( $\Delta E_{\rm pol} + \Delta E_{\rm CT}^{\rm RS}$ ) (%)	44.8	10.0	
100 * $\Delta E_{\rm CT}^{\rm SCF}$ / ( $\Delta E_{\rm pol} + \Delta E_{\rm CT}^{\rm SCF}$ ) (%)	51.9	12.2	

.

Table 36: Percentage of supermolecular result for point charge and ghost function polarizabilities. All calculations used Hartree–Fock with canonical MOs and a distance of 2.4297 Å from argon to the other center(s).

basis set	structure	$\alpha_{\perp}$	$lpha_\parallel$	$\bar{\alpha}$	${}^{\mathrm{t}}E_{0 \to \mathrm{lowest}}^{\mathrm{RPA}}$	${}^{\mathrm{s}}E_{0 \to \mathrm{lowest}}^{\mathrm{RPA}}$
def2-SVP	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(-)$	84.1	55.2	71.6	195.5	206.0
def2-SVP	Ar	83.9	55.5	71.6	199.1	209.4
def2-SVP	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(+)$	83.7	55.6	71.6	196.8	207.2
def2-SVP	$\mathrm{Ar}\mathrm{\cdots}\mathrm{Gh}(\mathrm{Li})$	93.9	79.1	87.5	103.0	103.3
def2-SVPD	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(-)$	108.6	93.4	103.3	91.2	94.7
def2-SVPD	Ar	103.0	93.8	99.7	105.3	107.1
def2-SVPD	$\mathrm{Ar}\mathrm{\cdots}\mathrm{PC}(+)$	99.7	108.0	102.6	82.6	84.9
def2-SVPD	$\mathrm{Ar}\mathrm{\cdot\cdot\cdot}\mathrm{Gh}(\mathrm{Li})$	103.2	94.2	100.0	100.6	100.6

interatomic distances. In particular, as the interatomic distance approaches the limit of infinite separation,

- The canonical SCF, numerical SCF(MI), and analytic SCF(MI) results all converge to the same value, which is the sum of polarizabilities the two isolated atoms. CT appears to be an important contributor until approximately 5 Å, where the decay behavior of the canonical SCF changes.
- The point charge, and "frz + pol +  $CT(Ar \rightarrow all)$ " results all converge to the same value, which is the polarizability of the isolated argon atom.

## 5.8.1 Input files

Listing 1: Sample Q-CHEM input file for "ALMO frz + pol" polarizability. Geometry is from HF/def2-SVPD.

1 \$rem

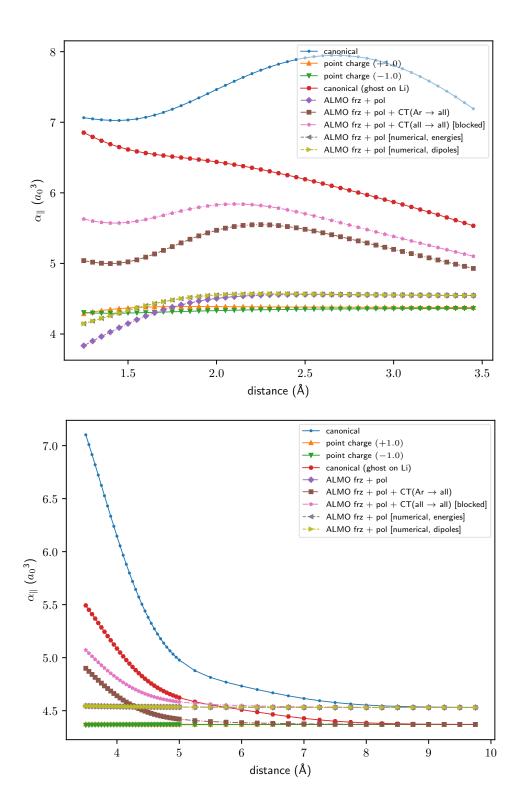


Figure 32: Short- and long-range interatomic separation dependence of the static polarizability parallel to the coordination axis. All calculations are at the HF/def2-SVP level.

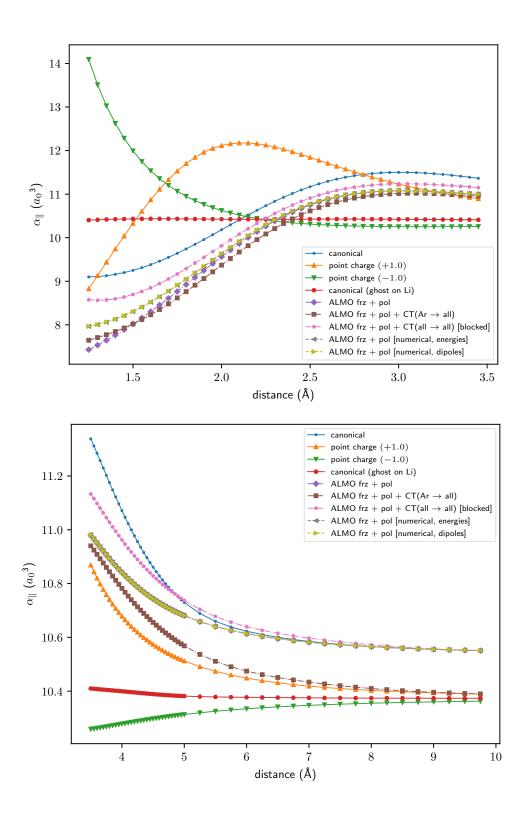


Figure 33: Short- and long-range interatomic separation dependence of the static polarizability parallel to the coordination axis. All calculations are at the HF/def2-SVPD level.

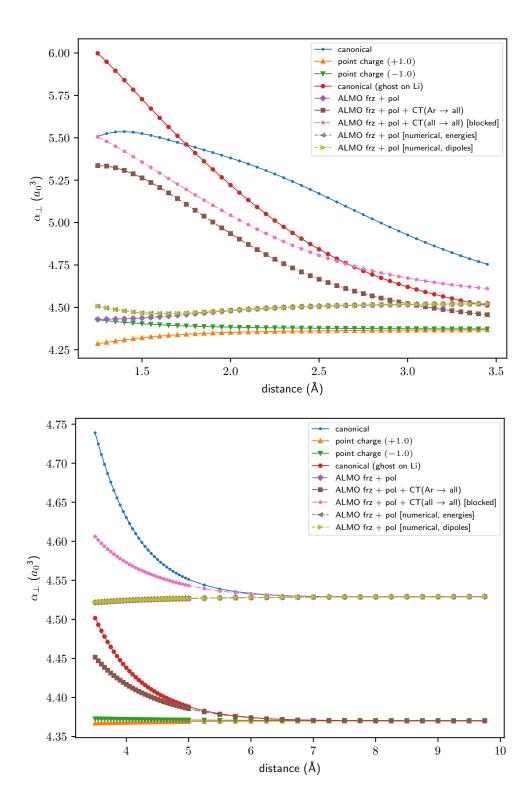


Figure 34: Short- and long-range interatomic separation dependence of the static polarizability perpendicular to the coordination axis. All calculations are at the HF/def2-SVP level.

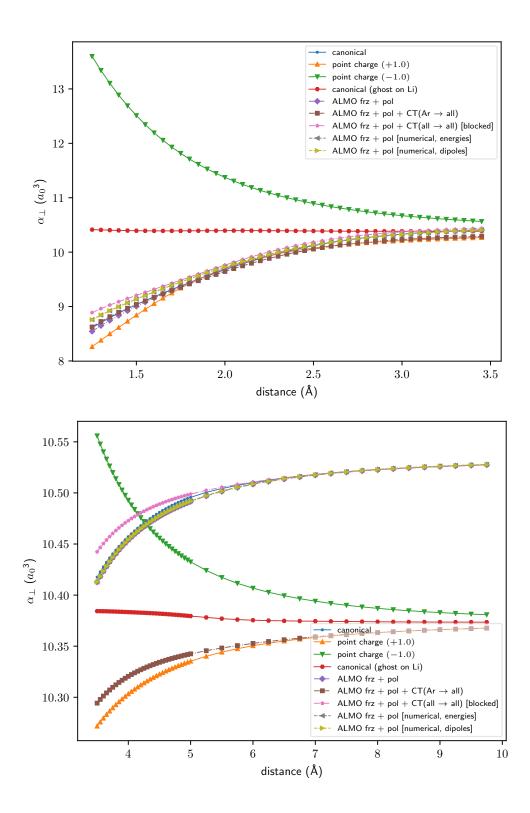


Figure 35: Short- and long-range interatomic separation dependence of the static polarizability perpendicular to the coordination axis. All calculations are at the HF/def2-SVPD level.

```
\mathbf{2}
     jobtype = polarizability
     method = hf
3
     basis = def2-svpd
4
     scf_convergence = 11
\mathbf{5}
     thresh = 14
\mathbf{6}
     scf_max_cycles = 1000
7
     symmetry = false
8
     sym_ignore = true
9
     cc_symmetry = false
10
     scf_print_frgm = false
11
     frgm_method = stoll
12
     frgm_lpcorr = 0
13
   $end
14
15
   $response
16
     solver = diis
17
     maxiter = 1000
18
     conv = 8
19
      _almo_do_virt_relocalization = false
20
      _almo_project_virts = true
^{21}
      _frgm_response_idx = 0
22
23
      _mask_rhsvec_mo = true
     _mask_rspvec_guess_mo = true
24
     _mask_product_mo = true
25
      _mask_ediff_mo = true
26
      _mask_rspvec_mo = true
27
^{28}
     _mask_form_results_mo = true
   $end
29
30
   $molecule
31
   1 1
32
   --
33
   0 1
34
   Ar
           0.0000000000000000
                                    0.0000000000000000
                                                           -0.857713330500000
35
   ___
36
   1 1
37
   Li
           0.00000000000000000
                                    0.000000000000000
                                                            1.571999044800000
38
   $end
39
```

Using the template from listing 1:

- To perform the "ALMO frz + pol + CT(all → all) [blocked]" calculations, set \_frgm\_response\_idx = 0 and all \_mask\_\* options to false.
- To perform the "ALMO frz + pol + CT(Ar → all)" calculations, set \_frgm\_response\_idx = 1 and all \_mask\_\* options to true.

Listing 2: Sample Q-CHEM input file for first-generation ALMO-EDA. Geometry is from

HF/def2-SVPD.

```
$rem
1
\mathbf{2}
     jobtype = eda
     method = hf
3
     basis = def2-svpd
4
     scf_convergence = 11
\mathbf{5}
     thresh = 14
6
     scf_max_cycles = 1000
7
     symmetry = false
8
     sym_ignore = true
9
     cc_symmetry = false
10
     scf_print_frgm = false
11
     frgm_method = stoll
12
     frgm_lpcorr = rs_exact_scf
13
     eda_bsse = true
14
   $end
15
16
   $molecule
17
   1 1
18
   ___
19
   0 1
20
           0.000000000000000
                                  0.000000000000000
                                                         -0.857713330500000
   Ar
21
22
   ___
   1 1
23
           0.0000000000000000
   Li
                                                          1.571999044800000
^{24}
  $end
25
```

Listing 3: Sample Q-CHEM input file for second-generation ALMO-EDA. Geometry is from

```
HF/def2-SVP.
```

```
$rem
1
     method = hf
\mathbf{2}
     basis = def2-svpd
3
     scf_convergence = 11
4
     thresh = 14
5
     scf_max_cycles = 1000
6
     symmetry = false
7
     sym_ignore = true
8
     cc_symmetry = false
9
     scf_print_frgm = false
10
     gen_scfman = true
11
     frgm_method = stoll
12
     frgm_lpcorr = rs_exact_scf
13
     eda2 = 1
14
   $end
15
16
   $molecule
17
   1 1
18
   ___
19
   0 1
20
   Ar
           0.00000000000000
                                  0.000000000000000
                                                        -0.848158037800000
21
```

## 5.8.2 Algorithm description

Algorithm 1/2 is the general outline of the LR(MI) procedure, without convergence acceleration. The key difference between our implementation and a general CPHF solver is the zeroing of vector and matrix elements. Again, any contraction between *ia* or *ia*, *jb* indices may be restricted, but transformations from  $\mu\nu$  to *ia* are not.

Missing from this example is the formation of  $\mathbf{A}, \mathbf{B}$ , and the prefactor in the equation for real/imaginary operators. A difference from the paper equations in the implementation is that rather than take a single  $\hat{P}$  and single  $\hat{Q}$ , a list of operators is passed. For example, if **operators** =  $[\hat{\mu}, \hat{m}]$ , then  $\langle\langle \hat{\mu}; \hat{\mu} \rangle\rangle$ ,  $\langle\langle \hat{\mu}; \hat{m} \rangle\rangle$ , and  $\langle\langle \hat{m}; \hat{m} \rangle\rangle$  will automatically be formed. Another implementation detail is that each operator carries its own property gradient vectors (the occ-virt MO basis integrals for the right-hand side) and perturbed response vectors, and each operator carries information about whether it is real/imaginary and spin conserving/altering.

Algorithm 1 Static linear response approach within fragment-localized formalism.

