Message Prioritization of Epidemic Forwarding in Delay-Tolerant Networks

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Abstract-Delay-tolerant networking is the innovation of extending the capabilities of communication networks in the temporal domain. It is an essential technology to enhance data communications in extreme scenarios, where crucial messages must be transferred with the infrastructure rendered unavailable or hostile. In this work, we consider the problem of disseminating a large number of messages in such networks. With the sparse and intermittently connected topology and with the unreliable and low-rate radios, the strategy of which messages to transfer first and in what order is a determinant of performance here. We compare a few such message prioritization methods using computer simulation and observe their performance in terms how widely and quickly information can be distributed across the network.

I. INTRODUCTION

Data communication networks connect computing devices with wired or wireless links to fulfill automated or humaninitiated information exchange. For such networks to scale as the number of devices in it increases, we allow messages to traverse multiple communication links to travel from its source node to the destination. Such a "store and forward" technique is the essence of how the Internet is able to support billions of computers and users. This effectively extends the scope of communication networks spatially. In contrast, recent research on Delay-Tolerant Networking (DTN) [1], [13] has been exploring the possibility of extending communication networks temporally. With the advancement at the wireless networking and mobile computing frontier, mobile devices can be used to "store, carry, and forward" data when they roam around. That is, even without cellular infrastructure and only relying on short-range radios, e.g. Wi-Fi and Bluetooth, a set of sparsely deployed mobile nodes or handheld devices can be used to transfer data automatically if such data are not time-sensitive. The DTN technology can be useful in many scenarios, such as mobile sensor networks, disaster recovery, social networking, etc., to name a few.

At the center of DTN is the requirement that intermediate nodes should buffer messages for an extended period of time. This is in stark contrast to IP [14], where nodes simply discards messages when they are found undeliverable. To achieve a high or even acceptable deliver ratio, there is a significant burden on buffer space. Furthermore, because of the transient, unpredictable, low-bandwidth, and unreliable nature of device contact, efficacious utilization of such opportunities for nodes to exchange data is crucial. Therefore, tradeoff and Walter Taylor and Jason H. Moore Computational Genetics Laboratory Giesel School of Medicine Dartmouth College USA

optimization in resource management is the major challenge in operating a DTN [5].

In the seminal work of Epidemic Routing [19], when two nodes (or devices) come into transmission range of each other, they conduct a 3-way handshake for one device to send messages to the other. In particular, when nodes A and Bdiscover each other, node A sends an array of the IDs of all of its known messages to B. After receive this array and comparing it to its own set of buffered messages, node Breplies with a subset of these message IDs as request indicating that these are the messages that A has but B does not. In the third message, node A sends the requested message to B. This process is triggered every time two nodes come close to each other. Apparently, epidemic routing can be a foundation for fulfilling both unicast and broadcast data transfer services.

In this article, we study the particular operation of information dissemination (i.e. message broadcasting) in DTNs. We do not assume any temporal self-similarity in the mobility of devices, so we do not rely on extrapolating previous contact information. We focus on the case where the number of buffered messages is so large that any form of compact representation of all stored messages, such as digest or ID, would not be accommodated in a single handshake packet. Therefore, when a node advertises about the messages it has received so far, it must pick strategically a subset of them to fit in a single packet. Such a strategy affects how quickly messages can be disseminated to a large number of nodes. We implemented the message dissemination framework with three prioritization approaches in The ONE [4], and tested them with one baseline approach. We observe that a well designed message prioritization method can significantly expedite such a broadcast service in DTNs.

The rest of this article is organized as follows. We review some of the most salient related research in Section II. In Section III, we discuss three message prioritization approach and one baseline method. We report experiment settings and results about these prioritization methods in Section IV and conclude the article with future research in Section V.

II. RELATED WORK

Research on DTN started from the Interplanetary Networking project at JPL [3]. The networking problem in such a scenario considers predictable mobility of space probes and surface stations, where the feedback loop can take a very long time to complete due to both signal propagation delay and obstacles of other celestial bodies. In a more general setting, the mobility of communication devices is unpredictable, so scheduling networking activities in a deterministic fashion is no longer feasible. A great deal of research has been done on data transfer in such a framework to fulfill the simple goal of moving data from the source to its destination. A number of excellent reviews and vision articles have been published on the architecture and protocol aspects of delaytolerant networks [11], [13], [20], [21].

The two most important, and yet distinct operations at the Network Layer are data forwarding and routing [14]. Forwarding regulates how packets are taken from one link and put on another. Routing determines which path a data packet should follow from the source node to the destination. The latter essentially provides the former with control input. Here, we stick to the term of data forwarding although it is also sometimes referred to as routing in literature.

