



Multi-copy Routing with Trajectory Prediction in Social Delay-Tolerant Networks

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Outline

- ▶ Background
- ▶ Motivation
- ▶ Prediction-based Multi-copy Routing
- ▶ Simulation
- ▶ Conclusion



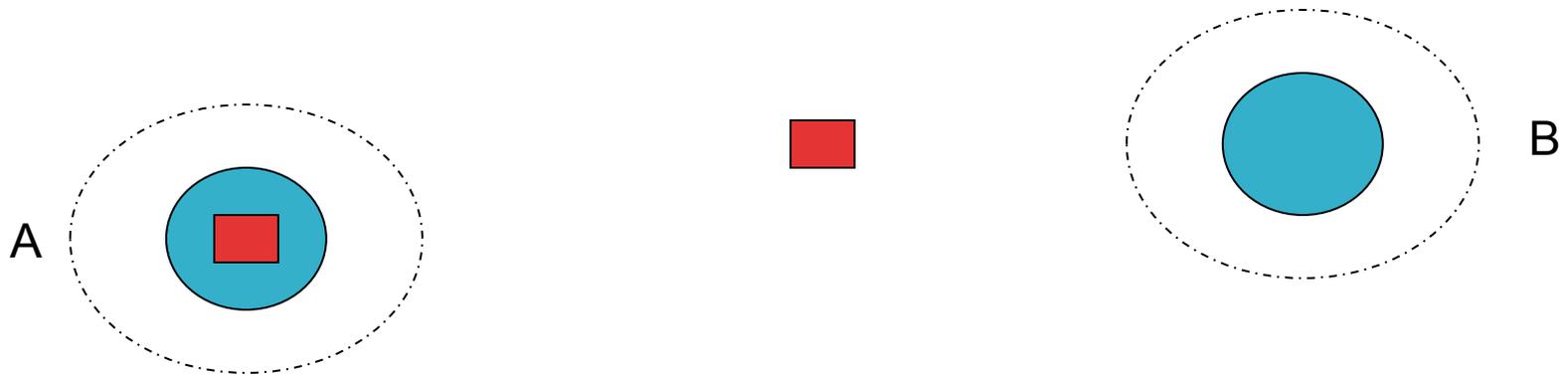
Background

- ▶ Traditional Wireless Networks
 - Base station support
 - End-to-end Round Trip Time is not terribly large
 - Some path exists between endpoints
 - Always finds single "best" existing route
 - Low loss rates (under 2% or so)

- ▶ Disruption-Tolerant Networks (DTNs)
 - Limited base station support
 - Dynamic network topology
 - Unstable link connectivity, disruption
 - High delay and packet loss
 - Example: Underwater Sensor Networks, Animal Tracking Networks, Military Ad-hoc Networks
 - **Routing in DTNs becomes a big challenge!**

Background

- ▶ To improve routing performance in DTNs
 - Only “proper” nodes can get a copy: 1) *Destination* node, 2) *Messengers* - nodes who will encounter the destination in the near future.
 - Store-Carry-and-Forward delivery



- How to define those messengers??