Algorithm 1 Static mear response approach within na	gment-localized formalism.
1: <b>procedure</b> SOLVE_LINEAR_RESPONSE(resp, operato	ors, occupations, $\mathbf{C}, \mathbf{F}, \mathbf{S}, \vartheta$ , maxiter,
allow_ct?)	
2: for $s \leftarrow 1, N_{spin}$ do	
3: Transformation of $\mathbf{F}$ and $\mathbf{S}$ from AO to full N	
5 5 5	orthogonal orbital energy matrix $\mathbf{E}$
5: if not allow_ct? then	
6: Zero cross-fragment $ia$ indices and shrink	dimensions of $\mathbf{E}$
7: end if	
8: Form inverse for denominator $\mathbf{E}^{-1}$	
9: end for	
10: for $i \leftarrow 1, N_{operators}$ do	
11: <b>for</b> $c \leftarrow 1, N_{components}$ <b>do</b>	
12: $(\mathbf{Z})_{\mu\nu} \leftarrow \text{operators}[i, c, \mu\nu]  \triangleright \text{ Select operators}[i]$	ator component as perturbation for
right-hand side	
13: Transform operator component from AO	to occ-virt MO basis and append
$\mathbf{Z}_{ia}$ to rhsvecs	
14: <b>if</b> not allow_ct? then	in heimen sienen af <b>7</b>
15: Zero cross-fragment <i>ia</i> indices and shri	INK dimensions of Z
16: end if $\mathbf{V}^{(0)}$ ( 0 ) Forms initial energy for	non-ongo wester (uncourled regult)
17: $\mathbf{X}^{(0)} \leftarrow 0 \qquad \triangleright \text{ Form initial guess for}$	response vector (uncoupled result)
18: $converged \leftarrow false$	
19: <b>for</b> $n \leftarrow 1, maxiter$ <b>do</b> 20: $D^X_{\mu\nu} \leftarrow C_{\mu i} X^{(n-1)}_{ia} C_{\nu a}$	▷ Form perturbed density
$-\dot{V} = V$ $-V$ $-V$	
21: $J^{A}_{\mu\nu} [\mathbf{D}^{A}], K^{A}_{\mu\nu} [\mathbf{D}^{A}] \leftarrow fock\_build(\mathbf{D}^{A})$	) > Form Coulomb and exchange
22: $(\mathbf{R}^{(n)})_{\mu\nu} \leftarrow 4\mathbf{J}^X - \mathbf{K}^X - (\mathbf{K}^X)^T$	▷ Form half-transformed orbital
Hessian-vector product (here, $\mathbf{G} = \mathbf{A}^s + \mathbf{B}^s$ )	$(\mathbf{p})^{(n)}$
23: Do second transformation of Hessian-v	ector product $(\mathbf{R})_{ia}^{(a)}$
24: if not allow_ct? then	
25: Zero cross-fragment $ia$ indices and	SITTICE dimensions of $\mathbf{K}, \mathbf{A}$
26: end if $\mathbf{V}^{(n)}$ , $(\mathbf{F}^{-1})$ $\begin{bmatrix} \mathbf{Z} & \mathbf{D}^{(n)} \end{bmatrix}$	N Undata regrange water
27: $X_{ia}^{(n)} \leftarrow (\mathbf{E}^{-1})_{ia,jb} \left[ Z_{jb} - R_{jb}^{(n)} \right]$	$\triangleright$ Update response vector
28: if not allow_ct? then	
29: Restore dimensions of X	
30: end if $(f_{n+1}) = \mathbf{X}(n-1)$	
31: if $  \mathbf{X}^{(n)} - \mathbf{X}^{(n-1)}   < \vartheta$ then	
32: $converged \leftarrow true$	
33: Append $\mathbf{X}^{(n)}$ to rspvecs	
34: break	
35: end if	

Algorithm 2 Continuation of algorithm 1
36: end for
37: if not converged then
38: crash
39: end if
40: end for
41: end for
42: $resp \leftarrow 0 \triangleright$ Form all possible permutations of property gradient and response vectors
43: for $a \leftarrow 1, len(rhsvecs)$ do
44: <b>for</b> $b \leftarrow 1, len(rspvecs)$ <b>do</b>
45: $\mathbf{P} \leftarrow rhsvecs[a], \mathbf{Q} \leftarrow rspvecs[b]$
46: $\langle \langle \hat{P}; \hat{Q} \rangle \rangle_0 \leftarrow -P_{ia}Q_{ia}$
47: $\operatorname{resp}[a,b] \leftarrow \langle \langle \hat{P}; \hat{Q} \rangle \rangle_0$
48: end for
49: end for
50: end procedure

# 6.0 Psi4NumPy: AN INTERACTIVE QUANTUM CHEMISTRY PROGRAMMING ENVIRONMENT FOR REFERENCE IMPLEMENTATIONS AND RAPID DEVELOPMENT

The text in this chapter has been adapted from Smith, D.; Burns, L. A.; Sirianni, D. A.; Nascimento, D. R.; Kumar, A.; James, A. M.; Schriber, J. B.; Zhang, T.; Zhang, B.; Abbott, A. S.; Berquist, E. J.; Lechner, M. H.; dos Anjos Cunha, L.; Heide, A. G.; Waldrop, J. M.; King, R. A.; Simmonett, A. C.; Turney, J. M.; Schaefer, H. F.; Evangelista, F. A.; DePrince III, A. E.; Crawford, T. D.; Patkowski, K.; Sherrill, C. D. Psi4NumPy: An Interactive Quantum Chemistry Programming Environment for Reference Implementations and Rapid Development. **2018**, DOI: 10.26434/chemrxiv.5746059.v1. The author's contributions to this work were the reference implementation and Jupyter Notebook tutorial for the SCF first hyperpolarizability, presented in sections 6.9.1 and 6.9.2.

## 6.1 SUMMARY

PSI4NUMPY demonstrates the use of efficient computational kernels from the open-source PSI4 program through the popular NUMPY library for linear algebra in Python to facilitate the rapid development of clear, understandable Python computer code for new quantum chemical methods, while maintaining a relatively low execution time. Using these tools, reference implementations have been created for a number of methods, including self-consistent field (SCF), SCF response, many-body perturbation theory, coupled-cluster theory, configuration interaction, and symmetry-adapted perturbation theory. Further, several reference codes have been integrated into Jupyter notebooks, allowing background and explanatory information to be associated with the implementation. PSI4NUMPY tools and associated reference implementations can lower the barrier for future development of quantum chemistry methods. These implementations also demonstrate the power of the hybrid C++/Python programming approach employed by the PSI4 program.

## 6.2 INTRODUCTION

Whereas in the past a new quantum chemical (QC) method was commonly presented solely through its equations, perhaps along with a few token values, the more recent expectation is that equations will be accompanied by results from an effective computer program clearly demonstrating the utility of the method. This expectation becomes increasingly burdensome as new computer architectures emerge, since some theories will be naturally more computationally efficient or more difficult to implement than others. The computation expense of most quantum chemical methods creates substantial pressure for methods to be implemented with highly optimized algorithms.

This situation presents a challenge for ongoing development in quantum chemistry, because new theoretical methods are typically complex and their correct implementation is non-trivial. Additionally, computationally efficient codes require a low-level programming language like C++ or Fortran, followed by substantial code profiling, testing, and optimization. Often a method's first implementation is a rather messy computer program. The researcher may be learning the details of the method as they progress, resulting in "experimental" parts of the code that may never get removed, or data structures that may not be optimal for the final version of the method. Additionally, development is often carried out by graduate students not yet proficient in programming, resulting in unconventional coding styles. Subsequently, a researcher seeking to extend or enhance a method previously developed in-house is often faced with the daunting prospect of deciphering a quite complex existing code.

Still more challenging is implementing or extending an existing method sourced solely from the literature. Often, a paper describing a new quantum chemical method that properly focuses on scientific detail falls short on algorithmic or numerical detail sufficient for independent reimplementation. Indeed, the methods are so complex that the original equations frequently include typos, which are generally tracked through institutional lore rather than published errata. Additionally, modern approaches often employ combinations of approximations with multiple numerical cutoffs, exacerbating the reproducibility problem. This paradigm is illustrated within a recent comment,<sup>288</sup> whereby several corrections to equations originally published in 2011 for a two-level semi-empirical method<sup>289</sup> were proposed after being re-engineered to reproduce values computed using a binary program distributed with the original publication. Even facilitated through private communication with the method's author, this cycle of rediscovery and reimplementation is both highly non-trivial and unsustainable. Fortunately, an open-source program<sup>290</sup> has been made available by the commenting author that implements the method and proposed changes, so that further extensions of the method can proceed with this program as a reference.

Such "reference implementations" (easy-to-read, unoptimized computer programs solely targeting the correct result) can be a helpful initial step toward developing or understanding a complex method, yet they are not widely available in quantum chemistry. To our knowledge, reference implementations and benchmarking have only been performed in a large-scale way for density functional theory (DFT) exchange-correlation kernels<sup>291</sup> and periodic boundary condition DFT with pseudopotentials.<sup>292</sup> One factor limiting more widespread use of reference implementations for quantum chemistry is that methods are often so computationally demanding that a basic, unoptimized implementation is too slow for computations on even the smallest molecules. What is needed is an alliance of QC code that is easy to peruse and manipulate with underlying non-QC routines that are fast enough for testing on non-trivial molecules.

Here we present PSI4NUMPY, a framework for the creation of clear, readable reference implementations of quantum chemical methods and for the rapid development of new methods. PSI4NUMPY takes advantage of PSI4's<sup>284</sup> application programming interface (API) that makes efficient computational kernels written in C++ available from Python, a language that is easy to learn and has become very popular in scientific computing. As a highlevel language, Python allows complex tasks to be specified with relatively few lines of code. PSI4NUMPY capitalizes on the straightforward conversion of PSI4 tensors to NUMPY<sup>293</sup> and Numerical Python's (NUMPY's) own low-level back end to ensure that all data arrays can use the optimized Basic Linear Algebra Subroutines (BLAS) library<sup>294</sup> for common linear algebra operations. The wide user base of NUMPY ensures constant updates and bug fixes. PSI4NUMPY has been packaged for minimal setup, requiring only 3 minutes, with no preinstalled compilers necessary on 64-bit Linux, Mac, and Windows. Here we introduce the main elements of the PSI4NUMPY framework and illustrate them with a substantial collection of reference implementations for standard quantum chemical methods and numerical techniques. The PSI4NUMPY is built entirely on Free and Open Source Software (FOSS)<sup>295</sup> as shown in Fig. 36 to ensure a barrierless entry to quantum chemistry programming.

Several of the reference implementations have been augmented by tutorial-style introductions to the relevant theory. The PSI4NUMPY tutorial collection includes self-consistent field (SCF), DFT,<sup>296</sup> many-body perturbation theory (MBPT),<sup>297</sup> symmetry-adapted perturbation theory (SAPT),<sup>156,298</sup> coupled-cluster (CC),<sup>299</sup> and configuration interaction (CI)<sup>300,301</sup> theories, with additional sections detailing the theory and implementation of linear response, geometry optimizations, and Verlet integrators. It is our hope that PSI4NUMPY and the accompanying reference code will lower the barrier to implementing quantum chemical methods.

Shortly before submission, we discovered the Quantum Chemistry Program Exchange (QCPE),<sup>302,303</sup> whose goals of (self-contained) software accessibility, algorithm explication, and free software "publishing" the PSI4NUMPY project shares. The general tools embraced by PSI4NUMPY (GitHub for communication, NUMPY for linear algebra, Python for interfacing, and Jupyter for illumination) further allow rapid prototyping and educational objectives. In this manner PSI4NUMPY can be thought as a modern successor to QCPE built to serve the flexible needs of the community.

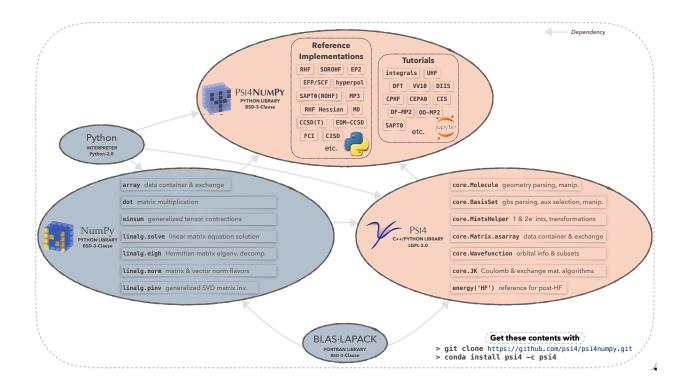


Figure 36: PSI4NUMPY draws linear algebra tools from NUMPY and fundamental quantum chemistry structures from PSI4 to bring together a practical and convenient environment for code development, verification, and exploration. The most important data structures and functions are shown for NUMPY and PSI4 as well as representative tutorial and reference implementations presently in PSI4NUMPY.

## 6.3 BASIC TOOLS

The basic premise of PSI4NUMPY is to leverage PSI4 to generate quantum chemistry-specific quantities and the NUMPY library<sup>293</sup> for all other tensor manipulations. The latest version of PSI4 has added the capability to import PSI4 as a Python module as well as continuing to be called in an executable fashion. In this way, both the PSI4 and NUMPY libraries can be loaded into a single Python script and used in cooperation.

A key capacity in this enterprise is seamless translation between NUMPY and PSI4 data classes. For example, converting from a NUMPY array to a PSI4 matrix and back again can be easily accomplished:

Listing 4: Basic example of  $PSI4 \leftrightarrow NUMPY$  interoperability

```
import numpy, psi4
np_array = numpy.zeros((5, 5))
psi4_matrix = psi4.core.Matrix.from_array(np_array)
new_np_array = numpy.array(psi4_matrix)
```

At the core of this procedure is NUMPY's array\_interface<sup>304</sup> protocol, a basic specification for dense matrices consisting of

- 1. (a) the starting memory location for an in-memory array
- 2. (b) the overall "shape" of the array [(n, ) for a vector, (n, m) for a matrix, etc.]
- 3. (c) the type of data involved (double64, int32, etc.)

This specification is compact and widely used amongst the scientific Python community in a variety of scenarios. Using the array\_interface, it becomes straightforward to allow NUMPY access to a PSI4 data class, allowing both PSI4 and NUMPY to access and manipulate the same data. For example, the below will overwrite the PSI4 Matrix class in place with a random NUMPY array:

Listing 5: Mutating a PSI4 Matrix directly from a NUMPY routine psi4\_matrix.np[:] = numpy.random.rand(5, 5)

In this way the typical separation between general tensor frameworks and custom quantum chemistry data structures is removed.

A description of the full set of capabilities of the array\_interface is available in the PSI4 documentation: http://psicode.org/psi4manual/master/numpy.html.