Data forwarding in unpredictable DTN is more or less inspired by Epidemic Routing [19]. There, the authors are interested in transferring messages to their destinations as quickly as they can at the cost of using a large amount of network resources consumed by making many copies of the messages. Subsequent work on unicast data, where a message has a sole destination, explores the tradeoff between the data transfer performance, in terms of latency and delivery ratio, and resource consumption. For example, Spray and Wait [18] regulates the number of copies a message using a single control parameter.

When assuming that historical contact information would imply a similar pattern in future, nodes can utilize such observation to construct some sort of utility function to decide which node in its proximity might help forwarding its messages more effectively. This approach was initially explored in PROPHET [15] and MaxProp [6] most noticeably. When historical contact is further distilled with social network analysis methods, nodes can make more sophisticated forwarding decisions taking more factors into consideration. Such an approach is exemplified in BUBBLE-Rap [10], Delegation Fowarding [9], SimBet [8], and CAR [17].

Data forwarding techniques aside, researchers in data communications have also been on a quest for the killer applications of this groundbreaking technology for years [16]. Although such a quest is far from satisfactory, there have been a number of interesting applications in infrastructureless computer networking, such as IPN [3], Haggle [2], ZebraNet [12] and iSNAC [7], to name a few. Among these, iSNAC is a mobile social networking iPad application that focuses on broadcasting messages to help conference attendees to share information effectively.

III. MESSAGE PRIORITIZATION

In this work, we are interested in the problem of disseminating messages from a particular source to all other nodes in the network. We consider an intermittently connected network, where a set of sparsely deployed nodes roam around without assuming any predictability. Each node periodically injects a message into the network intended to all other nodes. We take a similar approach to Epidemic Routing in that, when two nodes come into range of each other, one node can transfer a set of messages to the other via a 3-way handshake sequence. The difference, however, is that we must pick and choose which messages to include in a short advertisement packet so that the system has a high overall throughput. Specifically, when node A discovers node B, it sends a summary vector SV_A . In the original Epidemic Routing, SV_A contains the IDs of all the message that A stores in its buffer. In our solution, it is a subset of these messages because there can be many of them after the system has been up running for some time. After receiving SV_A , node B replies with $SV_A - M_B$, where M_B is the set of all messages stored at node B. As such, node B essentially tells A which messages from A would potentially enrich B's collection. Next, node A retrieves messages in $SV_A - M_B$ from its storage and sends them to node B in a burst to complete the handshake. If the two nodes are still within range τ seconds after the handshake, they will start another round of handshake to transfer more messages.

Apparently, given that nodes typically store more messages than that can fit in a single handshake packet, the strategy taken to include which messages in the advertisement and in what order affects the system performance significantly. We call such a strategy *message prioritization*. In this work, we are interested in a few simple, and yet very different such methods. In all methods, we assume that node A fills the advertisement packet with l digests of some of its stored messages.

- Round robin Node A maintains a FIFO queue of the messages it has received and generated so far, i.e. by the time it is injected into the network. It circulates through the queue to compile the message digests using a pointer. When it is about to initiate a handshake, it processes *l* messages and advance the pointer accordingly. Here, the node maintains separate pointers for different nodes. Note that as the system continues, the time it takes to finish a round becomes longer, and when it does, it starts from the head of the queue again.
- 2) Tiered - Messages stored at a node are ranked according to three quantities to favor new, short messages, i.e. forward history, age, and length. The fewer times it has been forwarded till reaching this node A, the later it was created, and the shorter it is in length, it is ranked higher in the storage queue. These ranked messages are split into three segments of equal number of messages, the upper, middle, and lower tiers. Three separate round-robin schedules are executed on the tiers. The upper tier has three opportunities to send an advertisement containing ldigests of its own, the middle tier has two, and the lower tier has one. As such, the system helps newly injected message to spread in the network more quickly.
- 3) Oblivious Node A maintains a FIFO queue of all messages by the time they are injected into the network as in Round robin. When the node needs to create an advertisement packet, it simply takes the last l messages in the queue. In this method, the node never looks back after it has past a message in the queue, thus, always rigidly favoring the latest messages in the system.

In addition to the three above, we also implemented a *random* prioritization method as a comparison baseline. In this approach, node A would randomly pick l messages and advertise their digests. All four methods have different ways to allocate opportunities to messages to be advertised in the network. We tested these different message prioritization methods to see how effective they are in helping messages to spread in the system.

IV. EXPERIMENTS

We used The ONE [4] to evaluate how different message prioritization methods affect the performance of the system. We measured the latency in transferring messages to the destinations and a variant of message delivery ratio. We observe that the Oblivious prioritization method is significantly superior to the other approaches despite its simple nature.



