



## Private and Flexible Urban Message Delivery

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# Private and Flexible Urban Message Delivery

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**Abstract**—With the popularity of intelligent mobile devices, enormous urban information has been generated and required by the public. In response, ShanghaiGrid (SG) aims to providing abundant information services to the public. With fixed schedule and urban-wide coverage, an appealing service in SG is to provide free message delivery service to the public using buses, which allows mobile device users to send messages to locations of interest via buses. The main challenge in realizing this service is to provide efficient routing scheme with privacy preservation under highly dynamic urban traffic condition. In this paper, we present an innovative scheme BusCast to tackle this problem. In BusCast, buses can pick up and forward personal messages to their destination locations in a store-carry-forward fashion. For each message, BusCast conservatively associates a routing graph rather than a fixed routing path with the message in order to adapt the dynamic of urban traffic. Meanwhile, the privacy information about the user and the message destination is concealed from both intermediate relay buses and outside adversaries. Both rigorous privacy analysis and extensive trace-driven simulations demonstrate the efficacy of BusCast scheme.

**Index Terms**—Anonymous communication, backward unlinkability, message delivery, traffic analysis attacks, and vehicular networks.

## I. INTRODUCTION

WITH the prosperity of powerful intelligent mobile devices, e.g., tablets and smart phones, urban sensing information, such as photos of events, audio and video records, has been largely enriched. The ever-increasing demands for sharing such information posed from the public have become a serious challenge. In response to the challenge, the Shanghai government has established the ShanghaiGrid (SG) project since 2005, with the ambitious goal of building a metropolitan-scale information service system. Among others, one promising application in SG is to provide *message delivery service*

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in which mobile users can send messages to some locations of interest, such as homes, workplaces and public agents. The goal of the application is three-fold. First, it should guarantee anonymous data communication for users, which hides the privacy information stating who is communicating with whom and for what purpose from others. For example, *Alice* may take a picture of an event and would like to send it to the police station as evidence. Certainly, she will not send her ID information with the picture or want her identity information being exposed by any means. Second, the end-to-end delivery may not have to be real-time but should be short. Last, the system should provide large service coverage to the public in terms of both geographical and temporal distributions.

To achieve the message delivery service, one possible solution is to use conventional cellular networks (e.g., GPRS and 3G) or satellite techniques, which can provide very short delivery delay. However, the privacy of mobile users in terms of identities and their interested location information is not well protected from the network operators. In addition, it also causes tremendous communication cost for data transmission. Recently, vehicular networks [1], [2], [3] have emerged as the new landscape of mobile ad hoc network, in which data communication is carried out in a *store-carry-and-forward* fashion. In SG, we consider to use buses (forming a bus network) for message delivery because of three major reasons. First, in urban settings, with the dense and wide distribution, commuting buses can reach a very high coverage. For example in Shanghai, with a communication range of 600 meters, the area covered by buses can be reached up to 90% of the downtown area. Second, the achievable end-to-end delay is convincing for most delay tolerant applications with fixed bus routes and schedules. Last, as buses are public vehicles, it is practical to provide such a service to the public without the concern of failures caused by selfish behavior.

To achieve efficient and anonymous message delivery with buses, however, is very challenging for three reasons. First, due to the dynamic surface traffic, buses may experience unexpected delays, which means the contacts between a pair of buses cannot be accurately predicted even with the fixed bus schedules. In this case, simply using a pre-determined shortest routing path calculated based on the static bus schedules is not feasible. Another naive solution can flood a message over the network, which can achieve shortest delivery delay but arouse prohibitive network traffic. Second, because of the requirement of anonymous communication, all identification information such as identities, locations, and routing paths must be removed from messages before being sent over open channels. Without the knowledge about the receiver, it is hard for an intermediate node to make an efficient routing decision. Last, even though identifying information can be well

protected, it is much harder to defend against traffic analysis attacks, where adversaries observe the encrypted traffic flow to infer the relationship between messages. In consequence, messages can be traced forward to the destinations or backward to the sources [5]. One possible solution is to use Onion routing [6], in which a message encrypted by the sender can be stripped off layer by layer by intermediate relay buses. Each relay bus can only get the information of its next-hop and forward the message accordingly. This method needs the sender to determine the chain of all relay buses in advance. In the dynamic scenario of bus network, however, it is hard to accurately pre-determine an optimal routing path in terms of minimizing the delivery delay. Another alternative solution is to use universal re-encryption [7], [8] in which each relay bus re-encrypts a message without knowing the identity of the receiver. The solution needs to explicitly provide the identity of the receiver to relay buses, which would disclose the privacy of the receiver. As a result, there is no successful solution, to the best of our knowledge, to provisioning efficient private message delivery in bus networks.

In this paper, we propose an innovative message delivery scheme in bus networks, called *BusCast*, which provides a set of routing mechanisms flexible to the uncertainty of bus contacts caused by dynamic surface traffic while provisioning anonymous communication for users. *BusCast* elegantly integrates three key techniques. First, *BusCast* users can plan a routing graph for a message, which is made up of a set of relay rules indicating how the packet would transfer between bus routes. Second, we design an Anonymous Routing Structure (ARS) to indicate routing information for intermediate relay buses by embedding the routing graph in the message. With the ARS, relay buses can only recover their own routing instructions about which bus routes are the next hop presented in the routing paths. Last, each relay bus re-generates the ARS, and the confidential messages of users are also re-encrypted on each relay bus using a universal re-encryption scheme, which requires no public key of message receivers. Combining the two together eliminates the linkability between incoming and outgoing packets, which can defend against traffic analysis attacks. The strong point of *BusCast* design is that even if the secrets of one or more bus routes are exposed, anonymous communication can still be achieved. Thorough privacy analysis shows that the *BusCast* design can protect user privacy well. We also verify the routing performance of *BusCast* through extensive trace-driven simulations that involve 199 bus routes in Shanghai city.

We highlight our main contributions in this paper as follows:

- We have considered the dynamic of suffice traffic in realizing message delivery service and design an ARS, which conceals identification information from other buses and outside adversaries and provides plenty of flexibility in making routing decision.
- We allow intermediate buses embedded in an ARS to re-generate the ARS without the need to know the routing graph, which makes buses act as both message routers and mix proxies of a mix net [4] and therefore can defend against traffic analysis attacks and guarantee anonymous communications.

- We have conducted both privacy, performance analysis and extensive trace-driven simulations to demonstrate the efficacy of *BusCast* design.

The remainder of this paper is organized as follows. Section II introduces related work. In Section III, we characterize the unique features of bus networks. Section IV describes the system and attack models in bus networks and presents the design goals. Section V present the overview of *BusCast*. We elaborate the technique of flexible routing with routing graph in Section VI. In Section VII, the details of privacy preserving packet forwarding using Anonymous Routing Structure are described. Section VIII presents the privacy and performance analysis of *BusCast*. Several design issues that may be encountered in practice are discussed in Section IX. In Section X, we conduct trace-driven simulations to evaluate the performance of *BusCast* and present the results. Finally, we conclude and outline the directions for future work in Section XI.

## II. RELATED WORK

Since the concept of mix net was first introduced by Chaum for anonymous communications in Internet [4], many studies have followed Chaum's approach such as Web-MIXes [9], Tarzan [10], Mixminion [11], AOS [12]. A mix node is a proxy batched modifies input messages and outputs them in a random order, called mixing. In this way, it is hardly to correlate a comes in message with a goes out message, which can be leveraged to defend against the traffic analysis attacks.