## 6.3.1 Wavefunction Objects

In PSI4 all built-in methodologies have the option to return a Wavefunction object that holds basic information about the previous computation or, in some cases, holds functions for readily computing advanced quantities. Obtaining the Wavefunction object in this manner is straightforward:

Listing 6: Initializing a PSI4 computation from Python

```
1 mol = psi4.geometry("""
2 0
3 H 1 0.96
4 H 1 0.96, 104.5
5 """)
6 hf_e, hf_wfn = psi4.energy("HF/cc-pVDZ", molecule=mol, return_wfn=True)
```

Once a Wavefunction object is obtained, a variety of attributes can be queried using standard Python syntax:

Listing 7: Obtaining PSI4 wavefunction data in Python

```
1 # Number of doubly occupied orbitals
2 docc = hf_wfn.ndocc()
3 # Alpha orbital coefficient matrix
4 Ca = hf_wfn.Ca()
5 # Occupied subset of the alpha orbitals
6 Ca_occ = hf_wfn.Ca_subset("AO", "OCC")
```

In addition to generating useful information after a computation, a Wavefunction object can also be passed as reference state to a further computation. For PSI4NUMPY, this means that reference implementations of post-Hartree–Fock methods (MPn, CCSD, etc.) need not re-code their own Hartree–Fock program; this simultaneously reduces code duplication and increases readability, both of which are cornerstones of the PSI4NUMPY project.

## 6.3.2 Integrals

PSI4 offers a wide selection of efficient C++ tools accessible directly in Python. These tools are largely object-based and capable of storing quantities in memory or on disk. One such object is the libmints library,<sup>284</sup> which is currently the primary interface for computing oneand two-electron integrals in PSI4. This library is accessible through the MintsHelper class that directs the efficient computation and storage of molecular integrals Python-side:

Listing 8: Computing atomic orbital-basis integrals from PSI4 via Python

```
1 # Create instance of MintsHelper using primary basis set
2 mints = psi4.core.MintsHelper(primary_basis)
3 # Compute one-electron AO overlap matrix
4 S = mints.ao_overlap()
5 # Compute core Hamiltonian matrix
6 T = mints.ao_kinetic()
7 V = mints.ao_potential()
8 H = T + V
9 # Compute two-electron integrals in AO basis in memory
10 I_ao = mints.ao_eri()
```

Each of the above MintsHelper class methods returns a PSI4 matrix which can be converted to a NUMPY array using numpy.asarray(matrix) or modified in place with the matrix.np accessor.

In addition to computing molecular integrals, the libmints library also performs optimized electron repulsion integral (ERI) transformations. For example, the  $\mathcal{O}(N^5)$  transformation of the two-electron integrals between the atomic orbital and molecular orbital basis, given by

$$(ia|jb) = \left[ \left[ C_{\mu i} \left[ C_{\nu a} (\mu \nu | \lambda \sigma) \right] \right] C_{\lambda j} \right] C_{\sigma b}, \tag{6.1}$$

can be performed easily with:

Listing 9: Calling PSI4's AO-to-MO transformation from Python

```
1 # Occupied and virtual subsets of SCF orbital coefficient matrices
2 Ca_occ = hf_wfn.Ca_subset("AO", "OCC")
3 Ca_virt = hf_wfn.Ca_subset("AO", "VIR")
4 # AO basis to MO basis in-memory ERI transform
5 I_mo = mints.mo_transform(Ca_occ, Ca_virt, I_ao, Ca_occ, Ca_virt)
```

In this manner, arbitrary ERI transformations may be performed, allowing both speed and flexibility for constructing reference implementations.

## 6.3.3 Coulomb and Exchange (JK) Matrix Objects

A key component in SCF-level theories is the contraction of the 4-index electron repulsion integrals with the 2-index density matrix to form J and K matrices:

$$J_{\lambda\sigma}[D] \equiv (\lambda\sigma|\mu\nu)D_{\mu\nu}, \qquad (6.2)$$

$$K_{\lambda\sigma}[D] \equiv (\lambda\mu|\sigma\nu)D_{\mu\nu} \tag{6.3}$$

PSI4 provides objects for computing generalized Coulomb (J) and Exchange (K) matrices, with specialized algorithms for integral-direct, PK supermatrix,<sup>305</sup> or density fitting (DF) scenarios. For the DF-JK object, it is often advantageous to use a factorized form of the density matrix,

$$D_{\mu\nu} \equiv C_{\mu p}^{\text{left}} C_{\nu p}^{\text{right}}, \qquad (6.4)$$

where p is a general MO index. For example, in canonical Restricted Hartree Fock (RHF), the density matrix takes the form of

$$D^{RHF}_{\mu\nu} = C_{\mu i} \chi_{ia} C_{\nu a}, \tag{6.5}$$

where i runs only over occupied orbitals. The computation of the RHF JK matrices can be translated directly to Python code with the following lines:

Listing 10: Building two-electron Fock matrix components using PSI4 via Python

```
1 # Create a JK object in the current primary basis set
2 jk = psi4.core.JK.build(primary_basis)
3 # Add the occupied parts of the SCF orbital matrix
4 jk.add_C_left(C_occupied)
5 jk.add_C_right(C_occupied)
6 # Perform the computation and obtain the J and K matrices
7 jk.compute()
8 J = jk.J()
9 K = jk.K()
```

In this fashion, virtually any SCF-level theory can be formulated at the PSI4NUMPY layer by handling only 2-D arrays with NUMPY (typically by threaded vendor BLAS) and leaving the 3- and 4-D arrays to PSI4 libraries (using optimized C++ routines). Thus, SCF-level theories can be implemented with the same efficiency as their pure C++ counterparts.

To illustrate this point, the PSI4 SCF program is compared against a PSI4NUMPY implementation on an Intel i7-5930K processor with the adenine thymine complex in the aug-cc-pVTZ basis (1127 basis functions) using a density-fitted JK build on six cores. The PSI4 SCF program took 250 seconds while the PSI4NUMPY implementation took 245 seconds. This should not be surprising as each spent 94% total wall time computing the J and K quantities (both implementations used 18 SCF iterations) and all other operations of nonnegligible cost use the same BLAS implementations.

#### 6.4 **RAPID DEVELOPMENT**

A key component of the PSI4NUMPY framework is to provide an easy-to-use development environment for rapid prototyping. Vital to this is NUMPY's einsum function that performs arbitrary tensor contractions using Einstein summation syntax. For example, the atomic orbital to molecular orbital 4-index transformation of Eq. (6.1) and code snippet 9 could be accomplished by:

```
Listing 11: Performing an AO-to-MO transformation using NUMPY's einsum
  I_mo = numpy.einsum("pi,qa,pqrs,rj,sb->iajb",
                       Ca_occ, Ca_virt, I_ao,
2
                       Ca_occ, Ca_virt)
```

1

3

Recently, one of us (D.G.A.S.) modified NUMPY's einsum function so that it will automatically factorize the incoming tensor expression to reduce the cost of the operation from naive  $\mathcal{O}(N^8)$  to the conventional  $\mathcal{O}(N^5)$  version. This feature is available in NUMPY 1.12 and onwards, with additional optimizations and BLAS usage occurring in NUMPY 1.14. In addition, a drop-in replacement for the **einsum** function, which makes optimal use of vendor BLAS, can be found through the Optimized Einsum project.<sup>306</sup>

Using the **einsum** function, it is straightforward to transcribe existing equations directly into working code without a compilation stage. While the resulting program is not as efficient for post-SCF level theories as a full implementation in a low-level language, the code is easy to read and modify without the need for compilation, allowing considerable flexibility when prototyping. In addition, the resulting program will provide correct answers for the given expressions, sparing the developer any worry whether low-level code is correct.

As an example of rapid prototyping, we use a temporary CCSD quantity in the Direct Product Decomposition formalism.<sup>307</sup> For virtual indices a, b, c, d and occupied indices i, j, k, Equation 8 of Ref. [307] is written as:

$$W_{jaci} = \langle ja||ci\rangle + t_i^d \langle ja||cd\rangle - t_k^a \langle jk||ci\rangle - (\frac{1}{2}t_{ik}^{da} + t_i^d t_k^a) \langle jk||cd\rangle, \tag{6.6}$$

which can be directly translated into a function:

Listing 12: Example of forming a coupled cluster intermediate using NUMPY and einsum def build\_Wjaci(T1, T2, M0): Wjaci = M0[o, v, v, o].copy() Wjaci += numpy.einsum("jid,jacd->jaci", T1, M0[o, v, v, v])

```
Wjaci -= numpy.einsum("ka,jkci->jaci", T1, MO[o, o, v, o])
tmp = 0.5 * T2 + numpy.einsum("jid,ka->ikda", T1, T1)
Wjaci -= numpy.einsum("ikda,jkcd->jaci, tmp, MO[o, o, v, v])
return Wjaci
```

Here, MO holds the 4-index antisymmetrized integrals, T1 and T2 the current amplitudes, and the o, v quantities are Python-based slices so that MO[o, v, v, v] returns the occupied-virtual-virtual-virtual blocks of the antisymmetrized integrals.

To our knowledge, the first implementations of Symmetry-Adapted Perturbation Theory with Complete Active Space SCF references [SAPT(CASSCF)], fourth-order Electron Propagator Theory, and transcorrelated theories have all been achieved using these rapid prototyping techniques.

## 6.5 ACCESS AND CONTRIBUTIONS

To ensure ease of community access to the PSI4NUMPY project, all software dependencies are made available as binary Conda packages<sup>308</sup> either by us (e.g., PSI4), or by ContinuumIO or Intel (e.g., NUMPY, Matplotlib, Jupyter). Through this route, binary distributions are installable in a single line to all common computing platforms, so users are not required to compile, link against the correct libraries, or debug runtime issues. We hope that the ready accessibility of these tools facilitates their use in methods development and in the creation of additional publicly available reference implementations.

To lower the barrier to contribution, guidance is included in the repository regarding attribution, citations, and testing. Though the authors adhere to Python software developement best practices in their other projects, they resist advanced Python syntax, organization, file linking, or other jargon-ized code in PSI4NUMPY in favor of straightforward scripts and Jupyter notebooks for ease of community involvement. Educators are encouraged to base lessons and labs off this work and are also referred to the PSI4EDUCATION project.<sup>309</sup>

## 6.6 REFERENCE IMPLEMENTATIONS

To illustrate the PSI4NUMPY tools, and to provide a resource to the quantum chemistry methods development community, we have created a number of reference implementations and made them publicly available on GitHub at https://github.com/psi4/psi4numpy. We intend to add to this collection over time. Given the wide spectrum of quantum chemical methods, we also encourage submissions from other developers.

The PSI4NUMPY reference implementations, while not necessarily as efficient as optimized versions in a low-level language, furnish at least the basic requirements for a programmer to reproduce the methodology. These references provide a medium to explain minute details that might be included in a corresponding paper and to record algorithmic tricks used to improve numerical stability or computational efficiency. In addition, these clear implementations will make explicit any important steps that might not be mentioned in a paper because they are assumed to be background knowledge in a given subfield of quantum chemistry.

Programmers can use these reference implementations to obtain intermediate quantities to validate a new implementation at every step, ensuring accuracy and assisting in the process of debugging a new program. These reference implementations can also be used as starting points for either building upon existing methodologies or exploring new methodologies in combination with the rapid prototyping aspects of this project.

Current reference implementations include

- 1. Self-Consistent Field
  - a. Restricted simple and DIIS<sup>98</sup>-accelerated Hartree–Fock
  - b. Restricted, Unrestricted, and Restricted Open-Shell Hartree–Fock
  - c. Restricted, Unrestricted, and Restricted Open-Shell Hartree–Fock time-independent orbital Hessians
  - d. Restricted time-dependent Hartree–Fock and coupled-perturbed Hartree–Fock for dipole polarizabilities
  - e. Restricted nuclear gradients and Hessians
- 2. Many-Body Perturbation Theory
  - a. Canonical and density-fitted MP2
  - b. Spin-integrated and spin-orbital MP3
  - c. Arbitrary-order MP
- 3. Coupled-Cluster
  - a. Simple and DIIS-accelerated CCSD
  - b. CCSD(T)
  - c. CCSD dipole polarizabilities
  - d. Time-dependent equation-of-motion CCSD
- 4. Configuration Interaction
  - a. Excited-state CIS
  - b. Canonical and Davidson–Liu CISD
  - c. Full configuration interaction
- 5. Symmetry-Adapted Perturbation Theory

The Fock matrix, **F**, has elements  $F_{\mu\nu}$  given (in the atomic orbital basis) as

$$F_{\mu\nu} = H_{\mu\nu} + 2(\mu \nu | \lambda \sigma) D_{\lambda\sigma} - (\mu \lambda | \nu \sigma) D_{\lambda\sigma}$$

where  $D_{\lambda\sigma}$  is an element of the one-particle density matrix **D**, constructed from the orbital coefficient matrix **C**:

$$D_{\lambda\sigma} = C_{\sigma i} C_{\lambda i}$$

Using the above equations, the Fock matrix can be constructed as:

```
In [1]: D = numpy.einsum('pi,qi->pq', Cocc, Cocc)
J = numpy.einsum('pqrs,rs->pq', I, D)
K = numpy.einsum('prqs,rs->pq', I, D)
F = H + 2 * J - K
```

Figure 37: Extract from a Jupyter notebook demonstrating the construction of a SCF Fock matrix where I is the 4-index electron repulsion integral array and Cocc is the occupied orbital matrix.

- a. Restricted and Restricted Open-Shell SAPT0
- b. Atomic orbital implementation of SAPT0
- 6. Electron Propagator Theory
  - a. Spin-integrated and spin-orbital EP2
  - b. Spin-orbital EP3

## 6.6.1 Jupyter Notebook integration

As a service to the community, some of the reference implementations have been augmented by additional, tutorial-style background information on various subfields of quantum chemistry. We found it convenient to add this additional information using the Jupyter notebook web application,<sup>310</sup> a popular Integrated Development Environment (IDE) for interactive computing in several programming languages that is starting to be adopted by chemists.<sup>311</sup> An example for restricted Hartree–Fock can be found in Fig. 37. These documents may be unique within quantum chemistry in that they focus not only on theoretical considerations but also on the details of a method's implementation, such as *why* certain programming choices were made. For example, the comparison between a general matrix inversion and solving a set of linear equations demonstrates instability issues that often plague the former technique. Such illustrations should make the Jupyter implementations useful both to new users in quantum chemistry and to experienced users interested in exploring new subfields.