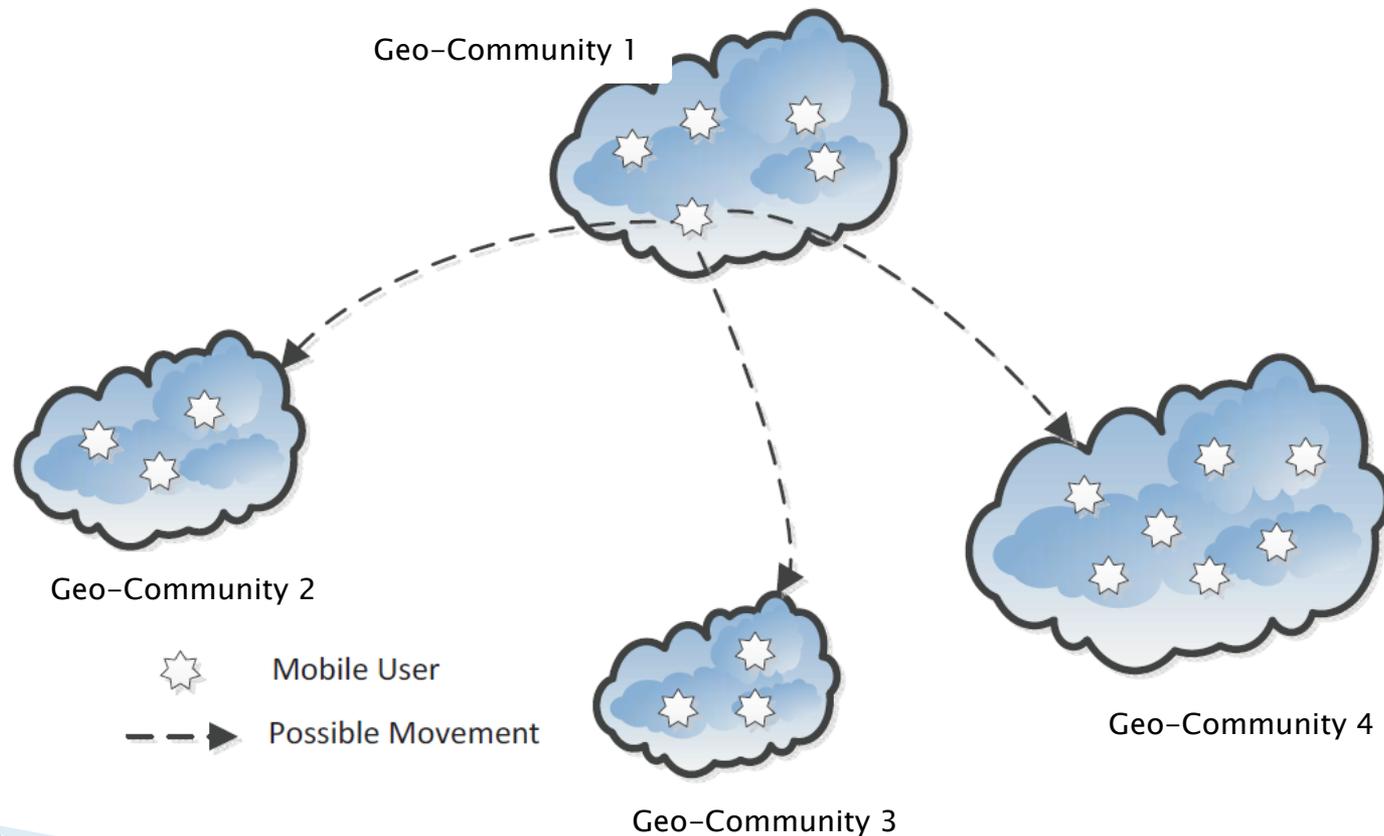
Background

▶ Prediction-based Routing

- Inter-node contacts and mobility behaviors are predicted first.
- Messengers (next hops) are determined based on such predictions to maximize QoS (e.g. delay or delivery ratio).
- Two types:
 - single-copy routing: minimum traffic overhead but relatively large delay.
 - multi-copy routing: more copies to improve delay and delivery ratio.