Several mixing schemes are designed for providing anonymous routing in mobile networks, such as ANODR [13], SDAR [14], AnonDSR [15]. These schemes share two common features. First, all these schemes demand a route discovery phase before forwarding a packet, which enables the sender to discover and establishes a secure routing path via a number of intermediate wireless nodes to the receiver. Second, all these schemes use the layer-by-layer en/decryptions. The significant feature of these schemes is that the layers should be peeled in sequence, and each time can only be peeled one layer. However, the strictly defined routing path lack of flexibility to adapt rapid changes of mobility of vehicular networks. Y. Fan et al. [16] proposed a network coding scheme combining with homomorphic encryption functions to protect the source anonymity from traffic analysis and flow tracing attacks in multi-hop wireless networks. They considered a multicast network. Intermediate nodes buffer the received packets until all the packets belonging to same session are available and perform random linear coding on these packets. However, the scheme cannot work well in vehicular networks, since the opportunistic routing makes it hard to collect all packets belonging to the same session at the same intermediate.

There are two works closely related to this paper, R. Jansen et al. introduced a TPS scheme [17] to address the anonymity issues in DTN. In the scheme, nodes are divided into several groups. Senders generate a one-time secret key to encrypt each message and the identities of receivers. Senders use secret sharing scheme to divide the secret into pieces, and each piece is encrypted using a group key. Each relay node decrypts a piece of secret using the group key it holds. Node decrypting



Fig. 1: The distribution of bus lines within the downtown area of Shanghai city, with 199 bus lines involved.

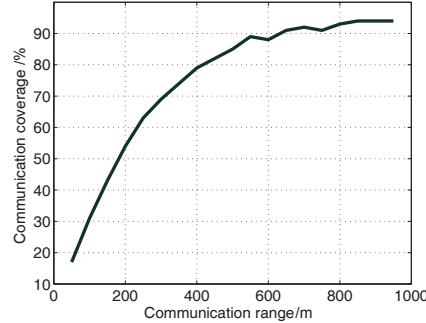


Fig. 2: Bus network coverage under different communication ranges.

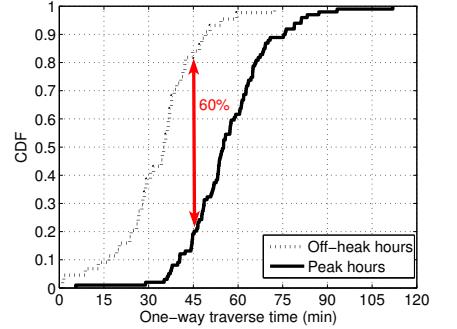


Fig. 3: Comparison of one-way traverse time of buses between off-peak and peak hours.

the last piece of secret can recover the original secret key. Then the message and identity of receiver can be revealed and be routed to receiver. However, this scheme leaks identities of receivers to a part of untrusted intermediate nodes. R. Lu et al. put forward a social-based privacy-preserving packet forwarding protocol in VANETs [8]. The authors deployed RSUs at high social degree intersections to assist in packet forwarding between vehicles by temporarily storing packet, and to carry out re-encryption on the packet in order to construct mix network. However, locations of receivers are provided to all relay RSUs and vehicles. Furthermore, in order to protect the privacy, each packet should be at least temporarily stored on and re-encrypted by an RSU.

### III. CHARACTERISTICS OF BUS NETWORK

Understanding the properties of the network composed of urban buses is essential to the performance of message delivery. In this section, we study the key features of bus network based on a real Global Positioning System (GPS) trace collected from 2,358 buses on 199 bus lines between Feb. 19<sup>th</sup> and Mar. 5<sup>th</sup>, 2007. It covers the downtown area of Shanghai city of about 120 square kilometers.

We first illustrate the geographical distribution of all bus lines in Fig. 1, where the red lines represent the aggregated itineraries of all bus lines. It can be seen that bus lines show a dense and relatively uniform distribution throughout the whole region. We refer to the coverage of bus network as the area that messages can be delivered by a bus of the network, using short-range wireless communication (e.g., Dedicated Short Range Communications: DSRC, i.e., 802.11p).

Fig. 2 shows the coverage as the function of wireless communication range. It can be seen that, when communication range is above 600m, the coverage ratio can reach over 90% of the total area. Besides, it can also be seen that bus lines are well inter-connected with different bus lines sharing part of their routes in common. Both properties indicate that bus network is ideal for message delivery.

Ideally, buses travel between stops on their routes on time no matter how the surface traffic changes during the day. In this case, a simple yet effective way to deliver a message is to forward the message along the shortest path calculated based on the fixed bus routes and regular schedules. In reality, however, the mobility of buses varies dramatically at different

time, especially in metropolises like Shanghai. For example, Fig. 3 shows the cumulative distribution function of the traverse time for a bus to travel from one terminal to the other on its route over all buses during the peak and off-peak hours in a day, respectively. It can be seen that 80% buses can finish one-way traversing within 45 minutes during the off-peak hours but the ratio drops dramatically to about 20% during the peak hours. The huge variation makes pre-determining the shortest routing path very hard, if not impossible.

## IV. MODELS AND DESIGN GOALS

### A. System Model

In BusCast, there are two components: buses and Trust Authority (TA).

- **Buses:** are equipped with On-Board Units (OBUs), which typically consist of a CPU, a large storage, a GPS module and wireless communication modules. Moving buses can talk with other buses via short-range wireless communication (e.g., DSRC) and with the TA via long-range wireless communication (e.g., GPRS, 3G).
- **Trust Authority:** is a trustworthy authority, which can communicate with buses all the time. TA generates common secret information for buses on the same route.

We assume that buses carry out their functionality properly but may cause secret information generated by TA leaked under intrusion of adversaries. We assume each bus has an Intrusion Detection System (IDS). If an intrusion is detected, it reports to TA to take corresponding security responses. We also assume that routes information is available to the public (e.g., from the website).

### B. Attack Model

We characterize adversaries from four perspectives.

First, adversaries can mount both passive and active attacks which implies not only eavesdropping but also packets injection and modification on the wireless channel.

Second, adversaries can have the global view of the whole network traffic by eavesdropping on the open channel.

Third, adversaries behave rationally which means they launch attacks in order to gain benefits. The goal of adversaries is to jeopardize user's privacy. Particularly, we consider privacy jeopardizing attacks in two aspects:

- *Confidentiality violation*: attackers eavesdrop on the shared medium to catch others communications and recover the content of packets in order to obtain the confidential information.
- *Anonymity violation*: even the content of packets is protected by encryptions, attackers can also obtain sensitive information related to identities, locations of victims, by launching traffic analysis or packet marker attacks. In traffic analysis attacks, adversaries intercept and examine encrypted messages in order to deduce information from patterns in communication. In packet marker attacks, adversaries insert some distinguishable markers into packets in order to track them.

Last, although intrusions of attackers can be detected by IDSs, we do not assume that the damage results (secret exposure) can be avoided perfectly. Adversaries can make use of the exposed secrets, trying to recover other sensitive information. Additionally, we assume that the invaded routes should be a small fraction of all the bus routes.

### C. Design Goals

The BusCast design should meet both privacy-related and routing performance-related requirements.

#### 1) Privacy Requirements

We aim to enable anonymous message delivering. More specifically, the following properties should be guaranteed.

- *Unlinkability* between users and destinations should be guaranteed, which means that it is not possible to trace who communicates with whom.
- *Backward unlinkability* between users and destinations should be guaranteed, which means that even after some buses are invaded and consequently get secret exposed, past communications remain untraceable.
- *Confidentiality* of the messages should be protected. Sensitive information shared among senders and receivers will never be disclosed to others.