Current tutorial-style Jupyter reference implementations include

- 1. Introductions to the PSI4NUMPY methodology
- 2. Introduction to Hartree–Fock, DIIS, and density fitting
- 3. Density Functional Theory: grids, LDA kernels, VV10 dispersion, and asymptotic corrections
- 4. Møller–Plesset: canonical and density-fitted reference implementations of MP2
- 5. Molecular Properties: Integrals, CPHF, CIS
- 6. Symmetry-Adapted Perturbation Theory: Canonical and atomic orbital algorithms
- 7. Orbital-Optimized Methods: OMP2
- 8. Coupled-Cluster Approximations: CEPA0, CCD
- 9. Geometry Optimization Techniques: Internal Coordinates, Hessian guesses, and advanced Newton-Raphson methods

Molecular-dynamics tutorials include

- 1. Periodic Lennard-Jones simulation with Verlet integrators
- 2. Periodic Ewald Electostatic summation

## 6.7 CONCLUSIONS

We believe that the benefits of the PSI4NUMPY framework to the computational chemistry community are threefold. Beginning researchers can use the PSI4NUMPY reference implementations for *education*. Reference implementations convey not just the underlying mathematical formulas of a given theory, but how to implement these formulas in a manner that avoids common pitfalls such as ill-conditioned numerical equations. PSI4NUMPY is likely the most interactive educational resource available in this field: thanks to the Jupyter Notebook format, the learners can explore the implementation step by step and easily try out various modifications and additional approximations.

More advanced researchers who need to reimplement and/or modify a given computational chemistry approach can use the PSI4NUMPY reference implementations for *validation*, taking advantage of the code that, thanks to the extensive use of the NUMPY **einsum** functionality, provides a nearly one-to-one correspondence between the terms in a formula and the lines of Python code. As a result, it is trivial to switch off, for debugging purposes, any subset of terms as well as generate an arbitrary intermediate without even recompiling any code. This feature should be contrasted with the situation when one tries to validate their code against a C++/Fortran implementation from an established electronic-structure package. Once the relevant fragment of code that does the actual computation is found (which is not always trivial), various terms are typically combined in nontrivial ways to improve computational performance. As a result, getting out a specific intermediate for checking the implementation in progress often requires substantive changes to the reference code, not to mention its recompilation. In addition, we include the programmed formulas together with their implementation in the Jupyter Notebook to alleviate difficulties associated with incompatible notation or even errors in the originally published expressions.

Finally, for researchers who want to develop new functionality, PSI4NUMPY is a highly valuable platform for *initial implementation* that is efficient enough for meaningful testing, quick to generate, easy to debug, and has few opportunities for programming errors. All underlying quantum-chemistry building blocks such as integrals, orbitals, density matrices, and CI vectors are efficiently computed by PSI4 and readily imported in the NUMPY format. In particular, a PSI4NUMPY implementation of any one-electron theory such as HF or DFT is already close to optimal as the most expensive operations are all written in terms of generalized Coulomb and exchange matrices which are supplied by PSI4. Some of us, together with their collaborators, have already taken advantage of the PSI4NUMPY capabilities to rapidly generate pilot implementations of brand new electronic-structure approaches.

## 6.8 ACKNOWLEDGEMENTS

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# 6.9 SUPPORTING INFORMATION

Documents reproducing all currently available reference implementations and interactive tutorials are available free of charge via the Internet at https://zenodo.org/record/1134320. For all future materials, please see https://github.com/psi4/psi4numpy. The code found in sections 6.9.1 and 6.9.2 was merged in commit hash 0666378.

## 6.9.1 Hyperpolarizability Reference Implementation

.....

```
1
   Helper classes and functions for molecular properties requiring
2
   solution of CPHF equations.
3
    .....
4
5
6
   __authors__
                 = "Daniel G. A. Smith"
   __credits__ = ["Daniel G. A. Smith", "Eric J. Berquist"]
7
8
   __copyright__ = "(c) 2014-2017, The Psi4NumPy Developers"
9
   __license__ = "BSD-3-Clause"
10
                = "2017-8-30"
11
   __date__
12
   import time
13
   import numpy as np
14
   np.set_printoptions(precision=5, linewidth=200, suppress=True)
15
   import psi4
16
17
   import os.path
18
   import sys
19
```

```
dirname = os.path.dirname(os.path.abspath(__file__))
20
    sys.path.append(os.path.join(dirname, '../.Self-Consistent-Field'))
21
    from helper_HF import DIIS_helper
22
23
^{24}
    class helper_CPHF(object):
25
26
        def __init__(self, mol, numpy_memory=2):
27
28
            self.mol = mol
29
            self.numpy_memory = numpy_memory
30
31
            # Compute the reference wavefunction and CPHF using Psi
32
            scf_e, self.scf_wfn = psi4.energy('SCF', return_wfn=True)
33
34
            self.C = self.scf wfn.Ca()
35
            self.Co = self.scf_wfn.Ca_subset("AO", "OCC")
36
            self.Cv = self.scf_wfn.Ca_subset("AO", "VIR")
37
            self.epsilon = np.asarray(self.scf_wfn.epsilon_a())
38
39
            self.nbf = self.scf_wfn.nmo()
40
            self.nocc = self.scf_wfn.nalpha()
41
            self.nvir = self.nbf - self.nocc
42
43
            # Integral generation from Psi4's MintsHelper
44
            self.mints = psi4.core.MintsHelper(self.scf_wfn.basisset())
45
46
            # Get nbf and ndocc for closed shell molecules
47
            print('\nNumber of occupied orbitals: %d' % self.nocc)
48
            print('Number of basis functions: %d' % self.nbf)
49
50
            # Grab perturbation tensors in MO basis
51
            nCo = np.asarray(self.Co)
52
            nCv = np.asarray(self.Cv)
53
            self.tmp_dipoles = self.mints.so_dipole()
54
            self.dipoles_xyz = []
55
            for num in range(3):
56
                Fso = np.asarray(self.tmp_dipoles[num])
57
                Fia = (nCo.T).dot(Fso).dot(nCv)
58
                Fia *= -2
59
                self.dipoles_xyz.append(Fia)
60
61
            self.x = None
62
            self.rhsvecs = None
63
64
        def run(self, method='direct', omega=None):
65
            self.method = method
66
            if self.method == 'direct':
67
                if not omega:
68
                     self.solve_static_direct()
69
                else:
70
                     self.solve_dynamic_direct(omega=omega)
71
            elif self.method == 'iterative':
72
73
                if not omega:
```

```
74
                     self.solve_static_iterative()
                 else:
75
                     self.solve_dynamic_iterative(omega=omega)
76
             else:
77
                 raise Exception("Method %s is not recognized" % self.method)
78
             self.form_polarizability()
79
80
        def solve_static_direct(self):
81
             # Run a quick check to make sure everything will fit into memory
82
             I_Size = (self.nbf ** 4) * 8.e-9
83
             oNNN_Size = (self.nocc * self.nbf ** 3) * 8.e-9
84
             ovov_Size = (self.nocc * self.nvir * self.nvir) * 8.e-9
85
            print("\nTensor sizes:")
86
            print("ERI tensor
                                          %4.2f GB." % I_Size)
87
                                          %4.2f GB." % oNNN_Size)
            print("oNNN MO tensor
88
             print("ovov Hessian tensor %4.2f GB." % ovov_Size)
89
90
             # Estimate memory usage
91
            memory_footprint = I_Size * 1.5
92
             if I_Size > self.numpy_memory:
93
                 psi4.core.clean()
94
                 raise Exception("Estimated memory utilization (%4.2f GB) exceeds numpy_memory
95
                 \rightarrow
                                  limit of %4.2f GB." % (memory_footprint, self.numpy_memory))
96
97
             # Compute electronic Hessian
98
             print('\nForming Hessian...')
99
             t = time.time()
100
             docc = np.diag(np.ones(self.nocc))
101
             dvir = np.diag(np.ones(self.nvir))
102
             eps_diag = self.epsilon[self.nocc:].reshape(-1, 1) - self.epsilon[:self.nocc]
103
104
             # Form [o, N, N, N] MO tensor, oN^4 cost
105
            MO = np.asarray(self.mints.mo_eri(self.Co, self.C, self.C, self.C))
106
107
            H = np.einsum('ai,ij,ab->iajb', eps_diag, docc, dvir)
108
            H += 4 * MO[:, self.nocc:, :self.nocc, self.nocc:]
109
            H -= MO[:, self.nocc:, :self.nocc, self.nocc:].swapaxes(0, 2)
110
111
112
            H -= MO[:, :self.nocc, self.nocc:, self.nocc:].swapaxes(1, 2)
113
114
            print('...formed Hessian in %.3f seconds.' % (time.time() - t))
115
116
             # Invert Hessian (o^3v^3)
117
            print('\nInverting Hessian...')
118
             t = time.time()
119
            Hinv = np.linalg.inv(H.reshape(self.nocc * self.nvir, -1)).reshape(self.nocc,
120
             → self.nvir, self.nocc, self.nvir)
            print('...inverted Hessian in %.3f seconds.' % (time.time() - t))
121
122
             # Form perturbation response vector for each dipole component
123
             self.x = []
124
125
             for numx in range(3):
```

```
xcomp = np.einsum('iajb,ia->jb', Hinv, self.dipoles_xyz[numx])
126
                 self.x.append(xcomp.reshape(-1))
127
128
             self.rhsvecs = []
129
             for numx in range(3):
130
                 rhsvec = self.dipoles_xyz[numx].reshape(-1)
131
                 self.rhsvecs.append(rhsvec)
132
133
         def solve_dynamic_direct(self, omega=0.0):
134
             # Adapted completely from TDHF.py
135
136
             eps_v = self.epsilon[self.nocc:]
137
             eps_o = self.epsilon[:self.nocc]
138
139
             t = time.time()
140
             I = self.mints.ao eri()
141
             v_ijab = np.asarray(self.mints.mo_transform(I, self.Co, self.Co, self.Cv,
142
             \rightarrow self.Cv))
             v_iajb = np.asarray(self.mints.mo_transform(I, self.Co, self.Cv, self.Co,
143
             \rightarrow self.Cv))
             print('Integral transform took %.3f seconds\n' % (time.time() - t))
144
145
             # Since we are time dependent we need to build the full Hessian:
146
             # | A B |
                           |DS||x||b|
147
             # | B A | - w | S -D | | -x | = | -b |
148
149
             # Build A and B blocks
150
             t = time.time()
151
             A11 = np.einsum('ab,ij->iajb', np.diag(eps_v), np.diag(np.ones(self.nocc)))
152
             A11 -= np.einsum('ij,ab->iajb', np.diag(eps_o), np.diag(np.ones(self.nvir)))
153
             A11 += 2 * v_iajb
154
             A11 -= v_ijab.swapaxes(1, 2)
155
             A11 *= 2
156
157
             B11 = -2 * v iajb
158
             B11 += v_iajb.swapaxes(0, 2)
159
             B11 *= 2
160
161
             # Reshape and jam it together
162
             nov = self.nocc * self.nvir
163
             A11.shape = (nov, nov)
164
             B11.shape = (nov, nov)
165
166
             Hess1 = np.hstack((A11, B11))
167
             Hess2 = np.hstack((B11, A11))
168
             Hess = np.vstack((Hess1, Hess2))
169
170
             S11 = np.zeros_like(A11)
171
             D11 = np.zeros_like(B11)
172
             S11[np.diag_indices_from(S11)] = 2
173
174
             S1 = np.hstack((S11, D11))
175
             S2 = np.hstack((D11, -S11))
176
177
             S = np.vstack((S1, S2))
```

```
178
             S *= omega
             print('Hessian formation took %.3f seconds\n' % (time.time() - t))
179
180
             t = time.time()
181
             Hinv = np.linalg.inv(Hess - S)
182
             print('Hessian inversion took %.3f seconds\n' % (time.time() - t))
183
184
             self.x = []
185
             self.rhsvecs = []
186
             for numx in range(3):
187
                 rhsvec = self.dipoles_xyz[numx].reshape(-1)
188
                 rhsvec = np.concatenate((rhsvec, -rhsvec))
189
                 xcomp = Hinv.dot(rhsvec)
190
                 self.rhsvecs.append(rhsvec)
191
                 self.x.append(xcomp)
192
193
         def solve_static_iterative(self, maxiter=20, conv=1.e-9, use_diis=True):
194
195
             # Init JK object
196
             jk = psi4.core.JK.build(self.scf_wfn.basisset())
197
             jk.initialize()
198
199
             # Add blank matrices to the jk object and numpy hooks to C_right
200
             npC_right = []
201
             for xyz in range(3):
202
                 jk.C_left_add(self.Co)
203
                 mC = psi4.core.Matrix(self.nbf, self.nocc)
204
                 npC_right.append(np.asarray(mC))
205
                 jk.C_right_add(mC)
206
207
             # Build initial guess, previous vectors, diis object, and C_left updates
208
             self.x = []
209
             x old = []
210
             diis = []
211
             ia_denom = - self.epsilon[:self.nocc].reshape(-1, 1) + self.epsilon[self.nocc:]
212
             for xyz in range(3):
213
                 self.x.append(self.dipoles_xyz[xyz] / ia_denom)
214
                 x_old.append(np.zeros(ia_denom.shape))
215
                 diis.append(DIIS_helper())
216
217
             # Convert Co and Cv to numpy arrays
218
             Co = np.asarray(self.Co)
219
             Cv = np.asarray(self.Cv)
220
221
             print('\nStarting CPHF iterations:')
222
             t = time.time()
223
             for CPHF_ITER in range(1, maxiter + 1):
224
225
                 # Update jk's C_right
226
                 for xyz in range(3):
227
                      npC_right[xyz][:] = Cv.dot(self.x[xyz].T)
228
229
                 # Compute JK objects
230
231
                 jk.compute()
```

```
# Update amplitudes
233
                 for xyz in range(3):
234
                      # Build J and K objects
235
                      J = np.asarray(jk.J()[xyz])
236
                      K = np.asarray(jk.K()[xyz])
237
238
                      # Bulid new guess
239
                      X = self.dipoles_xyz[xyz].copy()
240
                      X = (Co.T).dot(4 * J - K.T - K).dot(Cv)
241
                      X /= ia_denom
242
243
                      # DIIS for good measure
244
                      if use_diis:
245
                          diis[xyz].add(X, X - x_old[xyz])
246
                          X = diis[xyz].extrapolate()
247
248
                      self.x[xyz] = X.copy()
249
                 # Check for convergence
250
                 rms = []
251
                 for xyz in range(3):
252
                      rms.append(np.max((self.x[xyz] - x_old[xyz]) ** 2))
253
                      x_old[xyz] = self.x[xyz]
254
255
                 avg_RMS = sum(rms) / 3
256
                 max_RMS = max(rms)
257
258
                 if max_RMS < conv:
259
                      print('CPHF converged in %d iterations and %.2f seconds.' % (CPHF_ITER,
260
                      \rightarrow time.time() - t))
                      self.rhsvecs = []
261
                      for numx in range(3):
262
                          rhsvec = self.dipoles_xyz[numx].reshape(-1)
263
                          self.rhsvecs.append(rhsvec)
264
                          self.x[numx] = self.x[numx].reshape(-1)
265
                      break
266
267
                 print('CPHF Iteration %3d: Average RMS = %3.8f Maximum RMS = %3.8f' %
268
                        (CPHF_ITER, avg_RMS, max_RMS))
269
270
         def solve_dynamic_iterative(self, omega=0.0, maxiter=20, conv=1.e-9, use_diis=True):
271
272
             # Init JK object
273
             jk = psi4.core.JK.build(self.scf_wfn.basisset())
274
             jk.initialize()
275
276
             # Add blank matrices to the JK object and NumPy hooks to
277
             # C_right; there are 6 sets of matrices to account for X and Y
278
             # vectors separately.
279
             npC right = []
280
             for xyz in range(6):
281
                 jk.C_left_add(self.Co)
282
                 mC = psi4.core.Matrix(self.nbf, self.nocc)
283
284
                 npC_right.append(np.asarray(mC))
```