Background

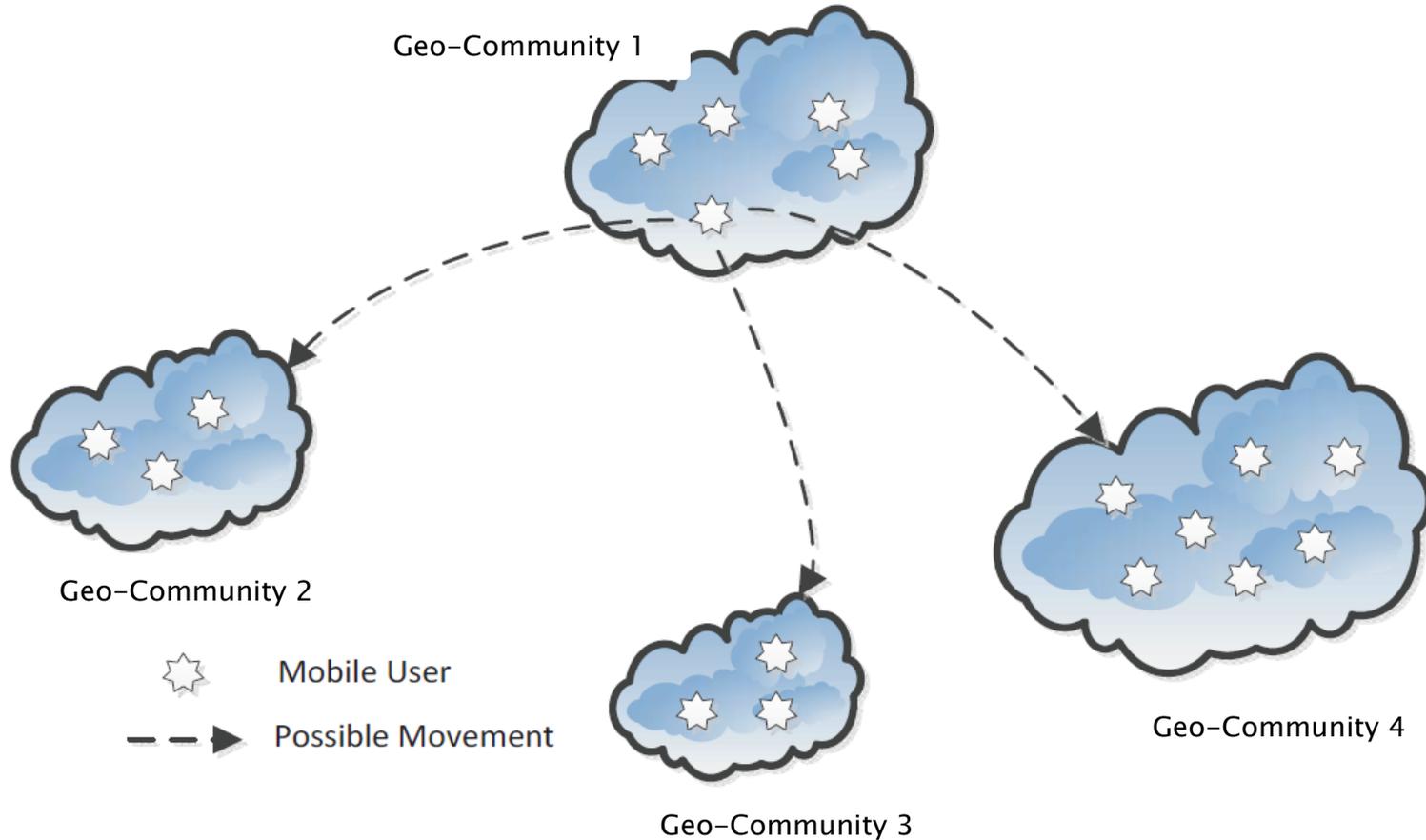
- ▶ Meanwhile, most DTNs have a social network nature



Motivation

- ▶ Goal: employing the social network nature to improve routing performance in social DNTs.
 - Social network nature is helpful to further improve mobility prediction accuracy by evaluating future contacts and their occurring time.
 - Then, pick a group to proper messengers to deliver packets to the destination.
 - Employ the multi-copy strategy to further reduce the delivery delay and enlarge delivery ratio.
- ▶ McRTP: a Multi-copy Routing protocol with Trajectory Prediction for social DTNs.

