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## RESEARCH ARTICLE

# Source–destination obfuscation in wireless *ad hoc* networks

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## ABSTRACT

The identity and/or location of communicating entities in wireless *ad hoc* networks is extremely important due to the potential of their being identified and subsequently subjected to cyber or physical attacks. In this paper, we show that a global attacker who can eavesdrop on the overall data transmissions and count them can simply visualize the transmissions and infer contextual information. Current approaches to obfuscate the locations of source and destinations do not provide protection against such attacks. We propose two novel techniques (1) SECLUD: Source and Destination Seclusion using Clouds to obfuscate the true source/destination nodes and make them indistinguishable among a group of neighbor nodes, and (2) ANONYRING: Anonymous Ring which hides the source/destination nodes within a group of nodes that form a ring. Both proposed techniques work well even under network-wide traffic visualization by a global attacker. Furthermore the proposed techniques are shown *via* simulation to be superior to existing schemes in the literature. Copyright © 2010 John Wiley & Sons, Ltd.

## KEYWORDS

*ad hoc*; obfuscation; anonymity; privacy; hiding; entropy; visual analytics

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## 1. INTRODUCTION

Malicious traffic analysis and privacy attacks against communicating nodes are passive and difficult to detect in large wireless *ad hoc* networks [1]. The disclosure of contextual information about network traffic patterns can be dangerous in sensitive application scenarios. For example, in tactical military wireless networks, command centers could be communicating with each other through an *ad hoc* network of intermediate nodes. Analysis of *traffic* in such an environment may reveal the locations of command centers which will enable the adversaries to launch targeted cyber or physical attacks on them. Hence, it is critical to hide the location of the source and destination for quasi-stationary communicating nodes in *ad hoc* networks.

Traffic analysis attacks make use of rate monitoring that involves counting the number of transmitted/received packets around network nodes and time-correlation analysis that involves finding communication patterns by analyzing latencies between packet transmissions around nodes. Both techniques can be used independently or together to determine the communicating source–destination node

pairs. Attackers can be broadly classified as either local or global. A local attacker can generally eavesdrop on transmitted packets around one node at a time and does not know the overall network topology. On the other hand, a global attacker [2] is able to visualize the overall network topology and is capable of network-wide traffic rate monitoring and time-correlation analysis.

Recently different methods have been proposed in the literature for defending against traffic analysis and location privacy related attacks in wireless networks [2–5]. These approaches provide some level of protection against attackers by thwarting traffic analysis attacks and misleading attackers with randomized or fake traffic [1–4,6–8]. However, several of these approaches primarily deal with location privacy in wireless sensor networks where the entity to be protected is a sink node [3,5] or specific sensing sources [6–8]. Furthermore, existing solutions to obfuscate the locations of source or destination nodes do not work well when a global attacker exists.

In this paper, we address the problem of hiding the source/destination nodes from an attacker with a complete view of the network topology and traffic. We propose two

1 simple and efficient techniques for protection against such  
2 a global adversary: (i) SECLUD: source and destination  
3 Seclusion using Clouds, that hides the source and desti-  
4 nation nodes in a group of nodes (called a ‘cloud’) that  
5 are indistinguishable and (ii) ANONYRING: Anonymous  
6 source/destination transmission using a Ring communi-  
7 cation path that obfuscates the source and destination nodes  
8 in a set of identical nodes comprising a ring. The per-  
9 formance of SECLUD and ANONYRING are evaluated  
10 assuming a sophisticated global attacker capable of using  
11 network-wide traffic visualization. We compare SECLUD  
12 and ANONYRING with two commonly used obfuscation  
13 techniques, Random Walk (RW) and Fractal Propagation  
14 (FP) [3,7] using overhead, anonymity, and unlinkability  
15 as metrics. Our simulation results and analyses show that  
16 SECLUD and ANONYRING provide better anonymity  
17 than either RW or FP schemes in the presence of a global  
18 traffic visualization attack, while having a comparable  
19 overhead. Additionally, we show that entropy, which is a  
20 commonly used metric, is not always an adequate measure  
21 of the degree of anonymity provided by a technique.

The rest of the paper is organized as follows. Section 2  
describes related work on obfuscation/privacy techniques.  
The attacker model, network assumptions, and performance  
metrics are presented in Section 3. The details of the  
SECLUD and ANONYRING protocols are explained in  
Sections 4 and 5, respectively. Section 6 presents the results  
with comparative performance evaluation and discussions.  
Section 7 concludes the paper.

## 2. RELATED WORK

Here, we briefly summarize related literature on hiding  
source and destination nodes in wireless networks fol-  
lowed by a more detailed description of the Random Walk  
and Fractal Propagation schemes since we use them for a  
comparison with our proposed schemes. While these tech-  
niques are effective against local attacks, they have not been  
extensively evaluated under global attack conditions. As  
we show later, eavesdropping by a global attacker (which  
can count packets and visualize the network-wide traffic)  
can expose the source and destination regions. We note  
here that most of the current research work assumes that  
all packets are encrypted link-by-link, padded to prevent  
potential packet type identification through size, and use  
anonymous routing schemes to avoid detection of routes  
during route set-up. Energy constraints and overhead are  
typically not factored because the underlying assumption is  
that obfuscation requires transmission of dummy packets.

Phantom routing is a source-node location hiding tech-  
nique used in References [6,9] to protect against the threat  
of a local attacker. In this technique each packet poten-  
tially traverses a different random path of distance  $H$ -hops  
to a phantom source (i.e., a bogus source node) in the net-  
work. Then, the phantom source uses either shortest path  
[6] or localized flooding [9] to send packets to the final  
destination. This scheme prevents attackers from discov-

ering the source node’s true location by eavesdropping on  
wireless links hop-by-hop. A similar idea is used in Ref-  
erence [10], where a path confusion algorithm is used to  
increase source location anonymity under a local adversary  
model. Mehta *et al.* in Reference [2] proposed a scheme  
under a global attack model by hiding the real source among  
 $k - 1$  fake sources that emulate the information sensing pat-  
tern of real sources in a sensor network. In Reference [8],  
under a global attack model, the authors proposed statisti-  
cally strong source anonymity by employing network-wide  
dummy messages to achieve global privacy. In Reference  
[4], the authors introduce a similar approach with care-  
fully chosen dummy traffic to hide the real event sources in  
combination with mechanisms to drop dummy messages to  
prevent an explosion of network traffic. Some sensor nodes  
act as proxies that proactively filter dummy messages on  
their way to the base station destination. The amount of  
dummy traffic and location & number of fake sources are  
important factors that determine the effectiveness of the  
aforementioned obfuscation mechanisms.

### 2.1. Random walk

In Random Walk-based (RW) obfuscation schemes [6,9],  
packets at a node are forwarded probabilistically to one  
of the neighbor nodes within transmission range, and this  
process continues at each node until the packets reach  
the destination. This method diversifies routing paths in  
an unpredictable manner, to avoid rate monitoring attacks  
against a local eavesdropper. The ability to hide sources and  
destinations is controlled by the probability  $P_r$  to forward  
in the direction of the destination and probability  $(1 - P_r)$   
to randomly forward to one of neighboring nodes [3].

The RW scheme is effective against local attackers with  
no prior knowledge of the overall network topology and  
it increases the complexity and attack time to search for  
the destination in large *ad hoc* networks. However, it gen-  
erally leads to a longer routing path on average than the  
shortest path. This in turn incurs a much higher energy con-  
sumption and additional delay that is proportional to the  
extra distance required to forward packets to the destination.  
The effectiveness of RW depends on the network’s node  
degree, connectivity, and the source-destination distance.  
Directed Random Walk (DRW) proposed in Reference [9]  
is an evolved version of RW that makes use of directional  
information to obfuscate forwarding of packets. DRW con-  
siders two groups of neighbor nodes in opposing directions  
in which one node is randomly picked so that the walk (i.e.,  
packet forwarding path) leaves the source area to reach the  
destination. However, grouping the neighbor nodes based  
on direction requires location information. Xi *et al.* [7]  
proposed another RW improvement, referred as Greedy  
Random Walk (GROW) scheme, for preserving location  
privacy of the source node. GROW uses a bi-directional  
random walk on a per-packet basis from the main source  
and destination to confuse a local eavesdropper from trac-  
ing the communication path. GROW enhances the basic RW

by using local broadcasting and filtering. From the source, each node forwards packets randomly by broadcasting to its least used neighbor node for a certain minimum number of hops until it intersects a randomly pre-established receptor node along the destination path at some point. Overall, the RW based schemes show that using erratic per-packet routes is very effective in resisting rate monitoring and traffic analysis attacks by adversaries monitoring a limited set of nodes.

## 2.2. Fractal propagation

Deng *et al.*, [3] proposed fractal propagation (FP) to counteract local rate monitoring and correlation attacks in sensor networks. Fractal propagation overcomes one of the drawbacks of the random walk scheme by introducing fake packets which are spread out to combat time correlation attacks [3]. When a node forwards a real packet, its neighbor nodes can generate a fake packet with probability ( $P_f$ ). The fake packet is forwarded to a randomly chosen neighbor node each time over a propagation distance of  $k$ -hops. The propagation distance  $k$  of the fake packets causes network traffic to appear spread out along different routes resulting in tree-like transmission paths that are more diffuse than the random walk method. Thus, a local attacker takes more time to find the path taken by real packets as it cannot differentiate between encrypted real packets and encrypted fake packets. The performance of fractal propagation can be adjusted by varying the parameters  $P_f$  and  $k$ . Higher traffic randomness and path confusion is achieved by increasing  $P_f$  and  $k$ , but the overhead/energy cost will also increase rapidly as well, as more packets collide and higher packet loss rates occur, especially near the destination node.