#### 2) Routing Performance Requirements

Since the number of potential users may be very large, it is of great importance to consider the scalability of the system. The BusCast design should minimize the message delivery delay and the corresponding network cost aroused.

## V. OVERVIEW OF BUSCAST DESIGN

To tackle the challenges in realizing message delivery service, BusCast elegantly integrates three techniques: *flexible routing with routing graph*, *constructing ARS*, and *re-generating ARS and re-encrypting user data (to form mix net)*.

Specifically, BusCast uses a routing graph instead of one single shortest path to forward a message, in which each edge indicates how the packet would transfer between bus routes. By elaborately constructing the routing graph for the message, plenty of flexibility can be achieved to adapt the uncertainty of bus mobility caused by dynamic suffice traffic. Given a routing graph of the message, we construct and associate an ARS with the message to indicate routing information for

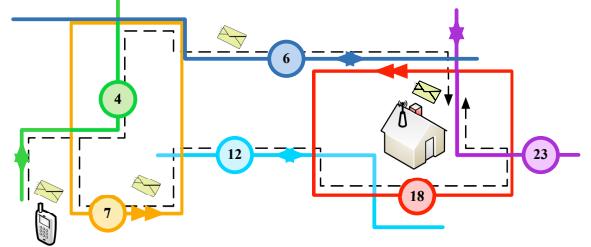


Fig. 4: An example of the packet forwarding procedure using bus-net.

intermediate relay buses by associating the routing graph with the message. With the ARS, relay buses can only recover their own routing instructions about which bus routes are the next hop presented in the routing paths. To break the linkability between incoming and outgoing packets, each relay bus re-generates the ARS without the need to know what the routing graph is. Furthermore, the confidential messages of users are also re-encrypted on each relay bus using a universal re-encryption scheme, which requires no public key of message receivers. Without linkability during the routing process, BusCast can defend against traffic analysis attacks.

## VI. FLEXIBLE ROUTING WITH ROUTING GRAPH

### A. Contact Graph of Buses

Since buses on the same route share the same itinerary, we consider message delivery problem at the level of bus routes. Two bus routes are referred to as *neighbors* if they share partial itinerary or have intersections.

Suppose that a mobile device user *Bob* wants to send a message *m* to his friend *Alice* using bus networks, and *Bob* knows her location  $\mathcal{L}$ . *Bob* forwards *m* to a nearby passing bus, then *m* will be relayed between buses and finally reach to a bus route passing through  $\mathcal{L}$ . Fig. 4 illustrates an example of a message delivery using bus networks. The different colors of solid lines denote different route paths, and the number in each circle represents the route ID.

We use a *contact graph*  $\mathbb{G} = (\mathbb{V}, \mathbb{E}, \mathbb{W})$  to represent contacts between bus routes. A contact graph consists of a set of vertices  $\mathbb{V}$ , a set of edges  $\mathbb{E}$ , and a set of weights  $\mathbb{W}$  each of which is assigned to an edge of the graph. Since route paths are public information, it's convenient to determine  $\mathbb{V}$  and  $\mathbb{E}$  using neighbor relationship between routes:

- Each vertex  $v_i \in \mathbb{V}$  denotes a bus route (line).
- If two bus lines  $v_i, v_j \in \mathbb{V}$  are neighbors, there are two edges  $\hat{e}(v_i, v_j), \hat{e}(v_j, v_i) \in \mathbb{E}$  between  $v_i$  and  $v_j$ . (Edges between two vertices come in pairs, since neighborship are bidirectional.)

Fig. 5a shows the contact graph  $\mathbb{G}$  of the bus network in Fig. 4. According to the static and dynamic features of buses,  $w_{i,j} \in \mathbb{W}$  can be set in two ways. Assume that the length of bus line  $v_i$  is  $l_i$ , there is an edge  $\hat{e}(v_i, v_j) \in \mathbb{E}$ , and  $v_i$  and  $v_j$  share  $x$  intersections and several road segments. The total length of share road segments is  $y$ . The communication range between buses is  $r$ . According to the above static geographical feature of  $v_i$  and  $v_j$ ,  $w_{i,j} = \frac{1}{(\frac{r}{l_i} \cdot x + \frac{y}{l_i})}$ , where  $\frac{1}{(\frac{r}{l_i} \cdot x + \frac{y}{l_i})}$  is an approximation of overlap ratio of  $v_i$  and  $v_j$ , and it is proportional to the contact opportunities between  $v_i$  and  $v_j$ .

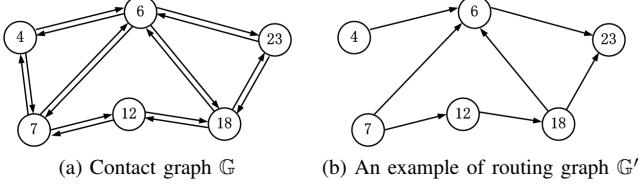


Fig. 5: An example (the bus network in Fig. 4) of Contact Graph and Routing Graph.

Hence  $w_{i,j}$  is proportional to their inter-contact time. A more realistic (dynamic) way to determine  $w_{i,j}$  is using inter-contact time of routes directly, which denotes the average time elapsed between two successive contacts of a certain bus on  $v_i$  and any one buses on route  $v_j$ .

### B. Extracting Routing Graph

In order to deliver  $m$  to *Alice* effectively, *Bob* should indicate (implicit or explicit) location (or identity) information of *Alice* to relay buses. Basically, there are two kinds of routing strategies. First, *Bob* indicates  $\mathcal{L}$  explicitly in the packet. However, it is prohibited for privacy concerns. Second, *Bob* plans a routing path using  $\mathbb{G}$  of the bus network in advance (called deterministic routing), and uses particular privacy preserving techniques, such as Onion routing, making each relay bus only knows a small part of the fix routing path. However, deterministic routing, such as computing a shortest path, usually does not work well due to large variation of contact time and locations between buses, which can tremendously deviate the values predicted using bus schedules.

Consequently, we introduce flexibility in deterministic routing. First, senders designate a number of relay instructions between neighbor bus lines for each packet rather than a fixed routing path, according to  $\mathbb{G}$  and performance requirements. Relay instructions form a *Routing Graph*  $\mathbb{G}' = (\mathbb{V}', \mathbb{E}', \mathbb{W}')$ , which is an induced subgraph of  $\mathbb{G}$ , i.e.,  $\mathbb{V}' \subseteq \mathbb{V}$ ,  $\mathbb{E}' \subseteq \mathbb{E}$ ,  $\mathbb{W}' \subseteq \mathbb{W}$ . Directed edges  $\hat{e}(v_i, v_j) \in \mathbb{E}'$  denotes a relay rule.  $\mathbb{G}'$  contains at least one *source vertex*  $v_s : \forall v_i \in \mathbb{V}', \nexists \hat{e}(v_i, v_s) \in \mathbb{E}'$  and one *destination vertex*  $v_d : \forall v_i \in \mathbb{V}', \nexists \hat{e}(v_d, v_i) \in \mathbb{E}'$ . For the example in Fig. 4, a user located near bus line 4 and 7. The user wants to send a packet to a place located near bus line 23. Fig. 5b gives an example of  $\mathbb{G}'$ . A simple method to extract  $\mathbb{G}'$  is to pick  $k$ -shortest paths from  $v_s$  to  $v_d$  on  $\mathbb{G}$  (removing duplicate edges). Sophisticated methods can be used if more information is available, e.g., schedule of buses.

During message delivering, senders deliver a packet to a passing-by bus of route  $v_s$ , then the bus carries the packet until encountering  $v_i$  that  $\hat{e}(v_s, v_i) \in \mathbb{E}'$ , and forwards the packet to  $v_i$ . In the same way, the packet is relayed by buses in a route-by-route manner according to  $\mathbb{G}'$  until reaching to  $v_d$ . Then the packet is carried by  $v_d$  and broadcasted in the vicinity of destination  $\mathcal{L}$ .