232

```
285
                 jk.C_right_add(mC)
286
             # Build initial guess, previous vectors, diis object, and C_left updates
287
             x l, x r = [], []
288
             x_1_old, x_r_old = [], []
289
290
             diis_1, diis_r = [], []
             ia_denom_1 = self.epsilon[self.nocc:] - self.epsilon[:self.nocc].reshape(-1, 1) -
291
             \hookrightarrow omega
             ia_denom_r = self.epsilon[self.nocc:] - self.epsilon[:self.nocc].reshape(-1, 1) +
292
              \hookrightarrow omega
             for xyz in range(3):
293
                 x_l.append(self.dipoles_xyz[xyz] / ia_denom_l)
294
                 x_r.append(self.dipoles_xyz[xyz] / ia_denom_r)
295
                 x_l_old.append(np.zeros(ia_denom_l.shape))
296
                 x_r_old.append(np.zeros(ia_denom_r.shape))
297
                 diis_l.append(DIIS_helper())
298
                 diis_r.append(DIIS_helper())
299
300
             # Convert Co and Cv to numpy arrays
301
             Co = np.asarray(self.Co)
302
             Cv = np.asarray(self.Cv)
303
304
             print('\nStarting CPHF iterations:')
305
             t = time.time()
306
             for CPHF_ITER in range(1, maxiter + 1):
307
308
                 # Update jk's C_right; ordering is Xx, Xy, Xz, Yx, Yy, Yz
309
                 for xyz in range(3):
310
                      npC_right[xyz][:] = Cv.dot(x_l[xyz].T)
311
                      npC_right[xyz + 3][:] = Cv.dot(x_r[xyz].T)
312
313
                 # Perform generalized J/K build
314
                 jk.compute()
315
316
                 # Update amplitudes
317
                 for xyz in range(3):
318
                      # Build J and K objects
319
                      J_l = np.asarray(jk.J()[xyz])
320
                      K_1 = np.asarray(jk.K()[xyz])
321
                      J_r = np.asarray(jk.J()[xyz + 3])
322
                      K_r = np.asarray(jk.K()[xyz + 3])
323
324
                      # Bulid new quess
325
                      X_l = self.dipoles_xyz[xyz].copy()
326
                      X_r = self.dipoles_xyz[xyz].copy()
327
                      X_1 = (Co.T).dot(2 * J_1 - K_1).dot(Cv)
328
                      X_r = (Co.T).dot(2 * J_r - K_r).dot(Cv)
329
                      X_l /= ia_denom_l
330
                      X_r /= ia_denom_r
331
332
                      # DIIS for good measure
333
                      if use diis:
334
                          diis_l[xyz] add(X_l, X_l - x_l_old[xyz])
335
336
                          X_l = diis_l[xyz].extrapolate()
```

```
337
                          diis_r[xyz] add(X_r, X_r - x_r_old[xyz])
                          X_r = diis_r[xyz].extrapolate()
338
                      x_l[xyz] = X_l.copy()
339
                      x_r[xyz] = X_r.copy()
340
341
                 # Check for convergence
342
                 rms = []
343
                 for xyz in range(3):
344
                      rms_l = np.max((x_l[xyz] - x_l_old[xyz]) ** 2)
345
                      rms_r = np.max((x_r[xyz] - x_r_old[xyz]) ** 2)
346
                      rms.append(max(rms_l, rms_r))
347
                      x_l_old[xyz] = x_l[xyz]
348
                      x_r_old[xyz] = x_r[xyz]
349
350
                 avg_RMS = sum(rms) / 3
351
                 \max_{RMS} = \max(rms)
352
353
                 if max_RMS < conv:
354
                      print('CPHF converged in %d iterations and %.2f seconds.' % (CPHF_ITER,
355
                      \rightarrow time.time() - t))
                      self.rhsvecs = []
356
                      for numx in range(3):
357
                          rhsvec = self.dipoles_xyz[numx].reshape(-1)
358
                          self.rhsvecs.append(np.concatenate((rhsvec, -rhsvec)))
359
                          self.x.append(np.concatenate((x_l[numx].reshape(-1),
360
                                                           x_r[numx].reshape(-1))))
361
                      break
362
363
                 print('CPHF Iteration %3d: Average RMS = %3.8f Maximum RMS = %3.8f' %
364
                        (CPHF_ITER, avg_RMS, max_RMS))
365
366
         def form_polarizability(self):
367
             self.polar = np.empty((3, 3))
368
             for numx in range(3):
369
                 for numf in range(3):
370
                      self.polar[numx, numf] = self.x[numx].dot(self.rhsvecs[numf])
371
372
    if __name__ == '__main__':
373
         print('\n')
374
         print('@test_CPHF running CPHF.py')
375
376
         from CPHF import *
377
378
         from helper_CPHF import helper_CPHF
379
380
381
         helper = helper_CPHF(mol)
382
         print('\n')
383
         print('@test_CPHF running solve_static_direct')
384
385
         helper.solve_static_direct()
386
         helper.form_polarizability()
387
         assert np.allclose(polar, helper.polar, rtol=0, atol=1.e-5)
388
389
```

```
print('\n')
390
        print('@test_CPHF running solve_static_iterative')
391
392
        helper.solve static iterative()
393
        helper.form_polarizability()
394
        assert np.allclose(polar, helper.polar, rtol=0, atol=1.e-5)
395
396
        f = 0.0
397
398
        print('\n')
399
        print('@test_CPHF running solve_dynamic_direct ({})'.format(f))
400
401
        helper.solve dynamic direct(omega=f)
402
        helper.form_polarizability()
403
        assert np.allclose(polar, helper.polar, rtol=0, atol=1.e-5)
404
405
        print('\n')
406
        print('@test_CPHF running solve_dynamic_iterative ({})'.format(f))
407
408
        helper.solve_dynamic_iterative(omega=f)
409
        helper.form_polarizability()
410
        assert np.allclose(polar, helper.polar, rtol=0, atol=1.e-5)
411
412
        f = 0.0773178
413
        ref = np.array([
414
             [8.19440121,
                           0.0000000, 0.0000000],
415
             [0.0000000, 12.75967150, 0.00000000],
416
             [0.0000000, 0.0000000, 10.25213939]
417
        ])
418
419
        print('\n')
420
        print('@test_CPHF running solve_dynamic_direct ({})'.format(f))
421
422
        helper.solve dynamic direct(omega=f)
423
        helper.form_polarizability()
424
        assert np.allclose(ref, helper.polar, rtol=0, atol=1.e-5)
425
426
        print('\n')
427
        print('@test_CPHF running solve_dynamic_iterative ({})'.format(f))
428
429
        helper.solve_dynamic_iterative(omega=f)
430
        helper.form_polarizability()
431
        assert np.allclose(ref, helper.polar, rtol=0, atol=1.e-5)
432
     .....
 1
    A reference implementation to compute the first dipole
 2
    hyperpolarizability $\beta$ from a restricted HF reference using the
 3
    $2n+1$ rule from perturbation theory.
 4
 5
   References:
 6
    Equations taken from [Karna:1991:487], http://dx.doi.org/10.1002/jcc.540120409
 7
     .....
 8
 9
                   = "Eric J. Berquist"
10
    __authors__
```

```
__credits__ = ["Eric J. Berquist"]
11
12
    __copyright__ = "(c) 2014-2017, The Psi4NumPy Developers"
13
   __license__ = "BSD-3-Clause"
14
                  = "2017-08-26"
   __date__
15
16
    from itertools import permutations, product
17
18
    import numpy as np
19
   np.set_printoptions(precision=5, linewidth=200, suppress=True)
20
21
    import psi4
    from helper_CPHF import helper_CPHF
22
23
    # Memory for Psi4 in GB
^{24}
    psi4.set_memory('2 GB')
25
   psi4.core.set_output_file("output.dat", False)
26
27
   mol = psi4.geometry("""
28
   0
29
   H 1 1.1
30
   H 1 1.1 2 104
31
32
    symmetry c1
    """)
33
34
    # Set options for CPHF
35
    psi4.set_options({"basis": "aug-cc-pvdz",
36
                       "scf_type": "direct",
37
                       "df_scf_guess": False,
38
                       "e_convergence": 1e-9,
39
                       "d convergence": 1e-9})
40
41
    # Compute the (first) hyperpolarizability corresponding to static
42
    # fields, beta(0;0,0), eqns. (IV-2a) and (VII-4).
43
44
   helper = helper_CPHF(mol)
45
   # For the 2n+1 rule, the quadratic response starting quantities must
46
   # come from linear response.
47
   helper.run()
48
49
   na = np.newaxis
50
   moenergies = helper.epsilon
51
   C = np.asarray(helper.C)
52
   Co = helper.Co
53
   Cv = helper.Cv
54
   nbf, norb = C.shape
55
   nocc = Co.shape[1]
56
57
   nvir = norb - nocc
   nov = nocc * nvir
58
   x = np.asarray(helper.x)
59
   ncomp = x.shape[0]
60
    integrals_ao = np.asarray([np.asarray(dipole_ao_component)
61
62
                                for dipole_ao_component in helper.tmp_dipoles])
63
64
    # form full MO-basis dipole integrals
```

```
integrals_mo = np.empty(shape=(ncomp, norb, norb))
65
    for i in range(ncomp):
66
         integrals_mo[i] = (C.T).dot(integrals_ao[i]).dot(C)
67
68
    # repack response vectors to [norb, norb]; 1/2 is due to X + Y
69
    U = np.zeros_like(integrals_mo)
70
    for i in range(ncomp):
71
        U[i, :nocc, nocc:] = 0.5 * x[i].reshape(nocc, nvir)
72
        U[i, nocc:, :nocc] = -0.5 * x[i].reshape(nocc, nvir).T
73
74
    # form G matrices from perturbation and generalized Fock matrices; do
75
    # one more Fock build for each response vector
76
    jk = psi4.core.JK.build(helper.scf_wfn.basisset())
77
    jk.initialize()
78
    G = np.empty_like(U)
79
    R = psi4.core.Matrix(nbf, nocc)
80
    npR = np.asarray(R)
81
    for i in range(ncomp):
82
        V = integrals_mo[i]
83
84
         # eqn. (III-1b) Note: this simplified handling of the response
85
         # vector transformation for the Fock build is insufficient for
86
         # frequency-dependent response.
87
        jk.C_clear()
88
         # Psi4's JK builders don't take a density, but a left set of
89
         # coefficients with shape [nbf, nocc] and a right set of
90
         # coefficents with shape [nbf, nocc]. Because the response vector
91
         # describes occ -> vir transitions, we perform ([nocc, nvir] *
92
         # [nbf, nvir] ^T) ^T.
93
        L = Co
94
        npR[:] = x[i].reshape(nocc, nvir).dot(np.asarray(Cv).T).T
95
        jk.C_left_add(L)
96
        jk.C right add(R)
97
        jk.compute()
98
         # 1/2 is due to X + Y
99
        J = 0.5 * np.asarray(jk.J()[0])
100
        K = 0.5 * np.asarray(jk.K()[0])
101
102
         # eqn. (21b)
103
        F = (C.T).dot(4 * J - K.T - K).dot(C)
104
        G[i] = V + F
105
106
    # form epsilon matrices, eqn. (34)
107
    E = G.copy()
108
    omega = 0
109
    for i in range(ncomp):
110
        eoU = (moenergies[..., na] + omega) * U[i]
111
        Ue = U[i] * moenergies[na]
112
        E[i] += (eoU - Ue)
113
114
    # Assume some symmetry and calculate only part of the tensor.
115
    # eqn. (VII-4)
116
    hyperpolarizability = np.zeros(shape=(6, 3))
117
118
    off1 = [0, 1, 2, 0, 0, 1]
```

```
off2 = [0, 1, 2, 1, 2, 2]
119
    for r in range(6):
120
        b = off1[r]
121
        c = off2[r]
122
        for a in range(3):
123
            tl1 = 2 * np.trace(U[a].dot(G[b]).dot(U[c])[:nocc, :nocc])
124
             tl2 = 2 * np.trace(U[a].dot(G[c]).dot(U[b])[:nocc, :nocc])
125