## 3. MODELS AND ASSUMPTIONS

### 3.1. Network model

Our assumptions are consistent with most of the related work in the literature. Specifically, we consider an *ad hoc* network with nodes being distributed either in a grid like manner or randomly. All the MAC and routing protocol messages are assumed to be encrypted so that no leakage of information occurs to the adversary. The nodes' MAC address, IP address and node IDs are also hidden and not advertised. In Reference [11] the authors used short-lived disposable MAC addresses to prevent the real node IDs from being revealed to adversaries. A similar technique is assumed here to avoid identification of nodes.

We assume the existence of a key management protocol that can distribute pair-wise keys between nodes or public-secret key pairs for each node [12,13]. Any of these schemes can be used to set up pairwise keys and authenticate node relationships and we omit the details here. Each packet is encrypted and authenticated so that an adversary cannot decrypt or modify the contents of an eavesdropped packet

transmission. All packets are transmitted in the same format and have same length (by padding or fragmenting). Finally, route discovery communications are assumed to be anonymous using any of the anonymous routing protocols such as in References [14–18]. An anonymous routing protocol allows neighbor nodes to authenticate each other without revealing their identities. For example, in Reference [14] the anonymous neighbor authentication is based on dynamically changing pseudonyms of nodes instead of their real identifiers or MAC addresses. Anonymous route discovery and data forwarding employs pairwise *shared link identifiers* between neighbor nodes which are created and established during neighborhood authentication.

### 3.2. Attack model

An external, global attacker model is assumed in this paper that has the combined capabilities of different existing attack models as described in References [2,3,19]. The attacker has complete knowledge of the network topology and can keep statistical measurements for all of the network traffic. We assume that the global attacker can perform rate monitoring and time correlation analysis for all traffic in the network (which is a stronger attack than corresponding ones assumed elsewhere). The attacker can visualize statistics (e.g., packet count in a time window) of all transmitted/received packets in the network and determine the traffic density on every link in the network. Furthermore, we assume the attacker can use advanced visualization techniques such as edge detection image processing algorithms to possibly extract the traffic pattern. Details are provided in Section 6.

A possible method for the global attack above is deploying an overlay/underlay network with several malicious nodes simply to passively sense traffic from the given *ad hoc* network, similar to the idea in Reference [2]. These nodes can collect information and collaborate with a centralized entity using a different band.

### 3.3. Evaluation metrics

We analyze the performance of SECLUD, ANONYRING, Random Walk, and Fractal Propagation using the metrics— anonymity, unlinkability [19], entropy, and the overhead incurred by the technique.

#### 3.3.1. Anonymity.

Anonymity means hiding information about which node behaves as the source or the destination. The level of anonymity  $\lambda$  is defined as the probability that a node of interest is incorrectly identified in an anonymous group [19]. If a node is hidden among a set  $A$  of nodes that have identical behavior, then the level of anonymity is  $\lambda = 1 - (1/|A|)$  where  $|A|$  is the size of a set  $A$ . Thus, the anonymity level of a node (source or destination in our



case) depends on the number of nodes in the anonymous zone. If the source node is hidden in a set of nodes  $A_S$  and the destination is hidden in a disjoint set of nodes  $A_D$  then the anonymity of the source–destination pair is given by  $\lambda = 1 - (1/|A_S|)(1/|A_D|)$ . Untraceability is a similar notion that indicates how difficult it is for an adversary to identify the packet transmissions from a source based on receptions at the destination.

### 3.3.2. Unlinkability.

Unlinkability is a generalization of the notion of anonymity and untraceability, (i.e., hiding any contextual information about the relationship between source–destination pairs). We employ a 2-D packet count matrix and a 3-D graph of transmitted data around nodes to determine whether or not a global attacker can visualize the existence of communication between a source and destination and thus link them.

### 3.3.3. Entropy.

Entropy is a common metric for quantifying uncertainty in information theory and is often used as a measure of ‘hiding’ or ‘privacy’ [3] since an increase in entropy is indicative of an increase in uncertainty in information. An entropy-based measure of privacy is given as  $H = -\sum_x p_x \log_2 p_x$  where  $p_x$  is the probability for the attacker that the observed data transmissions were from node  $x$  in the anonymity set  $A$  of size  $|A|$ . It can be normalized to obtain a privacy metric value between 0 (no privacy) and 1 (guaranteed perfect privacy), as  $\epsilon = H/H_{\max}$ , where  $H_{\max} = -\log_2 p_x$  with  $p_x = 1/|A|$ . While entropy is an appealing concept providing a scalar number for privacy, it does not capture the amount of contextual information available that can disclose the location of source and destination nodes. For example, most nodes may be sending roughly similar numbers of packets. This results in a high average entropy. But the few nodes that send more packets may be sufficient to reveal the identity or location of a source or destination node. We will show in our simulation based results that an increasing entropy value does not necessarily imply that the source–destination nodes are adequately hidden.

### 3.3.4. Overhead.

We define the transmission overhead factor (TOF) as the ratio of total number of packets transmitted by nodes using an obfuscation technique to the total number of transmissions without the obfuscation technique using simply shortest path routing between source and destination nodes. The transmission overhead is also directly related to the energy consumption of nodes when using the obfuscation mechanisms for communication.

## 4. THE SECLUD PROTOCOL

The general idea of SECLUD, is to seclude the source and destination node locations within a cloud of irregular shape

that is constructed using its neighboring nodes. The details of this protocol are explained in the following.

Let  $S$  denote the source node and  $D$  denote the destination node of the communicating node pair. The protocol first conducts neighborhood discovery to form the potential cloudy region around the source and destination. The source node  $S$  first broadcasts a hello message to discover all its one-hop neighbors  $N_S(1, i)$  for  $i = (1, 2, \dots, m)$ , where  $m$  is the total number of neighbor nodes. Then, the nodes in  $N_S(1, i)$  discover their respective neighbors  $N_S(2, i)$  which are two-hops away from node  $S$ . Consequently, source node  $S$  constructs the list:  $R_S = \{N_S(1, i), N_S(2, i), N_S(3, i), \dots, N_S(k, i)\}$ , where  $N_S(k, i)$  is the set of  $k$ th hop neighbors of node  $S$ . This initialization process of neighbor discovery is done periodically by all nodes  $i$  in the network, for  $(1 \leq i \leq n)$ . This will ensure that the attacker cannot determine which of the nodes performing the initialization will be the source.

Once the source node has identified the set  $R_S$  of  $k$  nearest neighbors, it forms a cloud by first selecting the center point of the cloud  $N_o$  arbitrarily from  $R_S$ . As an example, let  $k = 3$ . The source node  $S$  will then request node  $N_o$  to send its set of  $k$  neighbor nodes  $R_o = \{N_o(1, i), N_o(2, i), N_o(3, i)\}$ . It will randomly select a set of nodes,  $B$  for the cloud, such that  $B \subseteq R_o$ . This will keep the cloud region irregular—the source cannot be predicted to be in the center of the cloud for example. The nodes in  $B$  will be marked as pseudo-sources in the cloud and are requested to transmit encrypted dummy packets at a rate similar to the source transmission rate. Dummy packets are simply dropped. The destination node  $D$  will also follow the same initialization procedure to construct a cloud. *Note the size of the source and the destination clouds can be different by using different values of  $k$  and  $B$  for each, depending on the obfuscation strength needed on each side.*

Let  $B_S$  denote the size of the source cloud drawn from a set of  $k_S$  hop neighbors and  $B_D$  denote the size of the destination cloud which is drawn from a set of  $k_D$  hop neighbors. To further hide the source and destination in their respective clouds we use the concept of a delegated source and destination which is similar to the phantom source concept of Kamat [6]. Node  $S$  randomly selects one or more nodes from the set  $B_S$  to act as *delegated sources*. Similarly  $D$  randomly selects one or more nodes in its cloud  $B_D$  to act as *delegated destinations*. The delegated sources are required to have connectivity (typically multi-hop) with the source  $S$ . Similarly the delegated destinations must have connectivity with the destination  $D$ . Real packets are relayed locally from  $S$  to the delegated sources. A delegated source node will set up route(s) to forward real packets to reach a delegated destination node. Thus, real packet traffic will ‘move’ from the source cloud to the destination cloud *via* the route(s) between a delegated source–destination pair. After reaching the delegated destinations, real packets are forwarded locally to the actual destination  $D$ . Delegated sources find routes to delegated destinations using a suitable anony-

1 mous routing protocol (e.g., see References [14,15]). The  
 2 delegated source–destination nodes hide the communica-  
 3 tions of the real source with the real destination. In the  
 4 event a delegated source or destination node is attacked, the  
 5 protocol can include options to chose and set-up another dele-  
 6 gated source–destination pair to resume communications  
 7 through a new route. If we do not use delegated source–  
 8 destination nodes, and if the source from one cloud sends  
 9 packets directly to the destination in the other cloud, then  
 10 the route between the source and destination may possibly  
 11 be disclosed.