## VII. PRIVACY PRESERVING PACKET FORWARDING USING ANONYMOUS ROUTING STRUCTURE

### A. System Initialization

Given a contact graph  $\mathbb{G}$ , each edge  $\hat{e}(v_i, v_j) \in \mathbb{E}$  is mapped to a routing instruction, referring to a *Relay Indicator* (RI, denote as  $I_{rly}$ ), to indicate one-hop relay from  $v_i$  to  $v_j$ . We also define *Broadcast Indicators* (BI, denote as  $I_{bst}$ ), which are used to indicate broadcasting areas for the buses.

Each indicator (BI or RI) has two parts: a *public Indicator* ( $I^P$ ) and a *secret Indicator* ( $I^S$ ). Public indicators are known to all entities, and are used for constructing ARSSs. Secret indicators are kept by certain routes secretly for verifying ARSSs. It is similar with public/private key pairs, however indicators serve to build ARS rather than encrypt messages.

TA is responsible for constructing all the indicators in the system. In addition, TA generates the public parameters and master-key of the system.

#### 1) Generating Public Indicators

For each route  $R_i$ , TA assigns a set of public RIs for  $R_i$  corresponding to edges  $\hat{e}(v_i, v_j) \in \mathbb{E}$  in  $\mathbb{G}$ . In other words, each RI relates to a neighbor of  $R_i$ . For its neighbor  $R_j$ , the corresponding public RI is  $I_{rly(R_i, R_j)}^P = R_i \| R_j$ , which indicates **one-hop relay from  $R_i$  to  $R_j$** . The symbol  $\|$  represents concatenation between strings.

For example in Fig. 4,  $R_7$  has three neighbors which are  $R_4$ ,  $R_6$  and  $R_{12}$ . TA assigns three public RIs  $I_{rly(R_7, R_4)}^P$ ,  $I_{rly(R_7, R_6)}^P$ , and  $I_{rly(R_7, R_{12})}^P$  for  $R_7$ . It should be noted that neighbors do not share RIs.  $R_4$  and  $R_7$  hold  $I_{rly(R_7, R_4)}^P = R_7 \| R_4$  and  $I_{rly(R_4, R_7)}^P = R_4 \| R_7$ , separately.

TA also assigns a set of BIs for  $R_i$  representing certain areas where it should broadcast packets. We divide the urban area into small cells according to the communication range of buses. Each cell has an unique identity. Cells within the coverage area of  $R_i$  are organized in sequence of locations from its departure to terminal station. Assume that  $n$  cells are in the coverage area of  $R_i$ , which are  $\{c_1, c_2, \dots, c_n\}$ . TA executes the following operations to construct a binary tree of public BIs of  $R_i$ , so that a BI can be targeted efficiently. The height of the BI tree is  $\lceil \log_2 n \rceil + 1$ :

- Root node of the tree is  $I_{bst(R_i)}^P = R_i$ , which is used to indicate whether  $R_i$  is one of the last relay routes.
- Split the original set of cells into  $\{c_1, c_2, \dots, c_{\lceil n/2 \rceil}\}$  and  $\{c_{\lceil n/2 \rceil+1}, c_{\lceil n/2 \rceil+2}, \dots, c_n\}$ . The first layer public BIs are  $R_i \| c_1 \| \dots \| c_{\lceil n/2 \rceil}$  and  $R_i \| c_{\lceil n/2 \rceil+1} \| \dots \| c_n$ , denoted as  $I_{bst(R_i-0)}^P$  and  $I_{bst(R_i-1)}^P$ .
- Execute the split recursively on two resulting sets, and get the corresponding public BIs until only one cell left in each set.

For example in Fig. 4, assume  $R_7$  covers 7 cells which are  $\{c_1, c_2, \dots, c_7\}$ . The four layer public BI tree of  $R_7$  is illustrated in Fig. 6.  $R_i \| c_j \| \dots \| c_k$  indicates that the destination cell belongs to the set of  $\{c_j, \dots, c_k\}$ .

#### 2) Generating Secret Indicators

For a given public indicator  $I^P \in \{0, 1\}^*$  (either  $I_{rly}^P$  or  $I_{bst}^P$ ), TA computes  $Q_I = H_1(I^P) \in \mathbb{G}_1^*$ , and sets the corre-

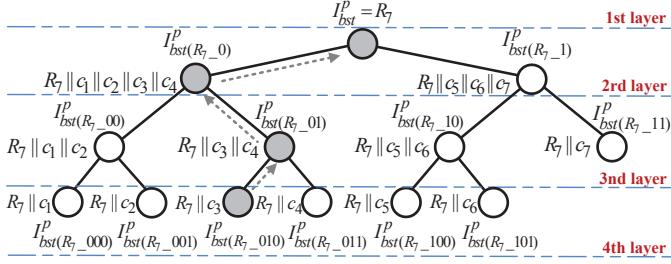


Fig. 6: The public BI tree of route  $R_7$  which covers 7 cells  $\{c_1, c_2, \dots, c_7\}$ .

sponding secret indicator as  $I^s = s(Q_I + P_1)$ . For example, given  $I^p_{rly(R_7, R_6)} = R_7 \| R_6$ , TA generates  $I^s_{rly(R_7, R_6)} = s(H_1(R_7 \| R_6) + P_1)$ ; for  $I^p_{bst(R_7\_00)} = R_7 \| c_1 \| c_2$ , corresponding secret BI  $I^s_{bst(R_7\_00)}$  is  $s(H_1(R_7 \| c_1 \| c_2) + P_1)$ . TA distributes secret indicators to the bus routes they belonging to, via a secure channel (e.g., secret indicators are signed and encrypted using a signcryption scheme [18], and transmitted using 3G network).

### 3) Generating System Parameters

Given a security parameter  $n \in \mathbb{Z}^+$ , TA runs the following algorithms to generate the public parameters and master-key in the system.

- Generate a large prime  $q$ , an additive cyclic group  $\mathbb{G}_1$  and a multiplicative cyclic group  $\mathbb{G}_2$  of order  $q$ , and a bilinear mapping  $e : \mathbb{G}_1 \times \mathbb{G}_1 \rightarrow \mathbb{G}_2$  [19]. Choose a random generator  $P \in \mathbb{G}_1$ .
- Pick  $s \xleftarrow{R} \mathbb{Z}_q^*$  as master-key, set  $P_{pub} = sP$ .
- Pick  $P_1 \xleftarrow{R} \mathbb{G}_1$ .
- Choose cryptographic hash functions:

$$\begin{aligned} H : \{0, 1\}^* &\rightarrow \mathbb{Z}_q^*, \quad H_1 : \{0, 1\}^* \rightarrow \mathbb{G}_1^*, \\ H_2 : \mathbb{G}_2 &\rightarrow \{0, 1\}^\omega, \quad H_3 : \{0, 1\}^\omega \times \{0, 1\}^* \rightarrow \mathbb{Z}_q^* \end{aligned}$$

- Set  $\mathbf{Par}_A = \{q, \mathbb{G}_1, \mathbb{G}_2, e, P, P_1, P_{pub}, H, H_1, H_2, H_3\}$
- Pick another large prime  $p$  that discrete logarithm problems are difficult on  $\mathbb{Z}_p^*$ , and  $g \in \mathbb{Z}_p^*$  which is a primitive root of  $\mathbb{Z}_p^*$ . Set  $\mathbf{Par}_E = \{p, g\}$ .