            t13 = 2 * np.trace(U[c].dot(G[a]).dot(U[b])[:nocc, :nocc])
126
             tr1 = np.trace(U[c].dot(U[b]).dot(E[a])[:nocc, :nocc])
127
             tr2 = np.trace(U[b].dot(U[c]).dot(E[a])[:nocc, :nocc])
128
             tr3 = np.trace(U[c].dot(U[a]).dot(E[b])[:nocc, :nocc])
129
             tr4 = np.trace(U[a].dot(U[c]).dot(E[b])[:nocc, :nocc])
130
            tr5 = np.trace(U[b].dot(U[a]).dot(E[c])[:nocc, :nocc])
131
            tr6 = np.trace(U[a].dot(U[b]).dot(E[c])[:nocc, :nocc])
132
             tl = tl1 + tl2 + tl3
133
             tr = tr1 + tr2 + tr3 + tr4 + tr5 + tr6
134
            hyperpolarizability[r, a] = -2 * (tl - tr)
135
136
    ref_static = np.array([
137
        [0.0000001],
                         0.00000000,
                                        0.22843772],
138
        [ 0.00000000,
                         0.0000000, -25.35476040],
139
                         0.0000000, -10.84023375],
140
        [0.0000000]
        [ 0.0000000,
                         0.0000000.
                                        0.0000000].
141
        [ 0.22843772,
                         0.0000000,
                                        0.0000000].
142
         [0.0000000, -25.35476040],
                                        0.0000000]
143
    ])
144
    assert np.allclose(ref_static, hyperpolarizability, rtol=0.0, atol=1.0e-3)
145
    print('\nFirst dipole hyperpolarizability (static):')
146
    print(hyperpolarizability)
147
148
    # Compute the (first) hyperpolarizability corresponding to
149
    # second-harmonic generation, beta(-2w;w,w), eqns. (IV-2c) and
150
    # (VII-1). Because two different frequencies are involved, the linear
151
    # response equations must be solved twice.
152
153
    print('Setting up for second-harmonic generation (SHG) calculation...')
154
    # In SHG, the first frequency is doubled to obtain the second
155
    # frequency. All variables containing '1' correspond to the first
156
    # (set) frequency, and all variables containing '2' correspond to the
157
    # second (doubled) frequency.
158
    f1 = 0.0773178
159
    f2 = 2 * f1
160
161
    print('\nForming response vectors for {} a.u.'.format(f1))
162
    helper1 = helper_CPHF(mol)
163
    helper1.solve_dynamic_direct(omega=f1)
164
    helper1.form_polarizability()
165
    print(helper1.polar)
166
    print('\nForming response vectors for {} a.u.'.format(f2))
167
    helper2 = helper CPHF(mol)
168
    helper2.solve dynamic direct(omega=f2)
169
    helper2.form_polarizability()
170
    print(helper2.polar)
171
172
```

```
173
    rspvecs1 = helper1.x
    rspvecs2 = helper2.x
174
175
    # repack response vectors to [norb, norb]
176
    U1 = np.zeros_like(integrals_mo)
177
    U2 = np.zeros_like(integrals_mo)
178
179
    for i in range(ncomp):
         U1[i, :nocc, nocc:] = rspvecs1[i][nov:].reshape(nocc, nvir)
180
         U1[i, nocc:, :nocc] = rspvecs1[i][:nov].reshape(nocc, nvir).T
181
         U2[i, :nocc, nocc:] = rspvecs2[i][nov:].reshape(nocc, nvir)
182
         U2[i, nocc:, :nocc] = rspvecs2[i][:nov].reshape(nocc, nvir).T
183
184
    G1 = np.empty like(U1)
185
    G2 = np.empty_like(U2)
186
    R1_l = psi4.core.Matrix(nbf, nocc)
187
    R1_r = psi4.core.Matrix(nbf, nocc)
188
    R2_1 = psi4.core.Matrix(nbf, nocc)
189
    R2_r = psi4.core.Matrix(nbf, nocc)
190
    npR1_1 = np.asarray(R1_1)
191
    npR1_r = np.asarray(R1_r)
192
    npR2_1 = np.asarray(R2_1)
193
194
    npR2_r = np.asarray(R2_r)
    jk.C_clear()
195
    jk.C_left_add(Co)
196
    jk.C_right_add(R1_1)
197
    jk.C_left_add(Co)
198
    jk.C_right_add(R1_r)
199
    jk.C_left_add(Co)
200
201
    jk.C_right_add(R2_1)
202
    jk.C_left_add(Co)
    jk.C_right_add(R2_r)
203
    nCo = np.asarray(Co)
204
    # Do 4 Fock builds at a time: X/Y vectors for both frequencies; loop
205
    # over operator components
206
    for i in range(3):
207
         V = integrals_mo[i]
208
209
         x1 = U1[i, :nocc, :]
210
         y1 = U1[i, :, :nocc]
211
         x2 = U2[i, :nocc, :]
212
         y2 = U2[i, :, :nocc]
213
         npR1_1[:] = C.dot(x1.T)
214
         npR1_r[:] = C.dot(y1)
215
         npR2_1[:] = C.dot(x2.T)
216
         npR2_r[:] = C.dot(y2)
217
218
219
         jk.compute()
220
         J1_1 = -np.asarray(jk.J()[0])
221
         K1_l = -np.asarray(jk.K()[0])
222
         J1_r = np.asarray(jk.J()[1])
223
         K1_r = np.asarray(jk.K()[1])
224
         J2_1 = -np.asarray(jk.J()[2])
225
226
         K2_1 = -np.asarray(jk.K()[2])
```

```
227
         J2_r = np.asarray(jk.J()[3])
        K2_r = np.asarray(jk.K()[3])
228
         J1 = J1_1 + J1_r
229
         J2 = J2_1 + J2_r
230
        K1 = K1_1 + K1_r.T
231
        K2 = K2_1 + K2_r.T
232
233
        F1 = (C.T).dot(2 * J1 - K1).dot(C)
234
        F2 = (C.T).dot(2 * J2 - K2).dot(C)
235
        G1[i, ...] = V + F1
236
        G2[i, ...] = V + F2
237
238
    # form epsilon matrices, eqn. (34), one for each frequency
239
    E1 = G1.copy()
240
    E2 = G2.copy()
241
242
    for i in range(ncomp):
243
         eoU1 = (moenergies[..., na] + f1) * U1[i]
        Ue1 = U1[i] * moenergies[na]
244
        E1[i] += (eoU1 - Ue1)
245
         eoU2 = (moenergies[..., na] + f2) * U2[i]
246
        Ue2 = U2[i] * moenergies[na]
247
248
        E2[i] += (eoU2 - Ue2)
249
    # Assume some symmetry and calculate only part of the tensor.
250
251
    hyperpolarizability = np.zeros(shape=(6, 3))
252
    for r in range(6):
253
        b = off1[r]
254
         c = off2[r]
255
         for a in range(3):
256
             tl1 = np.trace(U2[a].T.dot(G1[b]).dot(U1[c])[:nocc, :nocc])
257
             t12 = np.trace(U1[c].dot(G1[b]).dot(U2[a].T)[:nocc, :nocc])
258
             tl3 = np.trace(U2[a].T.dot(G1[c]).dot(U1[b])[:nocc, :nocc])
259
             tl4 = np.trace(U1[b].dot(G1[c]).dot(U2[a].T)[:nocc, :nocc])
260
             tl5 = np.trace(U1[c].dot(-G2[a].T).dot(U1[b])[:nocc, :nocc])
261
             tl6 = np.trace(U1[b].dot(-G2[a].T).dot(U1[c])[:nocc, :nocc])
262
             tr1 = np.trace(U1[c].dot(U1[b]).dot(-E2[a].T)[:nocc, :nocc])
263
             tr2 = np.trace(U1[b].dot(U1[c]).dot(-E2[a].T)[:nocc, :nocc])
264
             tr3 = np.trace(U1[c].dot(U2[a].T).dot(E1[b])[:nocc, :nocc])
265
             tr4 = np.trace(U2[a].T.dot(U1[c]).dot(E1[b])[:nocc, :nocc])
266
             tr5 = np.trace(U1[b].dot(U2[a].T).dot(E1[c])[:nocc, :nocc])
267
             tr6 = np.trace(U2[a].T.dot(U1[b]).dot(E1[c])[:nocc, :nocc])
268
             tl = tl1 + tl2 + tl3 + tl4 + tl5 + tl6
269
             tr = tr1 + tr2 + tr3 + tr4 + tr5 + tr6
270
             hyperpolarizability[r, a] = 2 * (tl - tr)
271
272
    # pylint: disable=C0326
273
    ref = np.array([
274
         [0.0000000,
                         0.0000000,
                                        1.92505358],
275
         [0.0000000,
                         0.00000000, -31.33652886],
276
         [0.0000000,
                         0.0000000, -13.92830863],
277
         [0.0000000,
                         0.0000000,
                                        0.0000000],
278
         [-1.80626084,
                         0.0000000,
                                        0.0000000],
279
280
         [ 0.0000000, -31.13504192,
                                        0.0000000]
```

```
281
    ])
    ref_avgs = np.array([0.00000000, 0.00000000, 45.69300223])
282
    ref_avg = 45.69300223
283
284
    thresh = 1.0e-2
285
    # assert np.all(np.abs(ref - hyperpolarizability) < thresh)</pre>
286
287
    print('hyperpolarizability: SHG, (-{}; {}, {}), symmetry-unique components'.format(f2,
288
     \rightarrow f1, f1))
    print(hyperpolarizability)
289
    print('ref')
290
    print(ref)
291
292
    # Transpose all frequency-doubled quantities (+2w) to get -2w.
293
294
    for i in range(ncomp):
295
        U2[i] = U2[i].T
296
        G2[i] = -G2[i].T
297
        E2[i] = -E2[i].T
298
299
    # Assume some symmetry and calculate only part of the tensor. This
300
    # time, work with the in-place manipulated quantities (this tests
301
    # their correctness).
302
303
    mU = (U2, U1)
304
    mG = (G2, G1)
305
    me = (E2, E1)
306
307
    hyperpolarizability = np.zeros(shape=(6, 3))
308
    off1 = [0, 1, 2, 0, 0, 1]
309
    off2 = [0, 1, 2, 1, 2, 2]
310
    for r in range(6):
311
        b = off1[r]
312
         c = off2[r]
313
         for a in range(3):
314
             tl1 = np.trace(mU[0][a].dot(mG[1][b]).dot(mU[1][c])[:nocc, :nocc])
315
             tl2 = np.trace(mU[1][c].dot(mG[1][b]).dot(mU[0][a])[:nocc, :nocc])
316
             t13 = np.trace(mU[0][a].dot(mG[1][c]).dot(mU[1][b])[:nocc, :nocc])
317
             tl4 = np.trace(mU[1][b].dot(mG[1][c]).dot(mU[0][a])[:nocc, :nocc])
318
             t15 = np.trace(mU[1][c].dot(mG[0][a]).dot(mU[1][b])[:nocc, :nocc])
319
             tl6 = np.trace(mU[1][b].dot(mG[0][a]).dot(mU[1][c])[:nocc, :nocc])
320
             tr1 = np.trace(mU[1][c].dot(mU[1][b]).dot(me[0][a])[:nocc, :nocc])
321
             tr2 = np.trace(mU[1][b].dot(mU[1][c]).dot(me[0][a])[:nocc, :nocc])
322
             tr3 = np.trace(mU[1][c].dot(mU[0][a]).dot(me[1][b])[:nocc, :nocc])
323
             tr4 = np.trace(mU[0] [a].dot(mU[1] [c]).dot(me[1] [b])[:nocc, :nocc])
324
             tr5 = np.trace(mU[1][b].dot(mU[0][a]).dot(me[1][c])[:nocc, :nocc])
325
             tr6 = np.trace(mU[0] [a].dot(mU[1] [b]).dot(me[1] [c])[:nocc, :nocc])
326
             tl = [tl1, tl2, tl3, tl4, tl5, tl6]
327
             tr = [tr1, tr2, tr3, tr4, tr5, tr6]
328
             hyperpolarizability [r, a] = 2 * (sum(t1) - sum(tr))
329
330
    assert np.all(np.abs(ref - hyperpolarizability) < thresh)</pre>
331
332
333
    # Assume no symmetry and calculate the full tensor.
```

```
334
    hyperpolarizability_full = np.zeros(shape=(3, 3, 3))
335
336
     # components x, y, z
337
    for ip, p in enumerate(list(product(range(3), range(3), range(3)))):
338
         a, b, c = p
339
         tl, tr = [], []
340
         # 1st tuple -> index a, b, c (*not* x, y, z!)
341
         # 2nd tuple \rightarrow index frequency (0 \rightarrow -2w, 1 \rightarrow +w)
342
         for iq, q in enumerate(list(permutations(zip(p, (0, 1, 1)), 3))):
343
             d, e, f = q
344
             tlp = (mU[d[1]][d[0]]).dot(mG[e[1]][e[0]]).dot(mU[f[1]][f[0]])
345
             tle = np.trace(tlp[:nocc, :nocc])
346
             tl.append(tle)
347
             trp = (mU[d[1]][d[0]]).dot(mU[e[1]][e[0]]).dot(me[f[1]][f[0]])
348
             tre = np.trace(trp[:nocc, :nocc])
349
             tr.append(tre)
350
         hyperpolarizability_full[a, b, c] = 2 * (sum(tl) - sum(tr))
351
    print('hyperpolarizability: SHG, (-{}; {}, {}), full tensor'.format(f2, f1, f1))
352
    print(hyperpolarizability_full)
353
354
     # Check that the elements of the reduced and full tensors are
355
     # equivalent.
356
357
    for r in range(6):
358
         b = off1[r]
359
         c = off2[r]
360
         for a in range(3):
361
             diff = hyperpolarizability[r, a] - hyperpolarizability_full[a, b, c]
362
             assert abs(diff) < 1.0e-14
363
```