12 With the above set-up, SECLUD achieves  
 13 source/destination privacy in a local region. In a single  
 14 source–destination scenario, the global attacker will  
 15 have to guess the source from the set of nodes  $B_S$  and the  
 16 destination from the set of nodes  $B_D$ . Assuming that  $B_S$   
 17 and  $B_D$  are disjoint, SECLUD results in the commu-  
 18 nicating pair anonymity level of  $\lambda = 1 - (1/B_S)(1/B_D)$ .  
 19 To further improve the hiding of sources/destinations one  
 20 can simply increase the size of the clouds ( $B_S, B_D$ ) used.  
 21 Additionally, SECLUD can create fake sources and fake  
 22 destination clouds as well. The fake sources/destination  
 23 clouds will behave in a manner similar to the real source  
 24 destination clouds and will communicate with each other.  
 25 Fake clouds increase the likelihood of misleading the  
 26 attacker who may attack (e.g., by jamming) the fake  
 27 clouds instead of the real clouds. Obviously the fake  
 28 clouds will improve the anonymity but at the expense  
 29 of additional overhead. Specifically, with  $f$  disjoint fake  
 30 clouds each using the same cloud sizes as the true source  
 31 and destination  $B_S$  and  $B_D$ , the anonymity becomes  
 32  $\lambda = 1 - (1/(f + 1))(1/(B_S))(1/(B_D))$ .

33 The transmission overhead factor of SECLUD for the  
 34 single source–destination scenario assuming only a single  
 35 delegated source–destination pair can be estimated as fol-  
 36 lows. Let  $L$  be the length of the shortest path between  
 37  $S$  and  $D$  and  $L_B$  be the length of the path between  
 38 the source  $S$  through a delegated source–destination pair  
 39 to the destination  $D$ . Then the transmission overhead  
 40 factor—TOF—consists of the dummy packets transmitted  
 41 within the clouds and the additional transmissions arising  
 42 from using the longer route through a delegated source–  
 43 destination pair. Assuming all nodes involved in SECLUD  
 44 transmit the same number of packets, TOF can be approx-  
 45 imated as  $\text{TOF} \approx (B_S + B_D + L_B)/L$ . If we use  $f$  fake  
 46 clouds and each fake cloud transmits the same number of  
 47 packets as the real clouds, the transmission overhead factor  
 48 becomes  $\text{TOF} \approx (f + 1)(B_S + B_D + L_B)/L$ .

## 5. THE ANONYRING PROTOCOL

49 The general idea of ANONYRING (anonymous ring) is to  
 50 obfuscate the source and destination node locations with a  
 51 ring of nodes constructed through the source and destina-  
 52 tion.

53 ANONYRING begins with a discovery procedure like  
 54 the one used in SECLUD. All nodes broadcast a hello mes-

57 sage to discover all their one-hop neighbors  $N(1, i)$  for  $i =$   
 58  $1, 2, \dots, m$ , where  $m$  is the total number of one hop neighbor  
 59 nodes. Then, the nodes in  $N(1, i)$  discover their respective  
 60 neighbors  $N(2, i)$ . Consequently, each node will con-  
 61 struct the list:  $\{N(1, i), N(2, i), N(3, i), \dots, N(k, i)\}$ , where  
 62  $N(k, i)$  is the set of its  $k$ th hop neighbors. This initialization  
 63 process of neighbor discovery is done periodically by all  
 64 nodes in the network.

65 Once the discovery phase is over the source node initi-  
 66 ates ring formation. Several algorithms exist in the literature  
 67 for connecting a set of nodes into a ring topology [20,21].  
 68 We illustrate this with a simple successive disjoint paths  
 69 procedure. Specifically, the source node  $S$  finds the short-  
 70 est direct path to the destination node using an anonymous  
 71 routing protocol. Let the shortest route be  $L$  hops long  
 72 and consist of the nodes  $\{N_{s_1}, N_{s_2}, \dots, N_{s_i}, \dots, N_{s_{L-1}}\}$ .  
 73 The source node  $S$  then repeats the routing procedure to the  
 74 destination but not considering the nodes already found  
 75 in the shortest path route. That is,  $S$  finds a second route  
 76 which is  $M$  hops long  $\{N_{s_1}^2, N_{s_2}^2, \dots, N_{s_i}^2, \dots, N_{s_{M-1}}^2\}$  that  
 77 is node disjoint with the first route. Obviously the two  
 78 routes when put together will form a ring containing  $S$   
 79 and  $D$  and consisting of  $RS = L + M$  nodes. Note than  
 80 one can choose to increase the ring size  $RS$  by selecting  
 81 longer disjoint routes between the source and destina-  
 82 tion (i.e., instead of the two shortest disjoint routes could  
 83 pick the two longest disjoint routes or some combina-  
 84 tion in between) at the expense of additional overhead.  
 85 In our simulations, we try to pick rings by moving a few  
 86 hops beyond the shortest routes in order to increase the  
 87 anonymity.

88 In ANONYRING all nodes in  $RS$  (excluding nodes  $S$  and  
 89  $D$ ) will be marked as pseudo-sources on the ring and are  
 90 requested to transmit encrypted dummy packets at a rate  
 91 similar to the source transmission rate and to forward real  
 92 packets when available from node  $S$  to node  $D$ . Dummy  
 93 packets are dropped by receiving neighbor nodes. Note the  
 94 encrypted real packets can be broadcasted either clockwise  
 95 or counterclockwise or both ways from source  $S$  to reach  
 96 destination  $D$  depending on the required level of security  
 97 and transmission reliability.

98 With the above set-up, ANONYRING achieves  
 99 source/destination privacy within a ring of  $RS$  nodes. In  
 100 single source–destination case, a global attacker will have  
 101 to guess the source or destination from any of the  $RS$  ring  
 102 nodes. For multiple source–destination scenarios, several  
 103 rings can be constructed for each source–destination pair.  
 104 To improve the efficiency of ANONYRING, if possible, a  
 105 larger common ring can be used to blend different source–  
 106 destination pairs. For a single source–destination pair since  
 107 the set of  $R$  nodes hiding the source and destination are not  
 108 disjoint the anonymity is given by  $\lambda = 1 - 1/\binom{RS}{2}$ . This  
 109 assumes that the global attacker does not know where the  
 110 source and destination nodes are located the ring. In fact,  
 111 they could be adjacent nodes. The transmission overhead  
 112 factor (TOF) of ANONYRING is approximately  $\text{TOF} \approx$   
 $RS/L$ , where  $L$  is the length of the shortest path between  $S$   
 and  $D$ .

## 6. COMPARATIVE PERFORMANCE EVALUATION

In order to evaluate the effectiveness of the RW, FP, SECLUD, and ANONYRING schemes we used NS-2 to simulate an *ad hoc* network of 400 nodes distributed in an area of  $2000\text{ m} \times 2000\text{ m}$ . Two different node distribution models were used in the simulations: perturbed grid distribution and random distribution. In the perturbed grid case, nodes were located in a perturbed  $20 \times 20$  grid. The coordinates of each node  $(x_i, y_j)$  were randomly chosen using uniform random variables in the ranges  $(100i - p100, 100i + p100)$  and  $(100j - p100, 100j + p100)$ , where  $p$  is the perturbation parameter and  $i = 1, \dots, 20$  and  $j = 1, 2, \dots, 20$ , respectively. For the random node distribution case, the coordinates of the nodes  $(x_i, y_i)$  for  $i = 1, 2, \dots, 400$  were independently and randomly chosen in the range from 0 to 2000 m using a uniform [0 – 2000] random number generator.

After the nodes were distributed, we employed the Quasi-Unit disk graph (Q-UDG) model [22] to determine the connectivity between nodes and the network topology. In the Quasi-UDG model, a link exists between two nodes if the inter-nodal distance  $d$  is less than  $\alpha R$ , where  $R$  is the transmission range of the node and  $\alpha$  is the Q-UDG factor ( $0 \leq \alpha \leq 1$ ). For distances  $d$  greater than  $R$ , there is no link connectivity. However, for  $\alpha R \leq d \leq R$ , the link will exist with probability  $(R - d)/(R - \alpha R)$ . In our simulation we set  $\alpha = 0.2$  and  $R = 145\text{ m}$ . We consider only a single source–destination pair to make it easier for the attacker to compromise the privacy. The source node is randomly chosen from the region  $(100\text{ m} \leq x \leq 900\text{ m})$  and  $(100\text{ m} \leq y \leq 900\text{ m})$  and the destination node is randomly selected from  $(1100\text{ m} \leq x \leq 1900\text{ m})$  and  $(1100\text{ m} \leq y \leq 1900\text{ m})$  of the network. The source sends 5000 real packets in a time window of  $T$  seconds. All simulations are repeated 15 times and results are averaged for each tested scenario.

As noted earlier, we compare the RW, FP, SECLUD, and ANONYRING based on anonymity, unlinkability, and entropy. We determine unlinkability and anonymity as follows. To visualize linkable communications, the attacker can simply plot a 3-D graph of the number of packets  $u_i$  transmitted by each node  $i$  during time interval  $T$  with the approximate location of each node. Additional processing can help the attacker to better quantify linkability. The attacker will sample  $n$  of the nodes that have the highest number of packets transmitted during the time interval  $T$  and computes the average value  $U$  of packets transmitted. Then nodes that transmit at least  $\beta U$  packets are marked where  $0 < \beta < 1$ . A 2-D or 3-D graph of nodes, the number of packets transmitted and the *marked nodes* are used to determine possible communication paths, sources, and destinations. We pick  $n = 10$  in our simulations. The values of  $n$  and  $\beta$  will create sharp or fuzzy boundaries in the graph. Based on these boundaries, we count the size of  $|A|$ —the number of nodes within which the source and destinations are hidden and use it to determine the anonymity. In the case of the RW scheme, we do not include the nodes at the

boundary of the network in picking  $n$  or marking nodes, as this would cause bias due to packet transmissions bouncing back.