Then TA publishes all public indicators,  $\mathbf{Par}_A$  and  $\mathbf{Par}_E$  while keeping the master-key  $s$  secret.

### B. Operations Conducted by Message Senders

Recall the example of *Bob* and *Alice* in Section VI. After extracting the routing graph  $\mathbb{G}'$  of  $m$  according to  $\mathbb{G}$ , current location and  $\mathcal{L}$ , *Bob* encrypts  $m$  and constructs ARS for  $m$ .

#### 1) Encrypting User Data $m$

*Bob* uses the universal re-encryption scheme proposed by P. Golle *et al.* [7] to encrypt  $m$ . The scheme has the feature that intermediate nodes can re-encrypt  $m$  without knowing the identity or public key of the receiver. Specifically, *Bob* uses *Alice's* public key  $pk_A = g^{sk_A}$  ( $sk_A \in \mathbb{Z}_p$ ) to encrypt  $m$ , so that only *Alice* who holds the secret key  $sk_A$  can recover  $m$ . The ciphertext  $\mathcal{M}$  has two parts. The second part is used for the future re-encryptions. The encryption proceeds as follows:

- Pick a pair of random encryption factors  $(\tau_1, \tau_2) \in \mathbb{Z}_p^2$ .

- Compute  $\mathcal{M} = \{(m \cdot pk_A^{\tau_1}, g^{\tau_1}); (pk_A^{\tau_2}, g^{\tau_2})\}$ .

#### 2) Constructing ARS

Assume the routing graph  $\mathbb{G}'$  includes  $\mu$  routes  $\{R_1, R_2, \dots, R_\mu\}$ ,  $R_\mu$  is the last relay route which covers  $n$  cells  $\{c_1, c_2, \dots, c_n\}$ , and  $\mathcal{L}$  located in cell  $c_\rho$  ( $1 \leq \rho \leq n$ ). Then *Bob* imbeds relay and broadcast indicators into ARS, according to edges of  $\mathbb{G}'$  and  $c_\rho$ . Specifically, *Bob* carries out the following steps to pick public RI and BI.

- Choose public relay indicators: if  $e(v_{R_i}, v_{R_j}) \in \mathbb{G}'$ ,  $1 \leq i, j < \mu$ , then pick  $I^p_{rly(R_i, R_j)} = R_i \| R_j$ .
- Choose public broadcast indicators:
  - Pick  $I^p_{bst(R_\mu - \{0, 1\}^{\lceil \log_2 n \rceil})} = R_\mu \| c_\rho$ .
  - Pick all public BIs on the path from  $R_\mu \| c_\rho$  to the root of BI tree, i.e.,  $\{I^p_{bst(R_\mu - \{0, 1\}^{\lceil \log_2 n \rceil - 1})}, \dots, I^p_{bst(R_\mu - \{0, 1\})}, I^p_{bst(R_\mu)}\}$

For the example in Fig. 6, if  $\mathcal{L}$  is in the cell  $c_3$ , then  $I^p_{bst(R_7\_010)}$ ,  $I^p_{bst(R_7\_01)}$ ,  $I^p_{bst(R_7\_0)}$ , and  $I^p_{bst(R_7)}$  (gray circles) will be selected as public BIs.

Assume *Bob* has chosen  $t$  public indicators  $I_i^p$ , ( $1 \leq i \leq t$ ) (both RI and BI), he generates the ARS as follows:

- For each  $I_i^p$ , compute  $x_i = H(I_i^p)$  and  $Q_i = H_1(I_i^p)$ .
- Compute

$$\ell_i(x) = \prod_{1 \leq j \neq i \leq t} \frac{x - x_j}{x_i - x_j} = a_{i,1} + a_{i,2}x + \dots + a_{i,t}x^{t-1}$$

where  $a_{i,1}, a_{i,2}, \dots, a_{i,t} \in \mathbb{Z}_q$ . Then

$$\ell_i(x_j) = \begin{cases} 1 & , \text{ if } i = j \\ 0 & , \text{ if } i \neq j \end{cases}$$

- Set  $\mathbf{a}_i = [a_{i,1}, a_{i,2}, \dots, a_{i,t}]^T$ . Compute the routing information

$$\begin{bmatrix} A_1 \\ A_2 \\ \vdots \\ A_t \end{bmatrix} = [\mathbf{a}_1, \mathbf{a}_2, \dots, \mathbf{a}_t] \times [Q_1, Q_2, \dots, Q_t]^T$$

$$= \begin{bmatrix} a_{1,1}Q_1 + a_{2,1}Q_2 + \dots + a_{t,1}Q_t \\ a_{1,2}Q_1 + a_{2,2}Q_2 + \dots + a_{t,2}Q_t \\ \vdots \\ a_{1,t}Q_1 + a_{2,t}Q_2 + \dots + a_{t,t}Q_t \end{bmatrix}$$

- Pick a string  $\sigma \xleftarrow{R} \{0, 1\}^\omega$ , and set  $\alpha = H_3(\sigma, \mathcal{M})$ .

- Pick an integer  $\beta \xleftarrow{R} \mathbb{Z}_q^*$ , and set  $y = (\beta^{-1}\alpha) \bmod q$ .

- Compute  $y \cdot [A_1, A_2, \dots, A_t] = [B_1, B_2, \dots, B_t] = \mathbb{B}$ .

- Set  $ARS = \langle \mathbb{B}, \alpha P, \beta P_{pub}, \sigma \oplus H_2(e(P_{pub}, P_1)^\alpha) \rangle$ .

Then *Bob* sets message  $C = \langle ARS, \mathcal{M} \rangle$  and forwards  $C$  to one source route  $v_s$  in  $\mathbb{G}'$  directly.

### C. Operations Conducted by Buses

When a bus on  $R_i$  receives message  $C$ , it verifies whether  $R_i$  was selected as a relay route. If so, the bus re-constructs  $C$ , and relays the updated  $C$  according to the indicators.

TABLE I: ALGORITHM1

| <b>Algorithm1:</b> Verify( $I^p, I^s, ARS, \mathcal{M}$ )  |
|--|
| $\text{/* } ARS = \langle \mathbb{B}, \alpha P, \beta P_{pub}, \sigma \oplus H_2(e(P_{pub}, P_1)^\alpha) \rangle */$                 |
| $x = H(I^p);$  |
| $\theta = B_1 + xB_2 + \dots + (x^{t-1} \bmod q)B_t;$  |
| $\bar{\sigma} = \sigma \oplus H_2(e(P_{pub}, P_1)^\alpha) \oplus H_2\left(\frac{e(\alpha P, I^s)}{e(\beta P_{pub}, \theta)}\right);$ |
| $\bar{\alpha} = H_3(\bar{\sigma}, \mathcal{M});$   |
| If $\bar{\alpha}P = \alpha P$ , return <b>TRUE</b> ; /* $I^p$ was imbedded in $ARS$ and $\bar{\alpha} = c$                           |
| Else return <b>FALSE</b> .   |

### 1) Verifying ARS

The bus on  $R_i$  uses its public/secret indicator pairs  $(I^p, I^s)$  to verify which indicators were imbedded in the ARS. It checks the ARS as follows:

- Verify if the root of  $R_i$ 's public BI tree,  $I_{bst(R_i)}^p$ , was imbedded in ARS, which means  $R_i$  is the last relay route of  $C$ . If so, go to step 2. Otherwise, go to step 3.
- Verify if its second layer BIs  $\{I_{bst(R_i,0)}^p, I_{bst(R_i,1)}^p\}$  were imbedded in ARS. One of them is included in ARS means that  $C$  should be broadcasted within the corresponding region. If one of them was in ARS,  $R_i$  further verifies if any of its two children BIs was imbedded in ARS, and so on, until reaching to the highest layer BIs. The highest layer BI imbedded in ARS indicates final broadcasting cell.
- Verify relay indicators of  $R_i$  to see if some of them were imbedded in ARS, which means  $R_i$  is one of intermediate relay routes, and  $C$  should be sent to one of the routes included in the corresponding RIs.