Fig. 1. Engineering Building

A. Settings

We used the map mobility management of The ONE simulator, where a topological structure of the simulation area is used to specify how nodes can move around. During the simulation, a node can decide a destination position, such as an intersection or a specific point on an edge, and moves there via the shortest path at a certain velocity. When two nodes are within transmission range (set to 10 meters in simulation), they discover each other and start to transfer messages. The map that we used in our tests is part of the first and second floors of the Engineering Building at Memorial University of Newfoundland (Figure 1). We picked this particular venue because in a parallel project we implemented prototype applications on the iOS and Android OS so that we can compare the real and simulated test results in future.

We assumed using the Bluetooth 4.0 radios on the iOS devices. As such, the maximum size of a single packet in the handshake is limited to 90kB. Around every 400 seconds, a device injects a message of size uniformly distributed in [2000, 5000] bytes. Parameter settings are summarized in Table I.

B. Results

We are interested in how widely and quickly messages are disseminated in the network, measured in two quantities,

Parameter	Value
Parameter number of nodes in network n total simulation time T node movement velocity v message generate rate per device t mumber of digests in advertisement packet l interval of digest advertisement τ maximum packet length S	Value 10, 20 or 30 20,000 seconds $0.5 \sim 1.5 \text{ m/s}$ every 400 seconds 2,000 ~ 5,000 bytes 10 messages every 150 seconds 10 meters 90 kB
delivery deadline d	3000 seconds

TABLE I. SIMULATION PARAMETERS



Fig. 2. Message delivery extent in 10-node network

i.e. extent and progression. After a message is generated, it is first stored at the originator, and as time goes on, it reaches more and more nodes. We observe how many other nodes a particular message has reached after d seconds, where dis called *delivery deadline* (d = 3000 in simulation). For a given message m and delivery deadline d, we denote the set of nodes in the network that m has reached after d other than the message originator itself by $O_{m,d}$. Thus, the *extent* of message m is defined as $|O_{m,d}|$, i.e. how many other nodes the message has reached up till the deadline. We consider the messages injected during the first 14,400 seconds of the entire 20,000 seconds of simulation so that all messages would have sufficient time to be disseminated. For a network n nodes $(n = 10, 20 \text{ or } 30), 360 \times n \text{ messages are injected in total},$ collectively denoted by M. As such, we plot a histogram of the extent over M, for n = 10, 20 or 30 respectively, in Figures 2, 3 and 4. In all three figures, we can see that there is a behavioral difference between Oblivious and the other three. Specifically, Oblivious is able to spread the majority of the messages to most of the other nodes while the other three have much smaller extents. The reason is that Oblivious outperforms the other three methods is that it persistently advertises the newest messages to boost their initial presence in the system. This is evidenced by Figure 5, where we plot the number of times that a message is placed in an advertisement packet in the simulation a 10-node network. We can observe that compared to the other methods, Oblivious is able to distribute the opportunities for messages to be advertised most equally, while the others are more or less skewed towards older messages.



Fig. 3. Message delivery extent in 20-node network



Fig. 4. Message delivery extent in 30-node network

Next, we turn our attention to how fast messages can be broadcast in the network using a generalized notion of latency, called *progression*. For a given message m in an n-node network, we use the vector $\langle m_1, m_2, \ldots, m_{n-1} \rangle$ to denote the time it took to reach the *i*th other node $(i = 1, 2, \ldots, n-1)$. For the simulation of each of the message prioritization methods in a 10-node network, we summarize the message progression in a separate plot in the top half of Figure 6. Statistics shown in these plots include median, 25/75-quantile, 95% confidence, and outliers. In the bottom plot of the figure, we have the medians of the four methods together. Figures 7 and 8 present the same information for simulation in 20 and 30-node networks. We observe that the message progression rate of Oblivious is about an order of magnitude faster than the other methods, indicating that it is very effective directing messages.

V. CONCLUDING REMARKS

We are interested in message dissemination in delaytolerant networks consisting of mobile devices roaming in a relatively confined area, such as a university building or conference facility. We had demonstrated some preliminary results previously in [7], where we deployed 12 iPads to



Fig. 5. Number of times a message is advertised in 10-node network



Fig. 6. Message delivery progression in 10-node network

investigate an infrastructureless social networking at the 61st Annual Meeting of the American Society of Human Genetics. In this article, we reported computer simulation results on a variety of message dissemination methods for a comparative study of their relative performance. With emphasis on newly injected messages, the Oblivious method is able to effectively distribute message across the network quickly. Our next step is to port these methods to actual mobile devices and test them at the same, real venue. By comparing the results to those reported here, we will be able to fine-tune some parameters in The ONE [4], so that we can use the simulator to test larger networks with better confidence.



Fig. 7. Message delivery progression in 20-node network



Fig. 8. Message delivery progression in 30-node network

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