Another approach to determine the linkability is to convert the packet count information into an image and use an edge detection algorithm to reveal source/destination locations as well as the communication route. For the edge detection, a 2-D matrix of packet counts of node transmissions is formed and is treated as a matrix of pixels. The pixel intensities are normalized between 0 and 255 representing the packet count at a node. We apply the Canny edge detection [23] image processing algorithm to extract the contour of traffic flows from the pixel information. The algorithm first smoothes the image to eliminate noise pixel intensities and finds the image gradient to highlight regions with high spatial derivatives. It then tracks along these regions and suppresses any pixel that is not at the maximum (non-maximum suppression). The gradient matrix is further reduced by hysteresis thresholding. The resulting shape of the contour observed from traffic pattern analysis is used to deduce the location of traffic sources and destinations if possible.

Determination of the entropy  $h$  is straightforward as one simply counts the number of packets  $u_i$  at each node  $i$  and the total number of packets  $V$  transmitted in the network during time interval  $T$ . The fraction of packets sent by  $i$  is  $p_i = u_i/V$  and the entropy is defined as  $H = -\sum_i p_i \log_2 p_i$ .

We discuss typical simulation results for each scheme (i.e., RW, FP, SECLUD, and ANONYRING) in turn below for the perturbed grid network topology. For the sake of brevity we do not include results for the random topology as the conclusions are similar for both topologies.

### 6.1. Random walk technique

With random walk (RW) [3,6], packets are forwarded in a random fashion from one hop to the next until they reach the destination. A probability  $P_r$  is used at each hop to decide how random the forwarding is, where  $(0.5 \leq P_r \leq 1.0)$ . If  $P_r = 1.0$ , there is no randomness and the packet is sent to next hop node on the shortest path to the destination. We varied the RW parameter  $(1 - P_r)$  in steps of 0.05 from  $0.05 \leq (1 - P_r) \leq 0.5$ .

In Figure 1, a matrix of the number of packets  $u_i$  transmitted by each node  $i$  is shown for random walk with  $(1 - P_r) = 0.1$  (sample of one simulation). Nodes are not located exactly as shown but their relative positions are maintained in the matrix. The source node  $S$  (yellow color) sends 5000 packets to destination node  $D$  (blue color). Using  $n = 10$ ,  $\beta = 0.5$ , we find  $\beta U = 2072$  and mark all nodes transmitting more than  $\beta U$  packets. As shown in Figure 1, the entire route is revealed. The edge node at the source is even more apparent as it will have a global maximum (highest traffic density node). The destination is one-hop away from the next highest traffic node with packet count 4065. Surprisingly the normalized entropy for the



|    |    |    |    |     |      |      |      |      |      |      |      |      |      |      |     |     |    |    |    |
|----|----|----|----|-----|------|------|------|------|------|------|------|------|------|------|-----|-----|----|----|----|
| 12 | 13 | 12 | 18 | 13  | 33   | 16   | 69   | 490  | 387  | 91   | 20   | 14   | 15   | 12   | 14  | 12  | 13 | 14 | 30 |
| 14 | 16 | 16 | 14 | 14  | 17   | 30   | 27   | 100  | 462  | 380  | 107  | 24   | 14   | 16   | 19  | 14  | 23 | 12 | 12 |
| 14 | 12 | 13 | 13 | 81  | 68   | 76   | 33   | 41   | 96   | 422  | 361  | 108  | 26   | 13   | 22  | 13  | 12 | 15 | 12 |
| 14 | 14 | 15 | 15 | 80  | 5000 | 69   | 64   | 41   | 45   | 113  | 399  | 339  | 125  | 30   | 37  | 17  | 12 | 14 | 13 |
| 24 | 19 | 12 | 23 | 131 | 185  | 157  | 76   | 62   | 37   | 53   | 122  | 375  | 326  | 124  | 34  | 22  | 15 | 14 | 18 |
| 12 | 14 | 13 | 34 | 97  | 4803 | 288  | 370  | 24   | 14   | 35   | 73   | 122  | 362  | 308  | 125 | 41  | 21 | 14 | 48 |
| 15 | 12 | 15 | 15 | 136 | 217  | 4499 | 398  | 108  | 38   | 17   | 44   | 61   | 127  | 330  | 310 | 134 | 41 | 18 | 15 |
| 19 | 16 | 12 | 15 | 31  | 73   | 309  | 4411 | 559  | 92   | 41   | 45   | 45   | 67   | 147  | 322 | 420 | 18 | 40 | 18 |
| 29 | 13 | 14 | 16 | 14  | 23   | 126  | 424  | 4010 | 624  | 144  | 47   | 20   | 53   | 92   | 793 | 37  | 13 | 19 | 16 |
| 29 | 14 | 15 | 12 | 14  | 22   | 25   | 179  | 509  | 3637 | 649  | 195  | 71   | 47   | 844  | 44  | 17  | 24 | 19 | 24 |
| 18 | 12 | 19 | 16 | 13  | 31   | 22   | 39   | 77   | 137  | 3337 | 677  | 262  | 46   | 49   | 29  | 32  | 16 | 54 | 13 |
| 16 | 16 | 13 | 12 | 15  | 14   | 19   | 180  | 494  | 116  | 109  | 3091 | 528  | 76   | 838  | 76  | 77  | 18 | 15 | 28 |
| 14 | 14 | 13 | 14 | 13  | 14   | 13   | 35   | 192  | 553  | 150  | 200  | 2885 | 925  | 150  | 790 | 129 | 15 | 30 | 17 |
| 15 | 20 | 18 | 13 | 30  | 14   | 15   | 20   | 48   | 219  | 641  | 97   | 296  | 3482 | 125  | 989 | 23  | 18 | 13 | 28 |
| 12 | 14 | 14 | 13 | 12  | 12   | 15   | 19   | 17   | 24   | 228  | 586  | 152  | 377  | 4199 | 81  | 19  | 26 | 28 | 17 |
| 12 | 14 | 16 | 12 | 16  | 12   | 22   | 43   | 18   | 23   | 27   | 213  | 557  | 269  | 434  | 118 | 87  | 51 | 15 | 17 |
| 12 | 12 | 15 | 14 | 13  | 19   | 13   | 15   | 16   | 16   | 31   | 37   | 215  | 585  | 4065 | 461 | 208 | 26 | 20 | 12 |
| 13 | 13 | 24 | 12 | 37  | 23   | 14   | 14   | 13   | 20   | 18   | 29   | 76   | 257  | 645  | 4   | 45  | 15 | 14 | 18 |
| 22 | 14 | 14 | 14 | 20  | 23   | 15   | 20   | 26   | 16   | 14   | 45   | 37   | 54   | 247  | 16  | 18  | 26 | 13 |    |
| 14 | 14 | 14 | 14 | 14  | 12   | 12   | 16   | 12   | 14   | 17   | 15   | 17   | 17   | 15   | 16  | 15  | 12 | 17 | 20 |

Figure 1. Random walk  $P_r = 0.9$ .

$(1 - P_r) = 0.1$  case is still quite high at  $H = 0.8$  not providing any indication of the poor obfuscation in this case. The correlation/linkability between the source and destination node arises due to the nature of the underlying traffic pattern. We find strong source-destination node pair correlation for low values of probability  $(1 - P_r)$  of the random walk.

As the RW parameter  $(1 - P_r)$  increases, the traffic pattern is more skewed and the obfuscation is better. In Figure 2, a matrix of the number of packets  $u_i$  transmitted by each node  $i$  is shown for random walk with  $(1 - P_r) = 0.3$ . The source node  $S$  (yellow color) sends 5000 packets to destination node  $D$  (green color). Using  $n = 10, \beta = 0.4$ , we find  $\beta U = 1160$  and mark all nodes transmitting more than  $\beta U$  packets. An attacker gets a set of possible paths between the source and destination. The destination node can be guessed to be near nodes with highest  $u_i$ 's, that is at the circled nodes in Figure 2 with packet counts 2570, 1830, 1498, 1366, 1318, 1473, and 1163. The destination anonymity is