Given an indicator pair  $(I^p, I^s)$ , the verification can be done using **Algorithm 1** (Table I).

If all verifications return false, it means that  $R_i$  is not in  $\mathbb{G}'$ . Hence,  $R_i$  simply ignores it. Otherwise,  $R_i$  should be either an intermediate or one of the last relay route.

### 2) Re-generation of ARS and $\mathcal{M}$

If  $R_i$  is an intermediate relay route, the bus on  $R_i$  re-generates the ARS and  $\mathcal{M}$  in order to build the mix net, defending against traffic analysis attacks. Then  $R_i$  prepares  $C = \langle ARS, \mathcal{M} \rangle$  for next relay. If  $R_i$  is the last relay route, (i.e.,  $R_\mu$ ) the bus simply discards the ARS and re-encrypts  $\mathcal{M}$ . Then  $R_i$  broadcasts  $\mathcal{M}$  in cell  $c_p$  calculated before. The re-encryption of  $\mathcal{M}$  proceeds as follows:

- Choose a random re-encryption factor  $(\tau'_1, \tau'_2) \in \mathbb{Z}_p^2$ .
- Compute

$$\mathcal{M}' = \left\{ (m \cdot pk_A^{\tau_1} (pk_A^{\tau_2})^{\tau'_1}, g^{\tau_1} (g^{\tau_2})^{\tau'_1}); ((pk_A^{\tau_2})^{\tau'_2}, (g^{\tau_2})^{\tau'_2}) \right\}$$

$$= \{(\lambda_0, \rho_0); (\lambda_1, \rho_1)\}$$

The re-generation of the ARS proceeds as follows:

- Pick a string  $\sigma' \xleftarrow{R} \{0, 1\}^\omega$ , and set  $\alpha' = H_3(\sigma', \mathcal{M}')$ .
- Pick an integer  $\beta' \xleftarrow{R} \mathbb{Z}_q^*$ .
- Note  $RID_i$  can obtain the value of  $\alpha$  from **Algorithm 1**.
- Set  $y' = ((\beta')^{-1} \alpha'^{-1} \alpha') \bmod q$ .

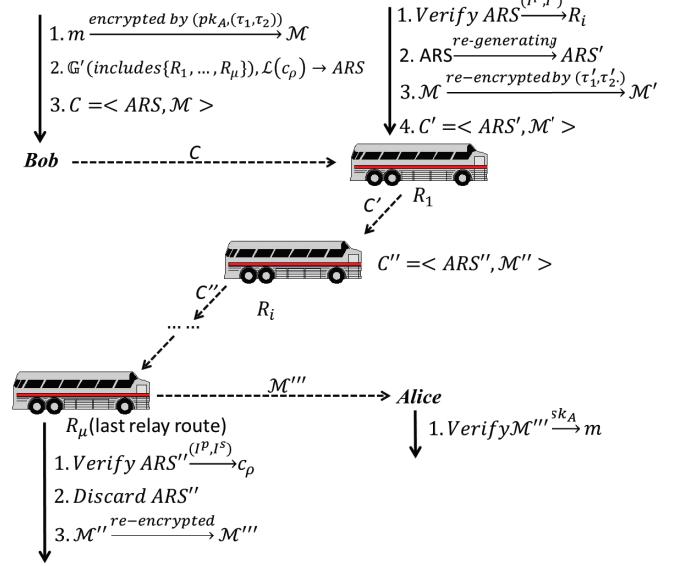


Fig. 7: An illustration of data forwarding (Bob sends  $m$  to Alice) using ARS.

### d. Compute

$$\begin{aligned} \mathbb{B}' &= y' \cdot \mathbb{B} = y' y \cdot [A_1, A_2, \dots, A_t] \\ &= ((\beta' \beta)^{-1} \alpha') \bmod q \cdot [A_1, A_2, \dots, A_t] \\ &= [B'_1, B'_2, \dots, B'_t] \end{aligned}$$

$$e. ARS' = \left\langle \mathbb{B}', \alpha' P, \beta' P_{pub}, \sigma' \oplus H_2\left(e(P_{pub}, P_1)^{\alpha'}\right) \right\rangle.$$

### D. Operations conducted by Receivers

When Alice receives  $\mathcal{M}'$ , she decrypts  $\mathcal{M}'$  using her private key  $sk_A$  as follows:

- Verify if  $\lambda_1 / \rho_1^{sk_A} = (pk_A^{\tau_2})^{\tau'_2} / ((g^{\tau_2})^{\tau'_2})^{sk_A} = 1$ . If so, decryption is successful, execute step 2. Otherwise, decryption fails, drop the packet.
- Compute  $m = \lambda_0 / \rho_0^{sk_A}$ .

Fig. 7 illustrates the whole procedure data forwarding using ARS, including the encryption of user data, construction of ARS, verification of ARS, re-generation of ARS and ciphertext  $\mathcal{M}$ , and decryption of user data.

## VIII. ANALYSIS

### A. Privacy Analysis

We first analyze abilities of different entities on understanding packets, which facilitates privacy analysis of the proposed scheme. First, for buses in the  $\mathbb{G}'$  of a message  $C(C')$ , after receiving the message, they can verify that some of their indicators are imbedded in ARS. For the intermediate and the last relay routes in  $\mathbb{G}'$ , they can get one-hop routing instructions and broadcasting region of the packet, respectively. Each route in  $\mathbb{G}'$  can only reveal indicators of their own, no one has the knowledge of a whole routing graph. Second, for buses which are not in  $\mathbb{G}'$ , after receiving  $C(C')$ , they verify the ARS in  $C(C')$  and all the verification fails. Hence they only know that they are not in  $\mathbb{G}'$ . Third, because of the hop-by-hop re-construction of  $C$ , neither inside nor outside

observers can link  $C$  to  $C'$ . No one has global view on the routing path of  $C$ . Although adversaries have global view of traffic in bus networks, they can hardly induce the travelling path of single packet. Hence the mix net is constructed from both the viewpoint of outside and inside observers. Last,  $m$  is encrypted by Alice's public key, none of them can decrypt  $\mathcal{M}(\mathcal{M}')$  except Alice. Since the confidentiality can be achieved obviously, we focus on analyzing the unlinkability and backward unlinkability of the proposed method.

### 1) Unlinkability

Adversaries cannot launch traffic analysis attacks successfully by monitoring communication channel for two reasons. First, buses serving as mix proxies re-construct all communications in each hop. Content relevance between incoming and outgoing packets on buses is wiped off. Hence adversaries cannot link different packets by their contents. Second, buses pick and forward packets in a store-carry-forward fashion. Buses receive packets continuously, thus a number of packets are stored waiting for transmitting. Once a relay opportunity arises or a bus approaches to broadcasting region, packets under the same indicator stored on the bus will be relayed all together. In this way, the spatial and temporal correlations between incoming and outgoing packets on buses are eliminated.

Adversaries cannot launch packet marker attacks to track packets. In such attacks, an adversary eavesdrops packet  $C$ , and replaces  $\mathcal{M}$  with an encrypted marker  $\mathcal{N}$  that can be decrypted by it. However, Relay buses can verify that the ARS is not generated for  $\mathcal{M}$  (Since  $(\bar{\alpha}' = H_3(\bar{\alpha}, \mathcal{N})$ , however  $\bar{\alpha}'P \neq \alpha P$ ). Then  $\mathcal{N}$  will be dropped.