System Model & Assumptions



Protocol Overview

▶ Basic idea

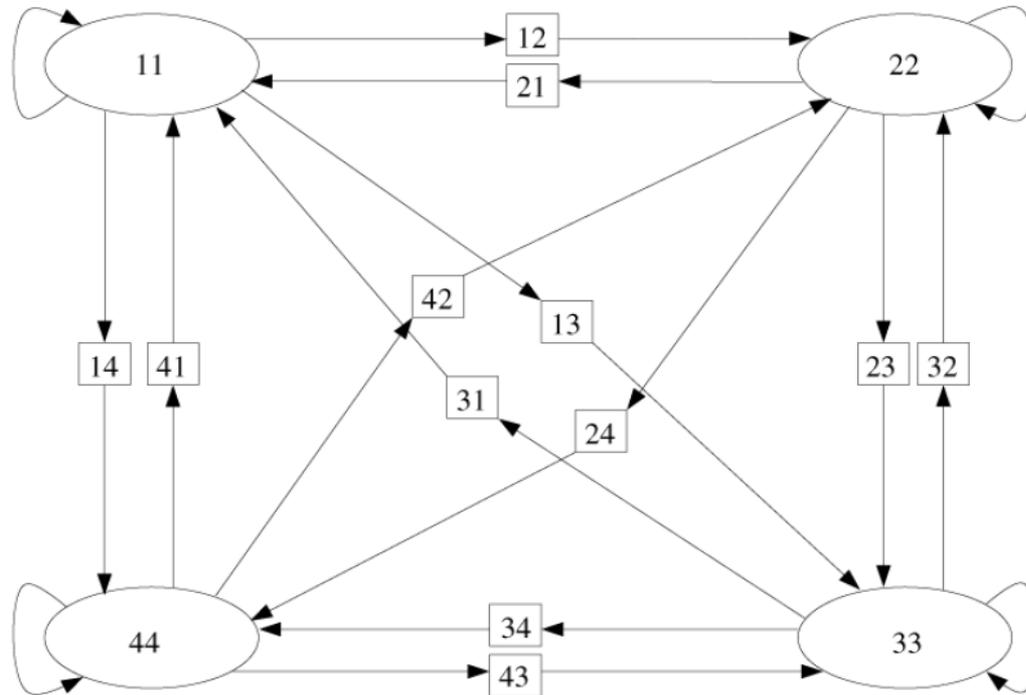
- A node can forward one or more copies of the same message to different nodes, during successive contacts.
- The number of copies for a message is initialized at the source.
- A node only distribute message copies to the nodes who are most likely to see the destination.

▶ Three core components

- Candidate paths selection
- Copy count assignment
- Message forwarding policy

Contact Prediction (1)

- ▶ Time-Homogeneous Semi-Markov process



- Define $S_{ij}(k)$, as the probability that a node will move from state i to j within k time units

- Define $p_{ij} = P(X_{n+1} = j | X_n = i)$ as the state transition probability from Markov state i to j ($1 \leq i, j \leq l$)

Contact Prediction (2)

▶ Time-Homogeneous Semi-Markov process

- The homogeneous Semi-Markov kernel Q of this process is

$$\begin{aligned} Q_{ij}(k) &= P(X_{n+1} = j, T_{n+1} - T_n \leq k | X_0, \dots, X_n; \\ &\quad T_0, \dots, T_n) \\ &= p_{ij} S_{ij}(k). \end{aligned}$$

- Further, we have the node trajectory prediction

$$\begin{aligned} \phi_{ij}(k) &= P(Z_k = j | Z_0 = i) \\ &= (1 - S_i(k)) \delta_{ij} + \sum_{r=1}^{l^2} \sum_{\tau=0}^k \dot{Q}_{ir}(\tau) \phi_{rj}(k - \tau) \end{aligned}$$

- Contact profile $C_{ab}(k)$ that gives the contact probability of two nodes a, b at time $k \geq \max\{t_a, t_b\}$

$$C_{ab}(k) = \sum_{x=1}^l \phi_{i_a(L_x L_x)}^a(k - t_a) \phi_{i_b(L_x L_x)}^b(k - t_b)$$

Path Selection (1)

▶ Path evaluations

- Define the delay distribution $d()$ as the probability of a message that at time T is at node a , to be delivered at node b at time $T+t$,

$$d(T, t, ab) = \begin{cases} 1 & (a \text{ and } b \text{ are in contact at time } T) \\ C_{ab}(T+t) \prod_{k=0}^{t-1} (1 - C_{ab}(T+k)) & (a \text{ and } b \text{ not in contact at time } T \text{ and } t > 0) \\ 0 & (\text{if } a \text{ and } b \text{ not in contact at time } T \text{ and } t = 0) \end{cases}$$

- The delay distribution $d(T, t, R_1R_2)$ is then extended for a path made of the concatenation of two adjacent sub-paths R_1 and R_2

$$d(T, t, R_1R_2) = \sum_{k=0}^t d(T, k, R_1) d(T+k, t-k, R_2)$$

Path Selection (2)

▶ Path evaluations

- Further, the probability that a message transmitted at time T on a path R arrives with maximum delay t

$$D(T, t, R) = \sum_{k=0}^t d(T, k, R)$$

D is called the *maximum delay distribution* for messages on path R before time t , and it is used by McRTP as a prediction metric to select the most promising paths.

- Based on TTL, algorithm computes the *maximum delay distribution* D at the source for all possible paths of lengths $2, \dots, \lambda$ (λ is limited to 3 to diminish overhead)
- Then sort the paths according to their D value in a decreasing order, and form the candidate paths set Q .