|     |     |     |           |     |      |      |      |      |      |      |      |      |      |      |                |      |      |      |     |
|-----|-----|-----|-----------|-----|------|------|------|------|------|------|------|------|------|------|----------------|------|------|------|-----|
| 260 | 295 | 144 | Source(S) | 778 | 358  | 1882 | 5090 | 1364 | 504  | 226  | 271  | 162  | 162  | 174  | 99             | 108  | 252  | 231  |     |
| 175 | 165 | 192 | 100       | 432 | 1158 | 879  | 2533 | 3438 | 1338 | 556  | 265  | 181  | 191  | 185  | 130            | 220  | 195  | 162  |     |
| 129 | 146 | 219 | 192       | 505 | 727  | 778  | 930  | 1616 | 1439 | 3136 | 1129 | 638  | 282  | 231  | 242            | 210  | 239  | 300  | 107 |
| 199 | 220 | 233 | 175       | 489 | 5000 | 2311 | 1151 | 1097 | 2235 | 2205 | 1198 | 620  | 494  | 276  | 220            | 140  | 190  | 262  | 143 |
| 168 | 175 | 192 | 252       | 457 | 861  | 3352 | 2266 | 2024 | 1054 | 2500 | 1413 | 985  | 578  | 525  | 313            | 218  | 243  | 225  | 162 |
| 136 | 145 | 208 | 247       | 327 | 692  | 1047 | 4072 | 2149 | 1158 | 1382 | 1497 | 718  | 850  | 528  | 231            | 287  | 161  | 146  | 217 |
| 196 | 192 | 98  | 165       | 276 | 248  | 853  | 1678 | 1604 | 1783 | 2371 | 656  | 915  | 628  | 622  | 563            | 212  | 340  | 201  | 142 |
| 213 | 198 | 249 | 128       | 340 | 285  | 505  | 2208 | 2723 | 1382 | 2458 | 1367 | 1030 | 842  | 544  | 535            | 225  | 292  | 146  | 220 |
| 151 | 225 | 168 | 103       | 148 | 230  | 441  | 1794 | 1690 | 1533 | 2529 | 2045 | 1329 | 1013 | 506  | 694            | 487  | 336  | 354  | 146 |
| 142 | 158 | 162 | 163       | 211 | 161  | 354  | 1439 | 764  | 1799 | 2343 | 2004 | 1337 | 682  | 998  | 420            | 664  | 453  | 194  | 217 |
| 190 | 230 | 167 | 143       | 149 | 185  | 231  | 327  | 1287 | 991  | 1541 | 1189 | 1530 | 1527 | 603  | 638            | 469  | 542  | 340  | 418 |
| 171 | 163 | 242 | 287       | 144 | 350  | 252  | 321  | 444  | 1163 | 2272 | 1829 | 1556 | 1247 | 770  | 675            | 613  | 628  | 615  | 334 |
| 106 | 240 | 121 | 264       | 198 | 121  | 126  | 303  | 314  | 587  | 1113 | 2381 | 1457 | 803  | 1163 | 863            | 680  | 724  | 553  | 626 |
| 189 | 180 | 420 | 189       | 254 | 226  | 145  | 163  | 206  | 339  | 569  | 1170 | 2754 | 1360 | 1142 | 841            | 909  | 619  | 461  | 857 |
| 155 | 212 | 152 | 246       | 186 | 141  | 259  | 151  | 228  | 245  | 406  | 657  | 1158 | 2434 | 1258 | 1473           | 741  | 511  | 1318 | 177 |
| 96  | 139 | 98  | 116       | 129 | 162  | 170  | 169  | 245  | 291  | 294  | 438  | 1066 | 1063 | 2745 | 1066           | 781  | 1830 | 377  | 193 |
| 109 | 130 | 277 | 267       | 256 | 177  | 170  | 112  | 120  | 285  | 324  | 369  | 385  | 978  | 1181 | 1366           | 2570 | 421  | 173  | 272 |
| 145 | 175 | 263 | 248       | 137 | 274  | 171  | 203  | 144  | 122  | 149  | 284  | 382  | 463  | 1498 | D              | 533  | 254  | 167  | 134 |
| 100 | 198 | 248 | 223       | 156 | 248  | 216  | 218  | 213  | 213  | 174  | 309  | 252  | 464  | 724  | 264            | 215  | 266  | 272  | 217 |
| 160 | 227 | 146 | 114       | 318 | 137  | 370  | 202  | 145  | 211  | 155  | 113  | 218  | 407  | 283  | Destination(D) | 139  | 234  |      |     |

Figure 2. Random walk  $(1 - P_r) = 0.3, \beta = 0.4$ .

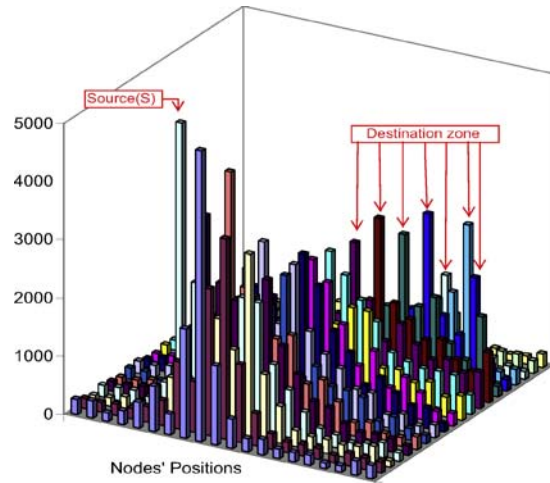


Figure 3. Three dimensional graph of  $u_i$  for random walk  $(1 - P_r) = 0.3$ .

6/7 (i.e.,  $|A| = 7$ ), whereas the source node packet count is the maximum in its vicinity and can be easily detected—so its anonymity is zero.

Figure 3 shows a 3-D visualization of the processed global traffic counts  $u_i$  and marked nodes of Figure 2, (i.e.,  $(1 - P_r) = 0.3, n = 10, \beta = 0.4$ ). Notice that one can clearly make out the source node and identify a zone of possible locations for the destination.

The output of the edge detection algorithm on the packet count data is shown in Figure 4. Clearly, the attacker can identify the source and the destination with high probability.

The normalized entropy values  $H$  for RW are plotted in Figure 5 versus  $(1 - P_r)$ . As one would expect the entropy values increase with decreasing  $P_r$ . Notice that the entropy values are high for even low values of  $(1 - P_r)$  even though the linkability is quite high as illustrated above. Moreover, the entropy values are very close making it hard to use them meaningfully.

The transmission overhead factor (TOF) is the ratio of total number of packets transmitted with RW over the total

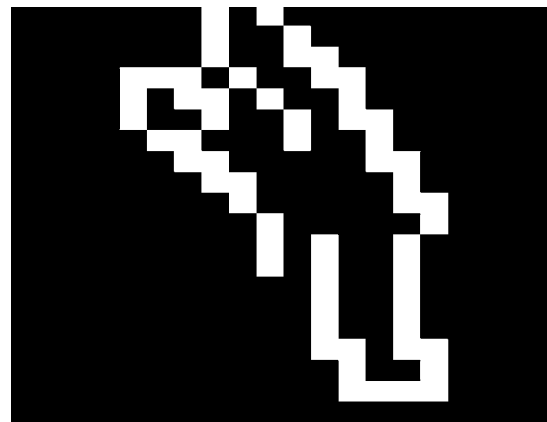


Figure 4. Edge detection output for RW  $(1 - P_r) = 0.3$ .



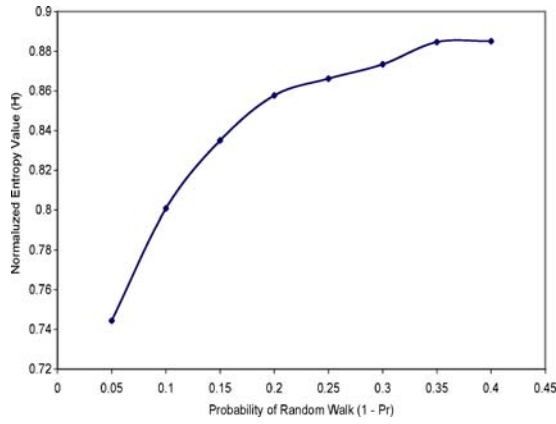


Figure 5. Random walk—normalized entropy.

number of packets transmitted with shortest path routing and no RW scheme. Figure 6 shows TOF versus  $(1 - P_r)$ . The overhead is high and the anonymity and unlinkability are not adequate as noted earlier. For example, at  $(1 - P_r) = 0.3$  the transmission overhead is approximately 400%.

### 6.2. Fractal propagation technique

In fractal propagation, neighbor nodes along a forwarding path from source to destination generate fake packets with probability  $P_{fake}$ , and the fake packets are propagated  $K$  hops by successive neighbor nodes randomly selected. A higher  $(P_{fake}, K)$  is expected to enhance communication privacy at the cost of extra overhead.

The results of traffic visualization for one simulation sample by marking nodes ( $n = 10, \beta = 0.5, \beta U = 3197$ ) is shown in Figure 7 for  $P_{fake} = 0.1, K = 5$ . We can identify a single source node (yellow color) transmitting 5000 packets to the destination node 13-hops away, denoted by cell  $D$  (blue color).

The 3-D traffic graph shown in Figure 8, illustrates a similar result where the peak traffic nodes are aligned.

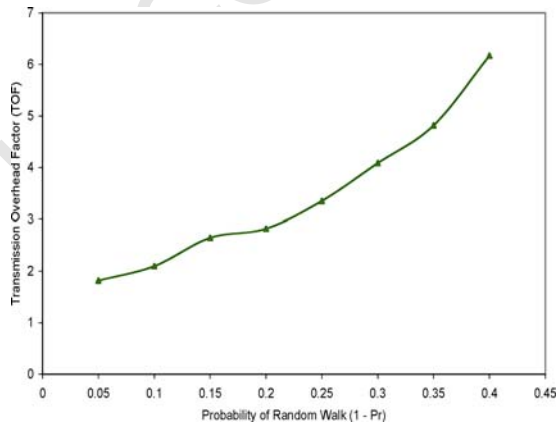


Figure 6. Random walk—transmission overhead factor.

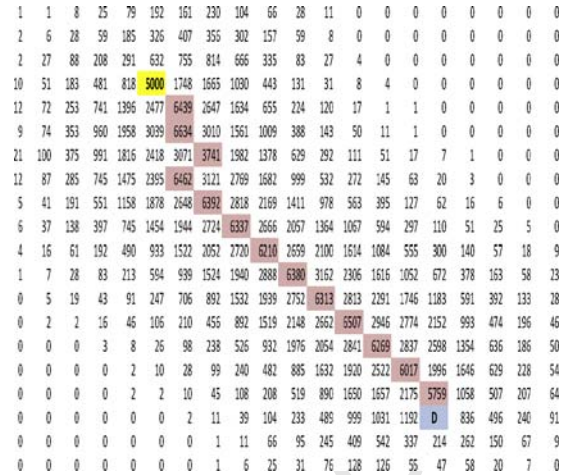


Figure 7. Fractal propagation  $P_{fake} = 0.1, K = 5$ .

are both distinguishable by a global attacker. The destination node is just 1-hop away from the node with packet count 5759. Note that the normalized entropy  $H$  is quite high at ( $H = 0.81$ ) though obviously the anonymity and unlinkability to a global attack is poor. As one would expect increasing the rate of fake packets and their propagation distance improves obfuscation. For example, in Figure 9, for the same source and destination nodes, a higher probability of fake packet generation ( $P_{fake} = 0.2$ ) is used with fractal propagation. The source and destination nodes can both still be located using the same visualization methodology (for  $n = 10, \beta = 0.5$ , in this case  $\beta U = 3859$ ) as before.