### 2) Backward Unlinkability

If an adversary invades a bus in  $\mathbb{G}'$  and gets packet  $C$  recorded by it. By verifying ARS, it can only recover one-hop routing information. Moreover, any relay bus re-encrypting  $\mathcal{M}$  does not know the identity of Alice, which implies that the adversary cannot get any information of Alice by revisiting  $\mathcal{M}$ . Hence backward unlinkability can be achieved.

## B. Performance Analysis of Privacy Preserving Mechanisms

The proposed scheme contains operations related to ARS and  $m$ . The performance of the re-encryption scheme on  $m$  has been analyzed in [7]. Hence we focus on the performance of ARS operations. Table II summarizes the notations used.

Since  $\mathbb{G}$  and cells are static for a given bus network. All RIs and BIs over the network are determined. Hence, senders can conduct one-time computations on  $x_i = H(I_i^p)$  and  $Q_i = H_1(I_i^p)$  for all indicators  $I_i^p$  in advance.  $(x_i, Q_i)$  can be used on all ARS constructions in future. For this reason, the generation of  $(x_i, Q_i)$  was not counted in the computation cost. Assume  $t$  public indicators are imbedded in an ARS. Computational and storage complexities of the ARS are summarized in Table III.

## IX. DISCUSSION

### A. Increasing the Number of Edges in Routing Graph

In BusCast, increasing the number of edges  $t$  in  $\mathbb{G}'$  implies more flexibility. As  $t$  grows, the size of ARS is also linearly

TABLE II: NOTATIONS

| Notation | Meaning   |
|----------|---|
| $t$      | The number of public indicators imbedded on ARS |
| $e$      | Bilinear map                                    |
| $\phi$   | Bit length of elements in $\mathbb{G}_1$        |
| $\omega$ | Bit length of strings outputted by $H_2(\cdot)$ |
| $GA$     | Addition over $\mathbb{G}_1$                    |
| $GM$     | Multiplication over $\mathbb{G}_1$              |
| $GE$     | Exponentiation over $\mathbb{G}_2$              |
| $EX$     | Exponentiation over $\mathbb{Z}_q^*$            |
| $MUL$    | Multiplication over $\mathbb{Z}_q^*$            |

increasing which consumes more communication bandwidth. In vehicular scenario, where the wireless link quality is very dynamic, long messages may suffer failures. In BusCast, for  $\phi = 160$  bits (with security comparable to 1024-bit RSA encryption), the length of ARS is  $20 \cdot (t+2) + \omega$  bytes. Simulation results show that a relatively small  $t$  can significantly boost packet forwarding. Typical length of  $t$  is several tens. Buses regenerate and verify ARSs without interactions with others. The operations related to ARS are not restricted by the connecting time between buses. Hence, we do not analyze the computation time of ARS in detail.

### B. Buses Intrusion Countermeasure

Once TA receives an intrusion warning report from  $R_i$ . TA takes following responses to reset indicators of  $R_i$ . First, TA re-allocates a new ID for the invaded routes, and generates corresponding secret indicators using master-key  $s$ . Second, resets all indicators of the route  $R_i$  using a secure channel. Third, notifies other buses and users for ID updating.

## X. ROUTING PERFORMANCE EVALUATION

### A. Methodology

In this section, we examine the performance of BusCast through trace-driven simulations. We compare BusCast with two alternative schemes:

- **Onion Routing.** In this scheme, buses relay a packet according to the pre-decided shortest path, which is computed on the contact graph of the bus network.
- **Epidemic.** In this scheme, buses exchange every packet whenever they experience a contact. Using this scheme can achieve the shortest end-to-end delay, however, also generate a tremendously large volume of network traffic.

We consider three metrics to evaluate the performance of our algorithm and the above schemes, including *end-to-end delay*, *delivery ratio* and *network traffic per packet*.

In the following simulations, we use the same trace data described in Section III. At beginning of each experiment, we inject 100 packets using a Poisson packet generator. For each packet, the source and destination are randomly chosen within the downtown area. The transmission range of buses is set to 900m. We use two time periods of trace, namely, off-peak hours (from 2pm to 5pm) and peak hours (from 5pm to 8pm) on Feb. 28th, 2007 to conduct the simulations. For each simulation configuration, we run the simulation 20 times and get the average.

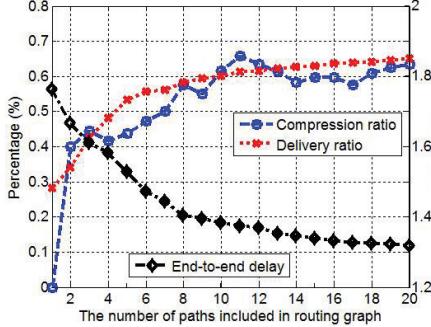


Fig. 8: Delivery ratio of packets and compression ratio of edges, under different number of paths in  $\mathbb{G}'$ .

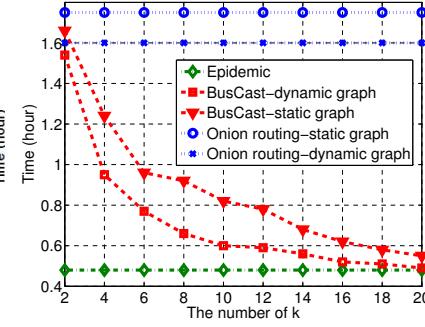


Fig. 9: End-to-end delay during off-peak hours

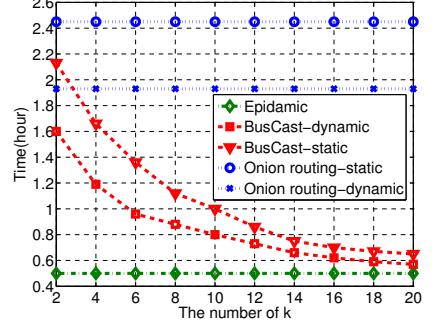


Fig. 10: End-to-end delay during peak hours.

### B. Effect of Routing Graph Size

We first examine the effects of the size of routing graph  $\mathbb{G}'$  to the delivery performance. For each packet,  $\mathbb{G}'$  is generated by picking  $k$ -shortest paths from the source bus to the destination on contact graph  $\mathbb{G}$ . Duplicate edges between paths are removed. In this set of simulations,  $\mathbb{G}$  is constructed in a static way described in Section VI B. Unicast is used to forward packets. We change  $k$  from 1 to 20 at an interval of one. In Fig. 8, the red line indicates that increasing  $k$  will result in higher delivery ratio. The delivery ratio increases very fast when  $k$  is smaller than 6, after that the growth becomes slow. It implies that a high cost performance ratio can be achieved when  $k$  is 6. We also verify the *compression ratio of edges* in  $\mathbb{G}'$ . Denote the number of the edges on path  $i$  is  $p_i$ , and the number of edges in  $\mathbb{G}$  is  $q$ . The *compression ratio of edges* is defined as  $1 - (q / \sum_1^k p_i)$ . The blue line shows that the compression ratio larger than 40% even for very small  $k$ , and the compression ratio increases up to about 60% when  $k$  larger than 8. Fig. 8 also plots the end-to-end delay as a function of the number of  $k$  in routing graph. It is clear to see that as the number of paths increases the delivery delay dramatically drops. The average traffic per packet is 6 hops.