# 6.9.2 Hyperpolarizability Tutorial

```
"""Tutorial: SCF first hyperpolarizability"""
1
2
                 = "Eric J. Berquist"
   __author__
3
                 = ["Eric J. Berquist"]
   __credit__
4
5
   __copyright__ = "(c) 2014-2017, The Psi4NumPy Developers"
6
   __license__
                 = "BSD-3-Clause"
7
                 = "2017-12-19"
   __date__
```

**6.9.2.1** Introduction In Tutorial 6a, the calculation of linear response properties from analytic derivative theory is presented, the foundation of which are the coupled-perturbed Hartree–Fock (CPHF) or coupled-perturbed self-consistent field (CPSCF) equations. Starting from analytic derivative theory provides a convenient physical picture: how does the total energy of a system change under the influence of one or more internal or external per-

turbations? Continuing the case of an external electric field, the total energy of a system can be represented with a series expansion:

$$E(\mathbf{E}) = \sum_{n=0}^{\infty} \frac{1}{n!} E^{(n)}(\mathbf{a}) \cdot (\mathbf{E} - \mathbf{a})^n, \qquad (6.7)$$

where the electric field is  $\mathbf{E} = \vec{E} = (E_x, E_y, E_z)$  and **a** is the expansion point. In practice, we always expand around  $\mathbf{a} = \mathbf{0}$ , so it is a Maclaurin series:

$$E(\mathbf{E}) = \sum_{n=0}^{\infty} \frac{1}{n!} \mathbf{E}^{(n)}(\mathbf{0}) \cdot \mathbf{E}^{n}.$$
(6.8)

Expanding the above to the first 4 explicit terms gives

$$E(\mathbf{E}) \approx E^{(0)}(\mathbf{0}) + \mathbf{E}^{(1)}(\mathbf{0}) \cdot \mathbf{E} + \frac{1}{2}\mathbf{E}^{(2)}(\mathbf{0}) \cdot \mathbf{E}^{2} + \frac{1}{6}\mathbf{E}^{(3)}(\mathbf{0}) \cdot \mathbf{E}^{3},$$
(6.9)

where we identify

 $E^{(0)} \to$ the unperturbed ground-state energy (6.10)

$$E_a^{(1)} \to -\mu_a$$
, the dipole moment (6.11)

$$E_{ab}^{(2)} \to -\alpha_{ab}$$
, the polarizability (6.12)

$$E_{abc}^{(3)} \to -\beta_{abc}$$
, the first hyperpolarizability (6.13)

The first hyperpolarizability is the leading-order term that describes the *nonlinear* response of a system to an external electric field. Each term in the series expansion increases the rank of the coefficient by one: the ground-state energy is a scalar, the dipole is a length 3 vector, the polarizability is a 3-by-3 matrix, and the first hyperpolarizability is a 3-by-3-by-3 tensor.

Translated into the language of analytic derivative theory, is it represented as

$$\beta_{abc} = \left. \frac{\partial^3 E}{\partial E_a \partial E_b \partial E_c} \right|_{\mathbf{E}=\mathbf{0}},\tag{6.14}$$

though it is not yet clear how to take derivatives of the energy beyond what is presented in tutorial 6a. Additionally, nothing has been stated about time dependence; everything to this point has been the static case, where the strength of fields do not vary with time. We will first incorporate time dependence, and equations for derivative theory will result. **6.9.2.2** Notation Before going further, some notational conventions should be mentioned. When used as field indices,  $a, b, c, \dots \in \{x, y, z\}$ , the three Cartesian directions.

For matrix indices,  $\mu, \nu, \lambda, \sigma, \ldots$  label atomic orbitals (AOs)/basis functions,  $i, j, k, l, \ldots$ label occupied molecular orbitals (MOs),  $a, b, c, d, \ldots$  label unoccupied/virtual MOs, and  $p, q, r, s, \ldots$  label all MOs. Einstein summation is used, so repeated indices are contracted over.

**6.9.2.3 Derivation** Again, write the total Hamiltonian as the sum of unperturbed and perturbed components

$$\hat{H}(\mathbf{E},t) = \hat{H}^{(0)} + \hat{V}(\mathbf{E},t)$$
$$\hat{V}(\mathbf{E},t) = -\mu \cdot \mathbf{E}(e^{\pm i\omega t} + 1)$$
(Karna 2)

where part of the external field now oscillates with some characteristic frequency  $\omega$ . This can be incorporated into the time-dependent Schrödinger equation, which for a stationary state obeys

$$\left[\hat{H}^{(0)} + \hat{V}(\mathbf{E}, t) - i\frac{\partial}{\partial t}\right]\psi(t) = 0, \qquad (\text{Karna 3})$$

$$FC - i\frac{\partial}{\partial t}SC = SC\epsilon,$$
 (Karna 5)

$$\frac{\partial}{\partial t}C^{\dagger}SC = 0, \qquad (\text{Karna 6})$$

where the full definition of the Fock matrix is

$$F_{\mu\nu} = h_{\mu\nu} + D_{\lambda\sigma} [2J_{\mu\nu\lambda\sigma} - K_{\mu\nu\lambda\sigma}]$$
 (Karna 9)

and the density matrix is defined as

$$D_{\mu\nu} = C_{\mu p} n_{pq} C^{\dagger}_{\nu q}, \qquad (\text{Karna 10})$$

where the diagonal occupation number matrix  $n_{ii} = 2$  and  $n_{aa} = 0$  for RHF.

In general, the MO coefficients are perturbation- and time-dependent, but the basis functions themselves are not. This means that when the series expansion for the perturbation above is performed on other quantities, only  $F, C, \epsilon$ , and D are affected. For example, the Lagrangian multiplier matrix  $\epsilon$  can be expanded as

$$\epsilon(\mathbf{E}) = \epsilon^0 + E_a \epsilon^a + \frac{1}{2!} E_a E_b \epsilon^{ab} + \frac{1}{3!} E_a E_b E_c \epsilon^{abc} + \cdots$$
 (Karna 17c)

where  $a, b, c, \ldots \in \{x, y, z\}$ , and

$$\epsilon^{a} = e^{\pm i\omega t} \epsilon^{a}(\pm \omega) + \epsilon^{a}(0), \qquad (\text{Karna 19a})$$

$$\epsilon^{ab} = e^{\pm 2i\omega t} \epsilon^{ab}(\pm \omega, \pm \omega) + e^{\pm i\omega t} \{ \epsilon^{ab}(0, \pm \omega) + \epsilon^{ab}(\pm \omega, 0) \} + \epsilon^{ab}(\pm \omega, \mp \omega) + \epsilon^{ab}(0, 0), \qquad (\text{Karna 19b})$$

$$\begin{aligned} \epsilon^{abc} &= e^{\pm 3i\omega t} \epsilon^{abc} (\pm \omega, \pm \omega, \pm \omega) + e^{\pm 2i\omega t} \{ \epsilon^{abc} (0, \pm \omega, \pm \omega) + \epsilon^{abc} (\pm \omega, 0, \pm \omega) + \epsilon^{abc} (\pm \omega, \pm \omega, 0) \} \\ &+ e^{\pm i\omega t} \{ \epsilon^{abc} (\pm \omega, \pm \omega, \mp \omega) + \epsilon^{abc} (\pm \omega, \mp \omega, \pm \omega) + \epsilon^{abc} (\mp \omega, \pm \omega, \pm \omega) \} \\ &+ e^{\pm i\omega t} \{ \epsilon^{abc} (0, 0, \pm \omega) + \epsilon^{abc} (0, \pm \omega, 0) + \epsilon^{abc} (\pm \omega, 0, 0) \} \\ &+ \{ \epsilon^{abc} (0, \pm \omega, \mp \omega) + \epsilon^{abc} (\pm \omega, 0, \mp \omega) + \epsilon^{abc} (\pm \omega, \mp \omega, 0) \} + \epsilon^{abc} (0, 0, 0), \end{aligned}$$
(Karna 19c)

showing that each order of the expansion consists of all possible phase combinations. For the first hyperpolarizability, only quantities with at most two field indices are required. Each permutationally unique subterm of the expansion corresponds to a different physical observable:

$$(0) \rightarrow \text{static polarizability} \rightarrow \alpha(0;0) = -Tr[H^a D^b(0)]$$

(Karna IV-1a)

$$(\pm\omega) \rightarrow \text{dynamic polarizability} \rightarrow \alpha(\mp\omega;\pm\omega) = -Tr[H^a D^b(\pm\omega)]$$
  
(Karna IV-1b)

 $(0,0) \rightarrow {\rm static} \ ({\rm first}) \ {\rm hyperpolarizability} \rightarrow \beta(0;0,0) = -Tr[H^a D^{bc}(0,0)]$ 

(Karna IV-2a)

 $(0, \pm \omega) \rightarrow \text{electrooptic Pockels effect (EOPE)} \rightarrow \beta(\mp \omega; 0, \pm \omega) = -Tr[H^a D^{bc}(0, \pm \omega)]$ (Karna IV-2b)

 $(\pm\omega,\pm\omega) \rightarrow$  second harmonic generation (SHG)  $\rightarrow \beta(\mp 2\omega;\pm\omega,\pm\omega) = -Tr[H^a D^{bc}(\pm\omega,\pm\omega)]$  (Karna IV-2c)

$$(\pm\omega,\mp\omega) \rightarrow \text{optical rectification} \rightarrow \beta(0;\pm\omega,\mp\omega) = -Tr[H^a D^{bc}(\pm\omega,\mp\omega)]$$
  
(Karna IV-2d)

where each property is calculated as the trace over the AO-basis dipole matrices  $H^a$  with the appropriate perturbed density. The task now comes down to calculating the necessary perturbed density for the phenomenon of interest. The second-order densities required for the four different first hyperpolarizabilities are

$$D^{ab}(\pm\omega,\pm\omega) = C^{ab}(\pm\omega,\pm\omega)nC^{0\dagger} + C^{a}(\pm\omega)nC^{b\dagger}(\mp\omega) + C^{b}(\pm\omega)nC^{a\dagger}(\mp\omega) + C^{0}nC^{ab\dagger}(\mp\omega,\mp\omega),$$
(Karna III-2a)

$$D^{ab}(0,\pm\omega) = C^{ab}(0,\pm\omega)nC^{b\dagger} + C^{a}(0)nC^{b\dagger}(\mp\omega)$$

$$+ C^{b}(\pm\omega)nC^{a\dagger}(0) + C^{0}nC^{ab\dagger}(0,\mp\omega),$$
(Karna III-2b)

$$D^{ab}(\pm\omega,\mp\omega) = C^{ab}(\pm\omega,\mp\omega)nC^{0\dagger} + C^{a}(\pm\omega)nC^{b\dagger}(\pm\omega)$$

$$+ C^{b}(\mp\omega)nC^{a\dagger}(\mp\omega) + C^{0}nC^{ab\dagger}(\mp\omega,\pm\omega),$$

$$D^{ab}(0,0) = C^{ab}(0,0)nC^{0\dagger} + C^{a}(0)nC^{b\dagger}(0)$$

$$+ C^{b}(0)nC^{a\dagger}(0) + C^{0}nC^{ab\dagger}(0,0).$$
(Karna III-2d)

	CI: MO/CI space	MCSCF: MO/CI space	RHF: MO space
Energy, $E$	$C^i_\mu,  C_I$	$C^i_\mu,C_I$	$C^i_\mu$
First Derivative, $\frac{\partial E}{\partial a}$	$U^a, C_I$	$C^i_\mu,C_I$	$C^i_\mu$
Second Derivative, $\frac{\partial^2 E}{\partial a \partial b}$	$U^{ab}, \frac{\partial C_I}{\partial a}$	$U^a, \frac{\partial C_I}{\partial a}$	$U^a$
Third Derivative, $\frac{\partial^3 E}{\partial a \partial b \partial c}$	$U^{abc}, \frac{\partial C_I}{\partial a}$	$U^a, \frac{\partial C_I}{\partial a}$	$U^a$
Fourth Derivative, $\frac{\partial^4 E}{\partial a \partial b \partial c \partial d}$	$U^{abcd}, \frac{\partial^2 C_I}{\partial a \partial b}$	$U^{ab}, \frac{\partial^2 C_I}{\partial a \partial b}$	$U^{ab}$
Fifth Derivative, $\frac{\partial^5 E}{\partial a \partial b \partial c \partial d \partial e}$	$U^{abcde}, \frac{\partial^2 C_I}{\partial a \partial b}$	$U^{ab}, \frac{\partial^2 C_I}{\partial a \partial b}$	$U^{ab}$

Table 37: Orders of MO coefficient derivatives and rotation matrices needed for energy derivatives following Wigner's 2n + 1 rule. Reproduced from Ref. [7].

Already a few important insights about the equations are revealed: Each perturbation index always carries its respective frequency, and the positive and negative frequencies are related by the Hermitian adjoint (except for  $C(-\omega) = -C^0 U^{\dagger}(+\omega)$ , Karna eq. 40). We also see the appearance of terms like  $C^{ab}$ , which will require  $U^{ab}$  originating from the second-order CPHF. Computationally, this is undesirable due to the increased number of iterative calculations that must be performed, so we borrow a trick that most prominently appears in perturbation theory.

## **6.9.2.4** Wigner's 2n + 1 rule From Schaefer,<sup>7</sup> page 25:

When the wavefunction is determined up to the *n*th order, the expectation value (electronic energy) of the the system is resolved, according to the results of perturbation theory, up to the (2n + 1)st order. This principle is called Wigner's 2n + 1 theorem.<sup>21,22</sup>

Since the first hyperpolarizability is calculated as a third derivative of the energy, perturbed coefficients with only one field index should be required. From table 37, we can also see why SCF gradients  $(\frac{\partial E}{\partial R_A})$ , where  $R_A$  is the A-th Cartesian component of nucleus R avoid the need to solve for U matrices.