The output of the edge detection algorithm is shown in Figure 10. The same conclusions as to the location of the source and destination can be extracted by the global attacker from this type of analysis.

In Figure 11, the impact of varying  $P_{fake}$  and  $K$  on the average normalized network transmission entropy  $H$  is shown. The entropy increases as more fake packets (higher

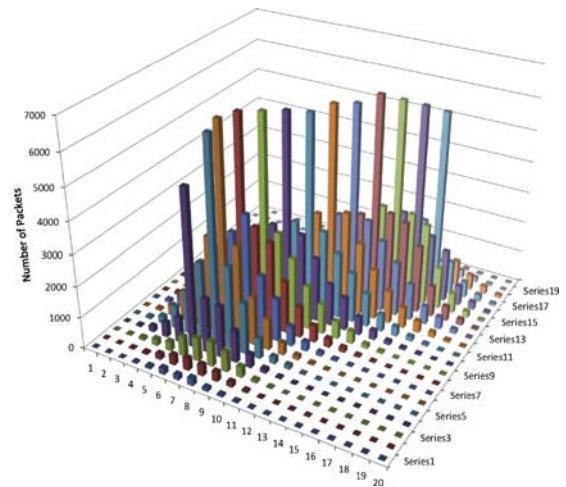


Figure 8. Three dimensional visualization of FP  $P_{fake} = 0.1, K = 5$ .

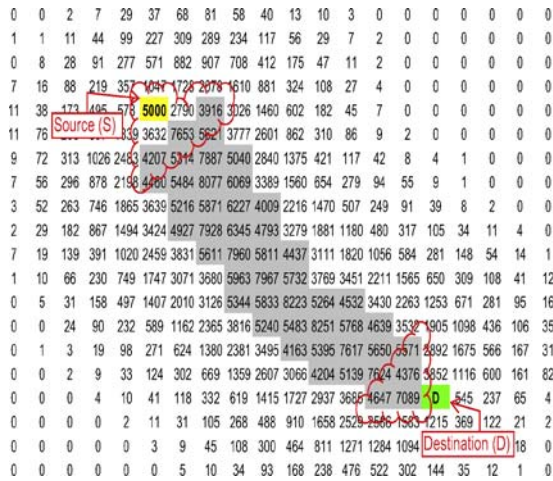


Figure 9. Fractal propagation  $P_{fake} = 0.2$ .

$P_{fake}$ ) are propagated. Similarly, for a fixed probability of fake packet generation, the average entropy is higher when the distance  $K$  of the fake packet propagation is larger. While the mean entropy values increase with  $P_{fake}$  and  $K$ , they provide no meaningful information about the ability to obfuscate the source and destination.

The overhead cost with FP is shown in Figure 12. TOF here, as before, is the ratio of the total number of packet transmissions using FP to that with shortest path routing and no FP scheme. The transmission overhead increases significantly for higher  $P_{fake}$  and  $K$ , as depicted in Figure 12. The extra overhead transmission cost is more compared to the relative increase in entropy values for corresponding  $P_{fake}$  and  $K$ . Obviously as  $P_{fake}$  and  $K$  increase, the overhead grows significantly. Even  $P_{fake} = 0.2$  and  $K = 5$  results in a high transmission overhead factor (TOF) of 1159%, but the anonymity and unlinkability are poor.

In comparison with fractal propagation, the unlinkability of RW when  $P_r$  is decreased, is better than FP when it's parameters  $P_{fake}$  and  $K$  are increased. However in both cases the normalized entropy is misleading in assessing the ease in locating the source and destination nodes that are

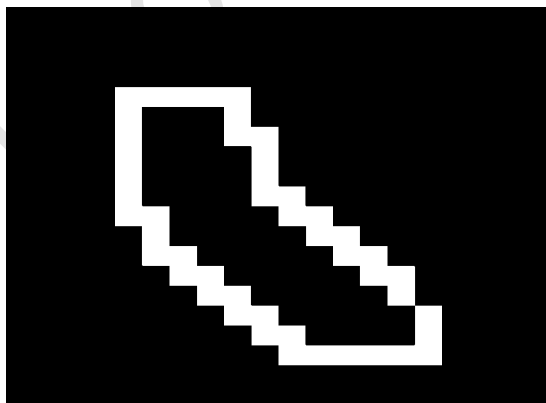


Figure 10. Fractal propagation  $P_{fake} = 0.2$  edge detection.

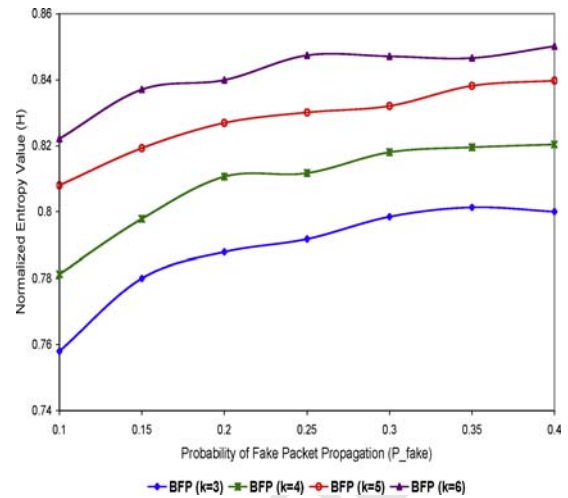


Figure 11. Fractal propagation—normalized entropy.

communicating.

### 6.3. SECCLOUD

Here we test SECCLOUD under similar circumstances as the RW and the FP schemes. First we consider a single delegated source (labeled as  $S^*$ ) and single delegated destination (labeled as  $D^*$ ). We use  $k = 3$  and  $B_S = B_D = 20$  for the simulation. The results of visualization of the traffic counts  $u_i$  at each node is shown in Figure 13. One can clearly see that as designed, SECCLOUD creates two irregular clouds of identical broadcasting nodes (highlighted in grey cells) around the source and destination. This ensures the hiding of the source and destination among their cloud regions, since the source could be any node inside the cloud, (i.e., not necessarily at the center or the edge).

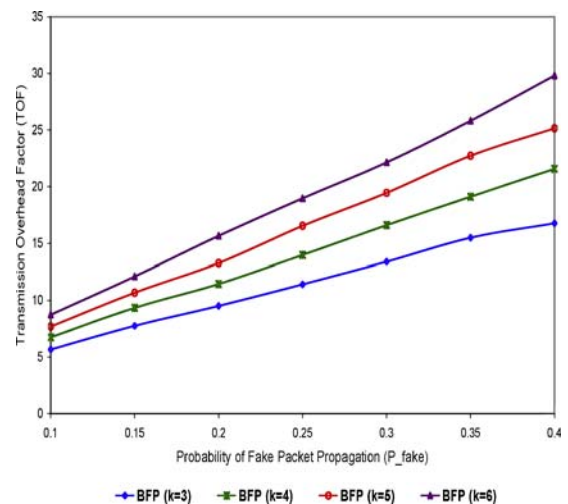


Figure 12. Fractal propagation—overhead.

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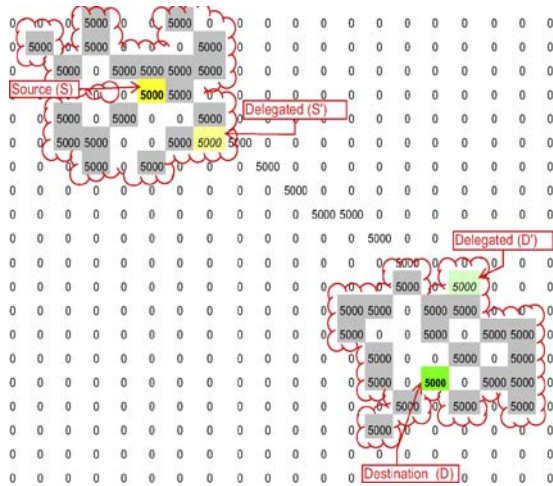


Figure 13. SECLUD with single S-D.

Figure 14 shows the 3-D visualization of the processed global traffic counts  $u_i$  of Figure 13. The attacker can see the communication path but no local or global maxima in the network. Thus, the linkability will not lead the attacker to the real source or destination, but only to the irregular cloud broadcasting region.

In Figure 15, we show a sample result for multiple delegated sources and delegated destinations. Figure 15 shows two irregular clouds of nodes broadcasting packets (highlighted in red) formed around the source and destination. The source sends 5000 packets using five delegated source–destination pairs for five transmission paths. Although using multiple paths is more complex to manage and setup, it has several advantages compared to a single path. In the case where an attacker is resident on a path, using several disjoint paths will allow some of the traffic to explicitly avoid that attacker. Moreover, using multiple paths will distribute the load of broadcasting the packets by intermediate nodes

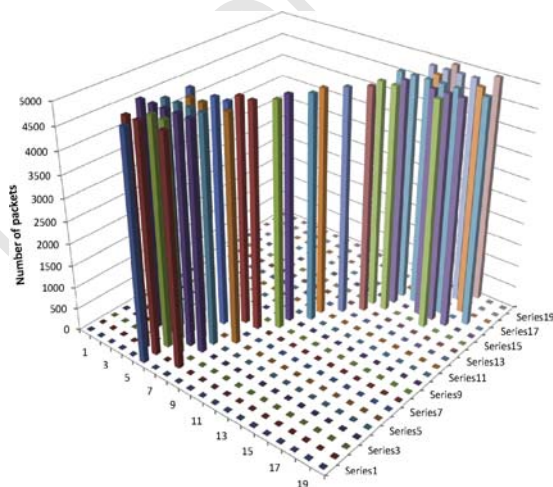


Figure 14. Three dimensional visualization of SECLUD with single path.