### C. Performance Comparisons under Dynamic Traffic

In this experiment, we compare BusCast with other alternative schemes under dynamic traffic conditions, using both static and dynamic contact graph where the weight  $w_{i,j}$  of edge  $\hat{e}(v_i, v_j)$  are calculated in different ways.

- In static graph, according to the geographical feature of  $v_i$  and  $v_j$ ,  $w_{i,j}$  is proportional to the contact opportunities between  $v_i$  and  $v_j$  (see detail in Subsection VI. B).

- In dynamic contact graph, we use *average inter-contact time of routes* to determine  $w_{i,j}$ . We refer to inter-contact time as the time elapsed between two successive contacts of two bus routes. In order to obtain the inter-contact time of route  $v_i$  and  $v_j$ , we first extract all contacts between buses from  $v_i$  and  $v_j$ , respectively, and sort the contacts in terms of time, then the inter-contact time is computed at the end of each contact, as the time period between the end of this contact and the start of the next contact between the same two routes.

We change  $k$  from 2 to 20 at an interval of two and conduct the experiments. Fig. 9 and Fig. 10 plot the end-to-end delay during off-peak and peak hours, respectively. It can be seen that BusCast can achieve very short delay comparing with Onion routing. Epidemic routing has the shortest delay due to flooding guarantees that the optimal path can always be found, however it also generates prohibitive network traffic. As  $k$  increasing, the delay of BusCast is reduced. When  $k$  reaches to 20, BusCast can achieve a very close delay comparing with epidemic routing. Meanwhile, BusCast only generate moderate traffic. For example, when  $k = 6$ , BusCast generates 9.3 hops traffic per packet when using dynamic contact graph during peak hours. It can also be seen that using dynamic contact graph is always better than using static graph especially when routing during peak hours.

## XI. CONCLUSION AND FUTURE WORK

In this paper, we have developed a message delivery scheme BusCast which ensures both efficiency and users privacy in time insensitive scenarios. A flexible routing strategy is proposed to adapt highly dynamic changes of bus network topologies. A three-part privacy preserving mechanism is

TABLE III: COMPUTATIONAL AND STORAGE COMPLEXITY OF ARS

| Cost of Construction   | Cost of Re-construction                                    | Cost of Verification                                    | Cost of Secret Indicator Generation | Size of ARS                  | Number of System Parameters |
|--|--|---|-------------------------------------|------------------------------|-----------------------------|
| $(t^2 + t + 2)GM$<br>+ $(t^2 - t)GA$<br>+ $2MUL$<br>+ $1EX + 1GE$<br>+ $1e + 1H_3$<br>+ $1H_2$ | $(t + 2)GM$<br>+ $4MUL$<br>+ $1GE + 1e$<br>+ $1H_3 + 1H_2$ | $(t - 1)GM$<br>+ $(t - 1)GA$<br>+ $2e + 1H$<br>+ $1H_3$ | $(t + 2)\zeta$<br>+ $\omega$        | $1GM$<br>+ $1GA$<br>+ $1H_1$ | 13                          |

introduced to ensure anonymous communications. We have demonstrated the efficacy of BusCast through rigorous analysis and extensive trace-driven simulations. For our future work, we intend to investigate different schemes of routing graph generation, as well as develop shortened ARS to reduce the cost of bandwidth. Furthermore, we will validate our design and study its performance under real complex environments. Improvements will be made based on the realistic studies before it comes to be deployed in SG.

## REFERENCES

- [1] T. Nadeem, S. Dashtinezhad, C. Liao, and L. Iftode, "TrafficView: traffic data dissemination using car-to-car communication", *Mobile Computing and Communications Review*, vol. 8, no. 3, pp. 6-19, 2004.
- [2] M. D. A. Florides, T. Nadeem, and L. Iftode, "Location-aware services over vehicular ad-hoc networks using car-to-car communication", *IEEE Journal on Selected Areas in Communications*, vol. 25, issue 8, pp. 1590-1602, 2007.
- [3] Y. Zhang, J. Zhao, and G. Cao, "Roadcast: a popularity aware content sharing scheme in VANETs", in *proceedings of ICDCS'09*, Montreal, QC, Canada, Jun. 2009.
- [4] D. Chaum, "Untraceable electronic mail, return addresses, and digital pseudonyms", *Communications of the ACM*, vol. 24 issue 2, pp. 84-90, 1981.
- [5] Y. Liu, R. Zhang, J. Shi, and Y. Zhang, "Traffic inference in anonymous MANETs", in *proceedings of SECON'10*, Boston, MA , Jun. 2010.
- [6] R. Dingledine, N. Mathewson, and P. Syverson. "Tor: The second generation onion router", in *proceedings of USENIX Security Symposium'04*, San Diego, CA, USA, Aug. 2004.
- [7] P. Golle, M. Jakobsson, A. Juels, and P. Syverson, "Universal re-encryption for mixnets", in *proceedings of CT-RSA'04*, San Francisco, CA, USA, Feb. 2004.
- [8] R. Lu, X. Lin, and X. Shen, "SPRING: a social-based privacy-preserving packet forwarding protocol for vehicular delay tolerant networks", in *proceedings of INFOCOM'10*, San Diego, CA, USA, Mar. 2010.
- [9] O. Berthold, H. Federath and S. KÄopsell, "Web MIXes: A system for anonymous and unobservable Internet access", In Hannes Federath (Ed.), Designing Privacy Enhancing Technologies, *Lecture Notes in Computer Science*, LNCS 2009, pp. 115-129, Springer-Verlag, 2001.
- [10] M. Freedman, and R. Morris, "Tarzan: a peer-to-peer anonymizing network layer", in *proceedings of CCS'02*, Washington, USA, Nov. 2002.
- [11] G. Danezis, R. Dingledine, and N. Mathewson, "Mixminion: design of a type III anonymous remailer protocol", in *proceedings of S&P'03*, Berkeley, USA, May. 2003
- [12] R. Zhang, Y. Zhang, and Y. Fang, " AOS: an anonymous overlay system for mobile ad hoc networks", *Journal Wireless Networks*, vol.17, issue 4, pp. 843-859, 2011.
- [13] J. Kong, and X. Hong, "ANODR: anonymous on demand routing with untraceable routes for mobile ad-hoc networks", in *proceedings of MOBIHOC'03*, New York, USA, Jun. 2003.
- [14] A. Boukerche, K. El-Khatib, L. Xu and L. Korba, "An efficient secure distributed anonymous routing protocol for mobile and wireless ad hoc networks", *Computer Communications*, vol. 28, issue 10, pp. 1193-1203, 2005.
- [15] R. Song, L. Korba, G. Yee, "AnonDSR: efficient anonymous dynamic source routing for mobile ad-hoc networks", in *proceeding of SASN'05*, Alexandria, USA. Nov. 2005.
- [16] Y. Fan, Y. Jiang, H. Zhu, J. Chen, and X. Shen, "Network coding based privacy preservation against traffic analysis in multi-hop wireless networks", *IEEE Trans. on Wireless Communications*, vol. 10, issue 3, pp. 834-843, 2011.
- [17] R. Jansen and R. Beverly, "Toward anonymity in delay tolerant networks: threshold pivot scheme", in *proceedings of MILCOM'10*, San Jose, USA, Nov. 2010.
- [18] L. Chen, and J. Malone-Lee, "Improved identity-based signcryption", in *proceedings of PKC'05*, Les Diablerets, Switzerland, Jan. 2005.
- [19] D. Boneh, and M. Franklin, "Identity-based encryption from the Weil pairing", *SIAM J. Computing*, 32(3):586-615, 2003. Extended abstract in *proceedings of Crypto'01*, Santa Barbara, California, USA, Aug. 2001.



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