**6.9.2.5** Final Expressions To this point, most work has been in the AO basis, but it is conceptually easier to work in the MO basis, in particular due to the use of the  $\epsilon$  equations

$$\epsilon^{a}(\pm\omega) = G^{a}(\pm\omega) + \epsilon^{0}U^{a}(\pm\omega) - U^{a}(\pm\omega)\epsilon^{0} \pm \omega U^{a}(\pm\omega), \qquad (\text{Karna 34})$$

where the G matrices are the MO-basis Fock matrices

$$G^{ab...} = C^{0\dagger} F^{ab...} C^0, (6.15)$$

and the U matrices are the MO-basis perturbation parameters

$$C^{ab...} = C^0 U^{ab...}, (6.16)$$

which will be discussed in the implementation. The final expression for the static hyperpolarizability is

$$\beta_{abc}(0;0,0) = Tr[n\{U^{a}(0)G^{b}(0)U^{c}(0) + U^{c}(0)G^{b}(0)U^{a}(0) + U^{b}(0)G^{c}(0)U^{a}(0) + U^{a}(0)G^{c}(0)U^{b}(0) + U^{c}(0)G^{a}(0)U^{b}(0) + U^{b}(0)G^{a}(0)U^{c}(0)\}]$$
(Karna VII-4)  
-  $Tr[n\{U^{a}(0)U^{c}(0)\epsilon^{b}(0) + U^{c}(0)U^{a}(0)\epsilon^{b}(0) + U^{b}(0)U^{a}(0)\epsilon^{c}(0) + U^{a}(0)U^{b}(0)\epsilon^{c}(0) + U^{c}(0)U^{b}(0)\epsilon^{a}(0) + U^{b}(0)U^{c}(0)\epsilon^{a}(0)\}].$ 

By noticing that each term corresponds to a unique permutation of the field indices, it can be rewritten as

$$\beta_{abc} = Tr\left[n\sum \mathcal{P}(d, e, f)U^{d}G^{e}U^{f}\right] - Tr\left[n\sum \mathcal{P}(d, e, f)U^{d}U^{e}\epsilon^{f}\right], \qquad (6.17)$$

where the permutation indices are initially assigned as d = a, e = b, f = c. The frequency notation has also been dropped, since each *abc* (and therefore each *def*) will always carry the appropriate field index, making this the most general form of the first hyperpolarizability. If the indices *abc* are also permuted, then all 27 components of the first hyperpolarizability tensor will be computed. **6.9.2.6 Computational Procedure** The basic quantities we need are the matrices  $C, \mu, F, \epsilon$ , and U. The MO coefficients C are already obtained from the ground-state calculation, along with  $\epsilon^0$  (the MO energies) and  $F^0$  (the AO-basis Fock matrix). The dipole matrices  $\mu$  are needed for the linear response (polarizability) calculation, which results in response vectors that compose the off-diagonal blocks of the  $U^a$  matrix.  $G^a$  is obtained from  $F^a$ , which comes from performing a single Fock build with the perturbed density  $D^a$ . Finally,  $\epsilon^a$  can be constructed.

Although the expressions so far are general for any frequency and first-order non-linear optical response, the tutorial implementation will cover the static case. For second-harmonic generation, see the reference implementation.

The energy and density convergence criteria are tightened from defaults, as response properties are sensitive to the quality of the ground-state wavefunction.

```
mol = psi4.geometry('''
1
        0
2
        H 1 0.9435
3
        H 1 0.9435 2 105.9443
4
        symmetry c1
5
   · · · )
6
   psi4.set_options({
\overline{7}
        "basis": "aug-cc-pVDZ",
8
        "scf_type": "direct",
9
        "df_scf_guess": False,
10
        "e_convergence": 1e-9,
11
        "d_convergence": 1e-9,
12
   })
13
   # This is to enable testing outside of the notebook environment.
1
\mathbf{2}
   import sys
   try:
3
4
        get_ipython()
        sys.path.append('../../Response-Theory/Self-Consistent-Field')
5
   except NameError:
6
        import os.path
7
        dirname = os.path.dirname(os.path.abspath(__file__))
8
        sys.path.append(os.path.join(dirname, '../../Response-Theory/Self-Consistent-Field'))
9
10
   from helper_CPHF import helper_CPHF
11
```

The helper encapsulates the solution of the ground-state wavefunction followed by the frequency–(in)dependent linear response equations,

$$\begin{bmatrix} \begin{pmatrix} \mathbf{A} & \mathbf{B} \\ \mathbf{B}^* & \mathbf{A}^* \end{pmatrix} - \omega_f \begin{pmatrix} \boldsymbol{\Sigma} & \boldsymbol{\Delta} \\ -\boldsymbol{\Delta}^* & -\boldsymbol{\Sigma}^* \end{pmatrix} \begin{bmatrix} \mathbf{X} \\ \mathbf{Y} \end{pmatrix} = \begin{pmatrix} \mathbf{V} \\ -\mathbf{V}^* \end{pmatrix}, \quad (6.18)$$

either directly (via matrix inversion in the MO basis) or iteratively (via repeated matrixvector products using Fock builds). For a HF/DFT reference with canonical orbitals, the above equations reduce to

$$\begin{bmatrix} \begin{pmatrix} \mathbf{A} & \mathbf{B} \\ \mathbf{B} & \mathbf{A} \end{pmatrix} - \omega_f \begin{pmatrix} \mathbf{1} & \mathbf{0} \\ \mathbf{0} & -\mathbf{1} \end{pmatrix} \end{bmatrix} \begin{pmatrix} \mathbf{X} \\ \mathbf{Y} \end{pmatrix} = \begin{pmatrix} \mathbf{V} \\ -\mathbf{V} \end{pmatrix}.$$
 (Neese 107)

In the static limit ( $\omega_f = 0$ ), the whole superoverlap matrix vanishes, and the CPHF equations can be reduced to those used in tutorial 6a.

```
solver = helper_CPHF(mol)
1
   solver.run()
2
   Number of occupied orbitals: 5
1
   Number of basis functions: 41
\mathbf{2}
3
   Tensor sizes:
4
   ERI tensor
                           0.02 GB.
\mathbf{5}
   oNNN MO tensor
                           0.00 GB.
6
   ovov Hessian tensor 0.00 GB.
7
8
   Forming Hessian...
9
   ...formed Hessian in 0.473 seconds.
10
11
   Inverting Hessian...
12
   ...inverted Hessian in 0.007 seconds.
13
```

Because the calculation of  $\beta$  requires  $U^a$ , we also obtain linear response properties from a quadratic response calculation. This holds for any order of response, where lower-order response functions are automatically obtained from higher-order response calculations.

```
print(np.around(solver.polar, 4))
```

1	[[ 7.2587	-0.	0. ]	
2	[-0.	8.7969	0. ]	
3	[ 0.	0.	7.854 ]	]

```
# epsilon ^{0}
1
   moenergies = solver.epsilon
2
   C = np.asarray(solver.C)
3
  Co = solver.Co
4
   Cv = solver.Cv
\mathbf{5}
   nbf, norb = C.shape
6
   nocc = Co.shape[1]
7
   nvir = norb - nocc
8
   nov = nocc * nvir
9
   # the response vectors X_x, X_y, X_z; Y_x, Y_y, Y_z not needed separately for static
10
    \rightarrow response
   x = np.asarray(solver.x)
11
   ncomp = x.shape[0]
12
   # reuse the AO-basis dipole integrals
13
   integrals_ao = np.asarray([np.asarray(dipole_ao_component)
14
                                for dipole_ao_component in solver.tmp_dipoles])
15
   print("dimension of response vectors from linear response: {}".format(x.shape))
16
   # for dynamic response, this will be (2 * nov)
17
   assert x.shape[1] == nov
18
```

```
1 dimension of response vectors from linear response: (3, 180)
```

The foundation of the CPHF equations is that the right-hand side  $\mathbf{V}$  is a perturbation on the wavefunction causing single excitations from the occupied orbitals to virtual orbitals, the coefficients of which are in the response vectors  $\mathbf{X}$ ; the vectors  $\mathbf{Y}$  describe single deexcitations. Because the full (square)  $\mathbf{U}$  matrices are required, all MO-based quantities must be of shape

 $[N_{orb}, N_{orb}]$  rather than  $[N_{occ}, N_{vir}]$ .

```
1 # form full MO-basis dipole integrals
2 integrals_mo = np.empty(shape=(ncomp, norb, norb))
3 for i in range(ncomp):
4 integrals_mo[i, ...] = (C.T).dot(integrals_ao[i, ...]).dot(C)
```

Similarly, **X** and **Y** form the off-diagonal blocks of the **U** matrices. They are usually stored as in DALTON, where each vector is of length  $2N_{ov}$ , with **X** on top of **Y**.

```
1 # repack response vectors to [norb, norb]; 1/2 is due to X + Y
2 U = np.zeros_like(integrals_mo)
3 for i in range(ncomp):
4 U[i, :nocc, nocc:] = 0.5 * x[i, ...].reshape(nocc, nvir)
5 U[i, nocc:, :nocc] = -0.5 * x[i, ...].reshape(nocc, nvir).T
```

A minor implementation detail: because this was not a frequency-dependent calculation, only  $\mathbf{X} + \mathbf{Y}$  needs to be calculated; as they are identical, this leads to the prefactor of 1/2.

```
1 # form G matrices from perturbation and generalized Fock matrices; do
2 # one more Fock build for each response vector
3 jk = psi4.core.JK.build(solver.scf_wfn.basisset())
4 jk.initialize()
```

```
5
   G = np.empty_like(U)
   R = psi4.core.Matrix(nbf, nocc)
6
   npR = np.asarray(R)
7
   for i in range(ncomp):
8
        V = integrals_mo[i, ...]
9
10
        # eqn. (III-1b)
11
        # Note: this simplified handling of the response vector
12
        # transformation for the Fock build is insufficient for
13
        # frequency-dependent response. 1/2 is due to X + Y
14
        jk.C_clear()
15
        L = Co
16
        npR[...] = x[i, ...].reshape(nocc, nvir).dot(np.asarray(Cv).T).T
17
        jk.C_left_add(L)
18
        jk.C_right_add(R)
19
20
        jk.compute()
        J = 0.5 * np.asarray(jk.J()[0])
21
        K = 0.5 * np.asarray(jk.K()[0])
22
23
        # eqn. (21b)
24
        F = (C.T).dot(4 * J - K.T - K).dot(C)
25
        G[i, \ldots] = V + F
26
27
    # form epsilon matrices, eqn. (34)
28
   E = G.copy()
^{29}
   omega = 0
30
   for i in range(ncomp):
31
        eoU = (moenergies[..., np.newaxis] + omega) * U[i, ...]
32
        Ue = U[i, ...] * moenergies[np.newaxis, ...]
33
        E[i, \ldots] += (eoU - Ue)
34
35
    # Assume some symmetry and calculate only part of the tensor.
36
    # eqn. (VII-4)
37
   hyperpolarizability = np.zeros(shape=(6, 3))
38
   off1 = [0, 1, 2, 0, 0, 1]
39
   off2 = [0, 1, 2, 1, 2, 2]
40
   for r in range(6):
41
        b = off1[r]
42
        c = off2[r]
43
        for a in range(3):
44
            tl1 = 2 * np.trace(U[a, ...].dot(G[b, ...]).dot(U[c, ...])[:nocc, :nocc])
45
            tl2 = 2 * np.trace(U[a, ...].dot(G[c, ...]).dot(U[b, ...])[:nocc, :nocc])
46
            tl3 = 2 * np.trace(U[c, ...].dot(G[a, ...]).dot(U[b, ...])[:nocc, :nocc])
47
            tr1 = np.trace(U[c, ...].dot(U[b, ...]).dot(E[a, ...])[:nocc, :nocc])
48
            tr2 = np.trace(U[b, ...].dot(U[c, ...]).dot(E[a, ...])[:nocc, :nocc])
49
            tr3 = np.trace(U[c, ...].dot(U[a, ...]).dot(E[b, ...])[:nocc, :nocc])
50
            tr4 = np.trace(U[a, ...].dot(U[c, ...]).dot(E[b, ...])[:nocc, :nocc])
51
            tr5 = np.trace(U[b, ...].dot(U[a, ...]).dot(E[c, ...])[:nocc, :nocc])
52
            tr6 = np.trace(U[a, ...].dot(U[b, ...]).dot(E[c, ...])[:nocc, :nocc])
53
            tl = tl1 + tl2 + tl3
54
            tr = tr1 + tr2 + tr3 + tr4 + tr5 + tr6
55
            hyperpolarizability[r, a] = -2 * (tl - tr)
56
   ref_static = np.array([
```

1

```
[ 0.00000001,
                        0.0000000, -0.10826460],
2
                        0.0000000, -11.22412215],
3
        [ 0.00000000,
                        0.0000000, -4.36450397],
        [ 0.00000000,
4
        [ 0.00000000,
                        0.00000000,
                                     -0.0000001],
5
        [-0.10826460, -0.00000001,
                                       0.0000000].
6
        [-0.0000001, -11.22412215,
                                       0.00000000]
7
8
   ])
   assert np.allclose(ref_static, hyperpolarizability, rtol=0.0, atol=1.0e-3)
9
   print('\nFirst dipole hyperpolarizability (static):')
10
   print(hyperpolarizability)
11
   First dipole hyperpolarizability (static):
1
   [[ -0.
                 -0.
                           -0.10826]
\mathbf{2}
    [ -0.
                 -0.
                          -11.22412]
3
    [ -0.
                 -0.
                           -4.3645]
4
    [ -0.
                 -0.
                                    ]
                             0.
5
                                    ]
    [ -0.10826
                0.
                            -0.
6
                -11.22412
                                    ]]
    [
       0.
                           -0.
7
```

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