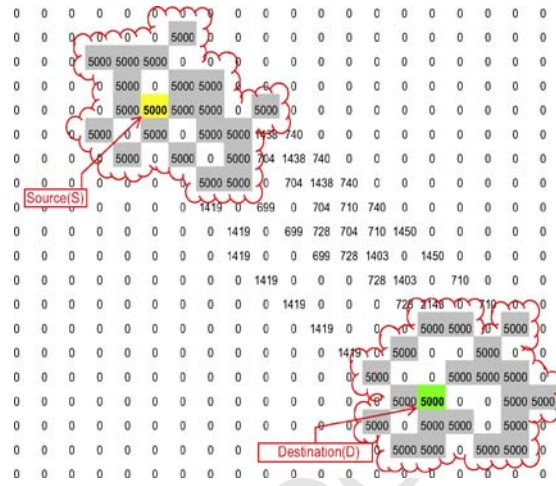


Figure 15. SECLUD with multiple paths.

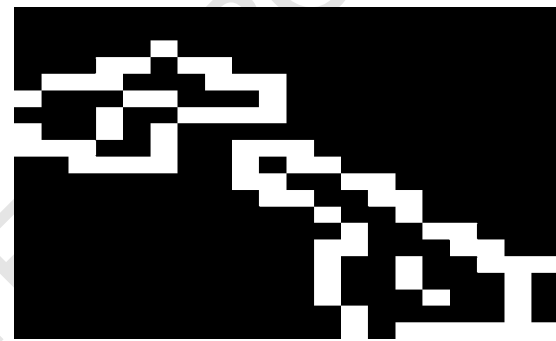


Figure 16. SECLUD with single S-D: edge detection.

on the paths. The multiple paths also increase the unlinkability of the real source–destination pair. The anonymity level is similar to the case of SECLUD with single path, as described previously.

The output of the edge detection algorithm for SECLUD when a single delegated source and destination is used is shown in Figure 16. The shape extracted by the global attacker only reveals the cloud area and the path linking the two clouds.



Figure 17. SECLUD with multiple paths—edge detection.

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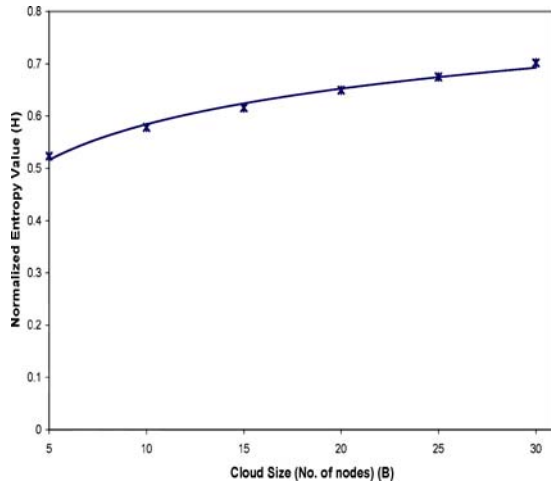


Figure 18. SECLLOUD—normalized entropy.

Figure 17 shows the edge detection output when multiple delegated sources and destinations are used, resulting in multiple paths between the clouds. Notice that edge detection image analysis only shows the contour of the cloud regions not the paths.

In Figure 18, the impact of varying the cloud size  $B_S = B_D = B$  on the average normalized network transmission entropy  $H$  is shown. The figure shows that the entropy slowly increases with the cloud size. Notice that the entropy values are low compared with the entropy values obtained from fractal propagation and random walk. However SECLLOUD has higher anonymity and unlinkability and overall has a better ability to hide the source and destination nodes.

The overhead of the SECLLOUD protocol versus the cloud size when both clouds are the same size (i.e.,  $B = B_S = B_D$ ) is shown in Figure 19. TOF here, as before, is the ratio of the total number of packet transmissions using SECLLOUD to that with shortest path routing and no SECLLOUD scheme.

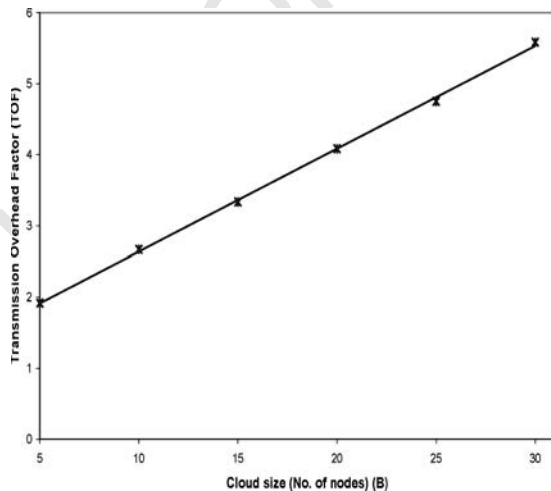


Figure 19. SECLLOUD—transmission overhead.

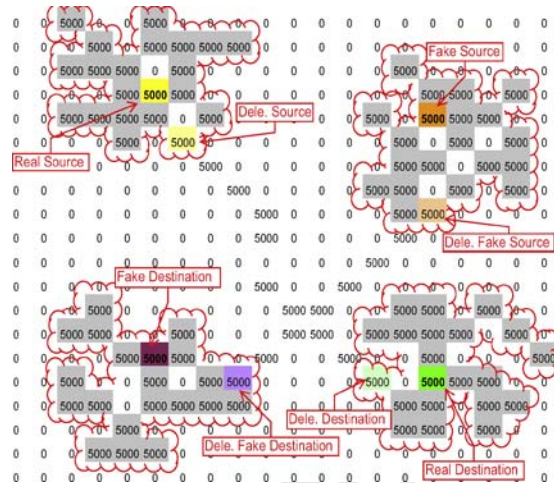


Figure 20. SECLLOUD with single S-D and fake S-D.

Figure 19 shows a linear increase in TOF with larger cloud size. In comparison with RW one can see that with a cloud size  $B = 20$ , the TOF is about the same as the RW scheme with  $(1 - P_r) = 0.3$ . However, SECLLOUD has a better ability to hide the source/destination than the RW scheme. Comparing SECLLOUD with FP, one can see that the TOF of SECLLOUD is much less than FP.

6.3.1. Fake clouds.

As noted earlier, one can further improve the obfuscation performance of SECLLOUD by adding fake clouds. Figure 20 shows typical results for SECLLOUD with a single delegated source destination pair with  $B_S = B_D = 20$  and a fake source destination pair with a single delegated source destination pair and  $B_S = B_D = 20$ . The results can be compared to the case without a fake cloud in Figure 13. With the fake cloud, the attacker now not only needs to guess the location of the source and destination within a cloud, but

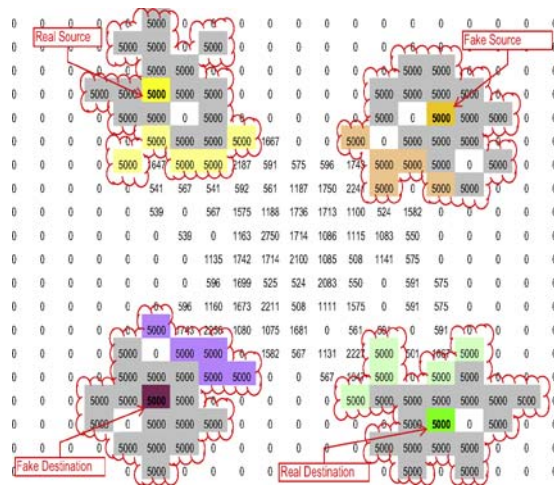


Figure 21. SECLLOUD with multipaths and fake S-D.

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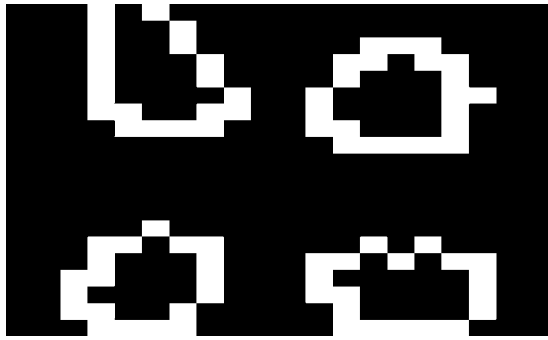


Figure 22. SECLUD with multipaths and fake S-D.

it also has to select the correct cloud to attack. Obviously, both the anonymity level and the unlinkability increase with the number of fake clouds and their sizes.

In Figure 21, we show a sample result with multiple delegated source destination pairs and a fake cloud with multiple delegated source destination pairs. In addition to having all the benefits of the previous approaches, this approach further increases the unlinkability and anonymity.

Figure 22 shows the corresponding edge detection results for the case of a single cloud and a fake cloud both with multiple delegated source and destinations. The edge detection image analysis shows the contour of the cloud regions only.