Path Selection (3)

► Generating candidate paths set Q algorithm

Algorithm 1 Candidate Paths Selection

Require: V , set of nodes; s , source node; T , current time;
 m_{path} , set of nodes already visited by message m .

Ensure: set Q with candidate paths on which to forward the message

1: set $\mathcal{R} = \emptyset$ {set with paths from s to destination d }

2: {for adding paths of length 2}

3: **for all** $i \in V \setminus m_{path} \setminus \{s, d\}$ **do**

4: **if** $D(T, ttl(m), si) > 0$ **then**

5: $R = [s, i, d]$

6: $D_R = D(T, ttl(m), R)$

7: **if** $D_R > 0$ **then**

8: $\mathcal{R} = \mathcal{R} \cup \{R\}$

 {for adding paths of length 3}

9: **if** $m_c > 2$ **then**

10: **for all** $i \in V \setminus m_{path} \setminus \{s, d\}$ **do**

11: **if** $D(T, ttl(m), si) > 0$ **then**

12: **for all** $j \in V \setminus m_{path} \setminus \{s, d, i\}$ **do**

13: $R = [s, i, j, d]$ {path from s to d of length 3}

14: $D_R = D(T, ttl(m), R)$

15: **if** $D_R > 0$ **then**

16: $\mathcal{R} = \mathcal{R} \cup \{R\}$

17: sort paths R from \mathcal{R} based on decreasing value D_R

18: create β vector with n elements

19: set $Q = \emptyset$ {set with selected paths from s to d }

20: $k = 1$ {index in sorted set \mathcal{R} }

21: **while** $k \leq |\mathcal{R}|$ **do**

22: $R_k =$ the k^{th} path from \mathcal{R} sorted in decreasing order of D_R

23: **if** $\text{CountCopies}(m_c, Q \cup \{R_k\}, \beta) \leq m_c - 1$ **then**

24: $Q = Q \cup \{R_k\}$

25: $k = k + 1$

Copy Account Assignment

- ▶ function *CountCopies* (c, Q, β)
 - computes the total number of message copies needed to send a message from a node s to destination d on all paths in the candidate paths set Q from the previous phase.
 - Parameter β is a vector of n elements, whose element is the total number of message copies needed for all paths in Q that begin with a index node.
 - Parameter c is the current count. If the computed count reaches c , the function returns c .
 - Example: For example, if $Q = \{sad, sbd, sacd\}$, then *CountCopies*(10, Q, β) computes $\beta_{sabcd} = [4, 2, 1, 1, 0]$ and the function returns 4, which is the value of β_s .

Message Forwarding

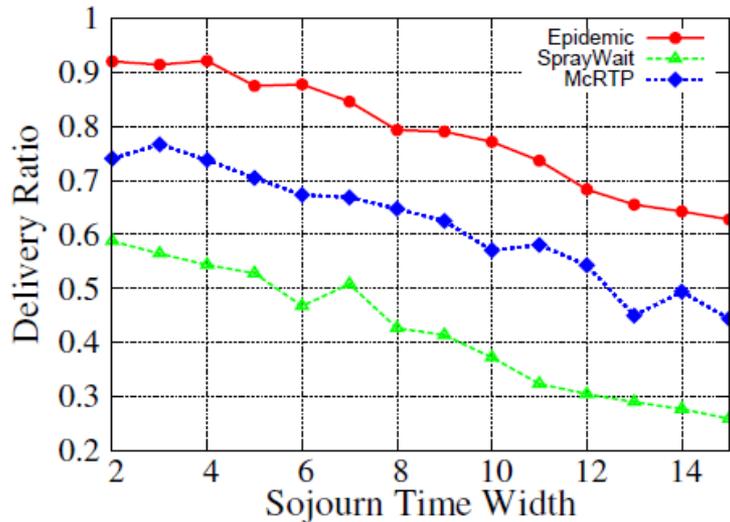
- ▶ Each message maintains a message copy property, which is called *copy account*.
- ▶ Once the β values are computed at source, source node s sends β_j copies to node j when they are in contact, as evaluated in the copy account assignment phase, if $\beta_j > 0$.
- ▶ If $\beta_j = 0$, then node s does not forward the message to node j .