#### 6.4. ANONYRING

Finally, we evaluate ANONYRING in the same fashion as RW, FP, and SECLUD. In Figure 23, we show a typical visualization of traffic packet counts  $u_i$  for each node when the ANONYRING scheme is used. ANONYRING creates a ring of nodes that includes the source  $S$  and destination  $D$  nodes. The source node ( $S$ ) transmits 5000 packets by randomly choosing the clockwise or counter clockwise direction along the ring to the destination node ( $D$ ). In the

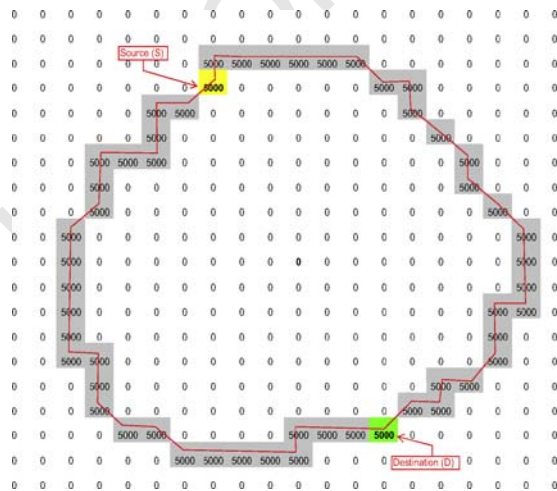


Figure 23. ANONYRING traffic shape.

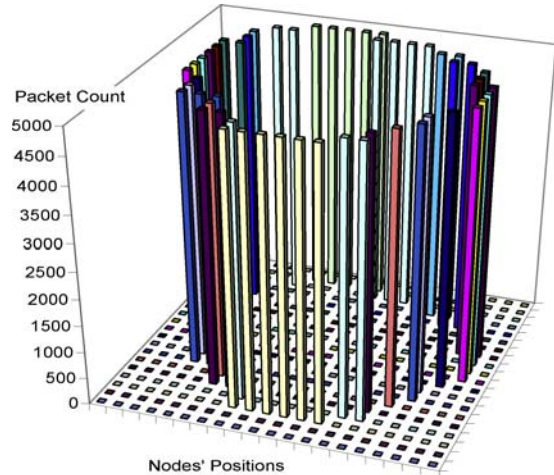


Figure 24. ANONYRING traffic shape—3-D visualization.

example shown here the destination  $d$  is at a distance of 24 hops in the clockwise direction and 27 hops in the counter clockwise direction.

Figure 24 shows the 3-D traffic visualization chart of the packet count recorded at nodes in the ring only. One can see that the source and destination locations are well hidden and indistinguishable from the other nodes transmitting.

Figure 25 is the corresponding edge detection diagram of the ANONYRING technique that confirms the observations in Figures 23 and 24. The attacker will only be able to visualize the ring path not which pair of nodes are the true source and destination.

In Figure 26, the impact of varying the ring size  $R$  on the average normalized network transmission entropy  $H$  is shown. The entropy slowly increases with the ring size. Notice that the entropy values are slightly lower than SECLUD and RW and much lower than the entropy values obtained from FP. However, ANONYRING has higher anonymity and unlinkability and overall hides the source and destination nodes better than RW and FP.

The overhead of the ANONYRING protocol *versus* the ring size is shown in Figure 27. TOF here is again the ratio of the total number of packet transmissions using ANONYRING to that from shortest path routing and no

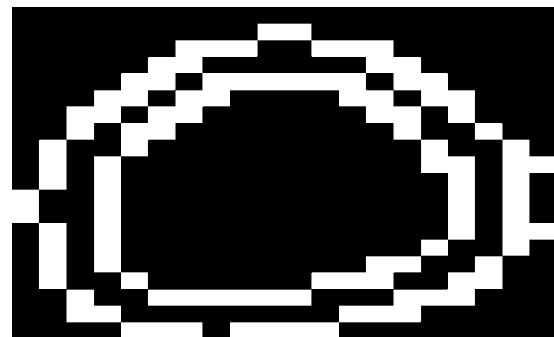
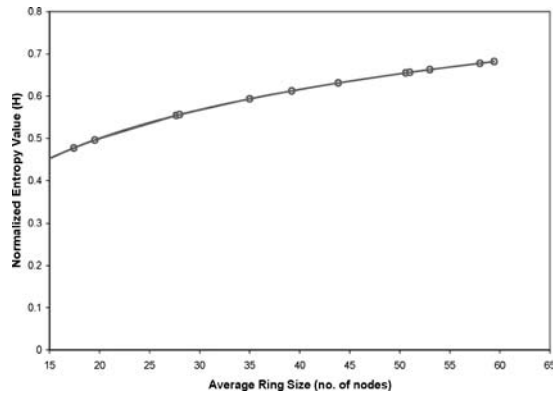
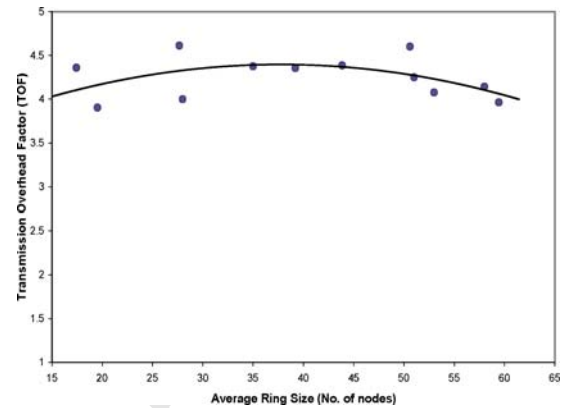


Figure 25. ANONYRING—edge detection.

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**Table I.** Results summary.

| Protocol            | Anonymity                            | Unlinkability | Overhead             |
|---------------------|--------------------------------------|---------------|----------------------|
| Random Walk         | Least                                | Low           | Medium               |
| Fractal Propagation | Low                                  | Low           | Highest              |
| SECLOUD             | Variable with Cloud size can be High | High          | Variable Low to High |
| ANONYRING           | Variable with Ring size can be High  | High          | Moderate             |

**Figure 26.** ANONYRING—normalized entropy.**Figure 27.** ANONYRING—transmission overhead.

ANONYRING in the network. In Figure 27, the dots represent the measured simulation results and the line is a curvilinear regression fit to the data. Note that the TOF in the figure does not vary much with ring size and actually goes down with larger ring sizes. This is not surprising given the procedure used in constructing Figure 27, specifically we picked a specific source–destination pair and then vary the ring size for four values, then we repeat the procedure for three different source–destination pairs. Thus, both RS and  $L$  increase resulting in a roughly constant TOF. In general for a fixed shortest path distance  $L$  between a communicating pair the TOF will increase linearly with increases in RS.

In comparison with RW one can see that the TOF is for small rings slightly higher than RW, but is lower for larger ring sizes. When compared with FP, ANONYRING has a much lower TOF than the FP scheme. Lastly when comparing SECLOUD with ANONYRING one can see that the TOF of ANONYRING is slightly less than SECLOUD. The anonymity of ANONYRING is higher than SECLOUD if the ring size RS is equivalent to SECLOUD cloud  $B_S$ ,  $B_D$  sizes, specifically  $RS = B_S + B_D$ .

### 6.5. Summary of results and comparison

In comparing the four obfuscation schemes based on the sample results above and additional results not included here for the sake of brevity, we can make several interesting observations. First, all four schemes show that one must increase the overhead to increase the anonymity and unlinkability of a source destination pair. Secondly, entropy as a metric is misleading as to the actual anonymity and

unlinkability provided, thus we do not consider it in the following. In comparing the four schemes we summarize our results in Table I. The random walk scheme while easily implemented and with moderate overhead was shown to provide little anonymity and unlinkability in the presence of an attacker with global traffic knowledge. Similarly, the fractal propagation scheme was found to have poor anonymity and unlinkability when the attacker can visualize the network wide traffic. Furthermore, the fractal propagation scheme had the highest overhead of any scheme studied. The SECLOUD scheme was shown to provide better anonymity and unlinkability and to have easily controlled parameters in the cloud sizes that directly effect the anonymity. Additional features such as increasing the number of delegated source destination pairs in the cloud and fake clouds can be added to increase anonymity. The overhead was found to be variable with these parameter but could be selected to compare favorably with random walk while providing much higher levels of anonymity and unlinkability. The ANONYRING scheme was also shown to provide the highest levels of anonymity and unlinkability with moderate levels of overhead and to have a single tunable parameter in the ring size RS.

The overhead performance and anonymity level of several cases of SECLOUD from simulations are shown in Table I. Using fake source–destination pairs will approximately double the overhead compared to the case without using any fake source–destination. As we increase the size of the cloud, the anonymity will increase but the overhead also will increase.

## 7. CONCLUSIONS

In this paper we addressed the problem of source–destination obfuscation in a wireless *ad hoc* network in the presence of an attacker with network-wide traffic knowledge. Previously, in the literature the random walk and fractal propagation schemes have been proposed to address the location privacy of source and destination nodes in *ad hoc* or sensor networks. Entropy of packet transmissions has been used as the main metric for evaluation. In this paper we showed that these current approaches can not provide sufficient obfuscation of the source, destination, and communication paths when the attacker can visualize the transmissions and infer contextual information. Furthermore, we showed that entropy is not a good metric for evaluating the obfuscation provided. To overcome the weaknesses of existing schemes, we proposed two novel techniques (1) SECLOUD: Source and Destination Seclusion using Clouds to obfuscate the true source/destination nodes and make them indistinguishable among a group of neighbor nodes, and (2) ANONYRING: Anonymous Ring which hides the source/destination nodes within a group of nodes that form a ring. Our comparative simulation study showed that both proposed techniques work well even under network-wide traffic visualization and analysis by an attacker. Furthermore the proposed techniques are shown to be superior to existing random walk and fractal propagation schemes in terms of overhead, anonymity, and unlinkability.

## ACKNOWLEDGMENTS

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*Source-destination obfuscation in wireless ad  
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