Simulation

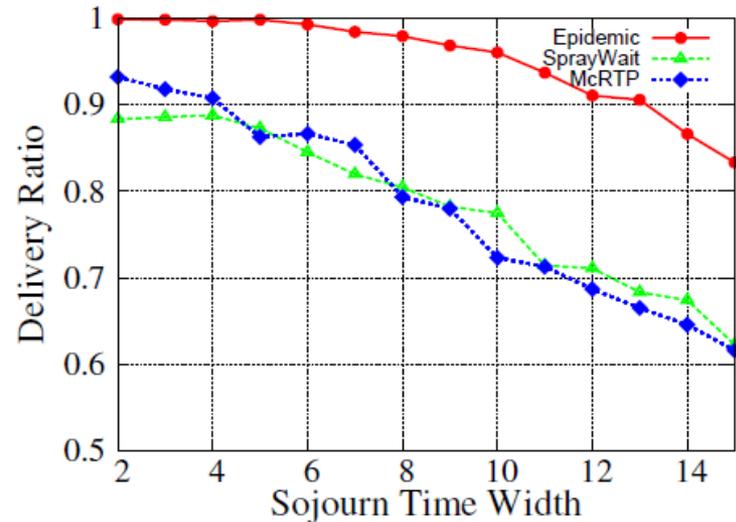
- ▶ Algorithm in comparison
 - Epidemic routing
 - Spray-and-wait
 - On a custom packet-based simulator
- ▶ Settings
 - 10 geo-communities with n nodes uniformly distributed
 - Travelling time between two geo-communities is uniformly distributed in $[2, 3]$.
 - The sojourn time is uniformly selected in $[w, w+2]$, where w from 2 to 15 time units.
 - Mobility preference P is 10%
 - TTL is 35 time units
- ▶ Metrics
 - Delivery ratio
 - Delivery latency

Simulation

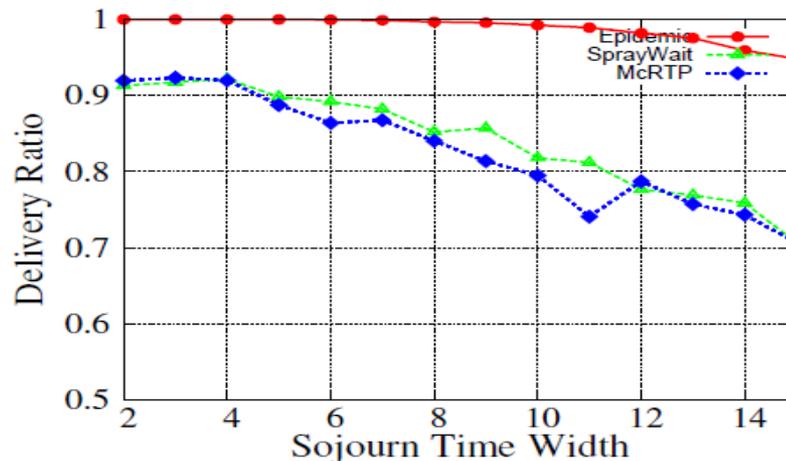
▶ Results - Delivery ratio comparison



(a) Network with 10 nodes



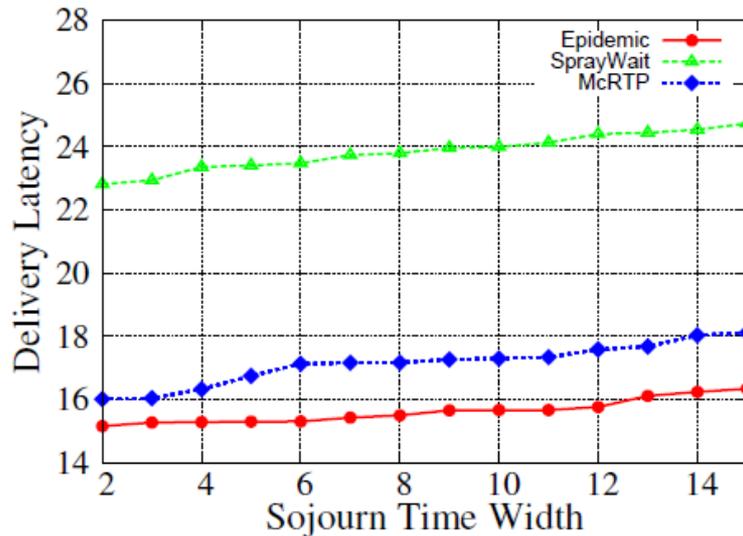
(b) Network with 20 nodes



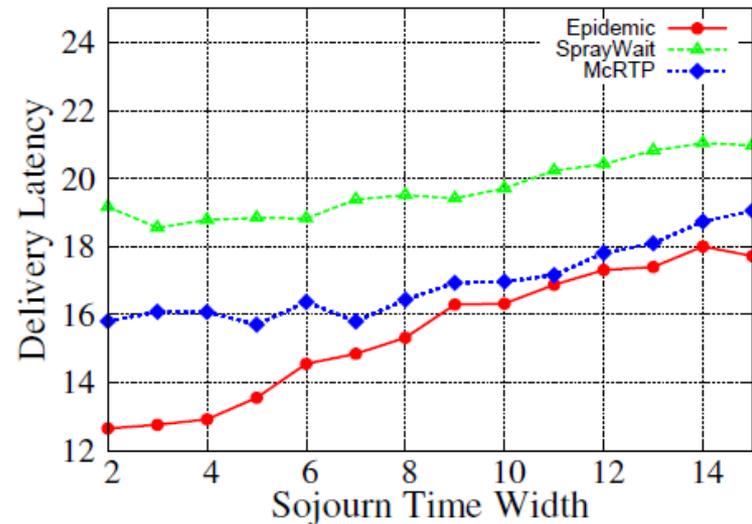
(c) Network with 30 nodes

Simulation

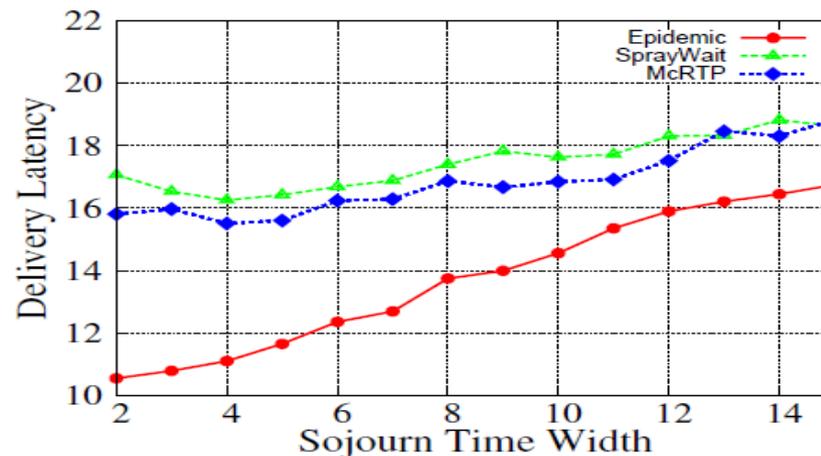
► Results - Delivery ratio comparison



(a) Network with 10 nodes

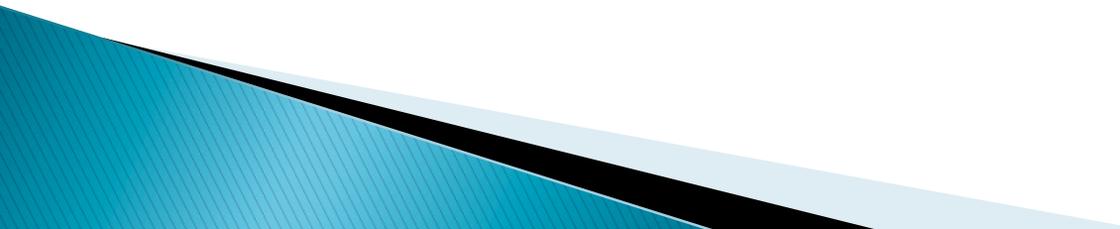


(b) Network with 20 nodes



(c) Network with 30 nodes

Conclusion

- ▶ McRTP predicts where and when the contact occurs using the social network nature.
 - ▶ McRTP offers solutions for multi-copy prediction-based routing in social DTNs.
 - ▶ McRTP outperforms traditional SprayWait, especially in sparse networks.
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Thanks

