

Mirage: Private Mobility-based Routing for Censorship Evasion

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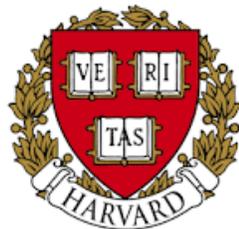
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Micah Sherr²

Avery Bai²
James Mickens³

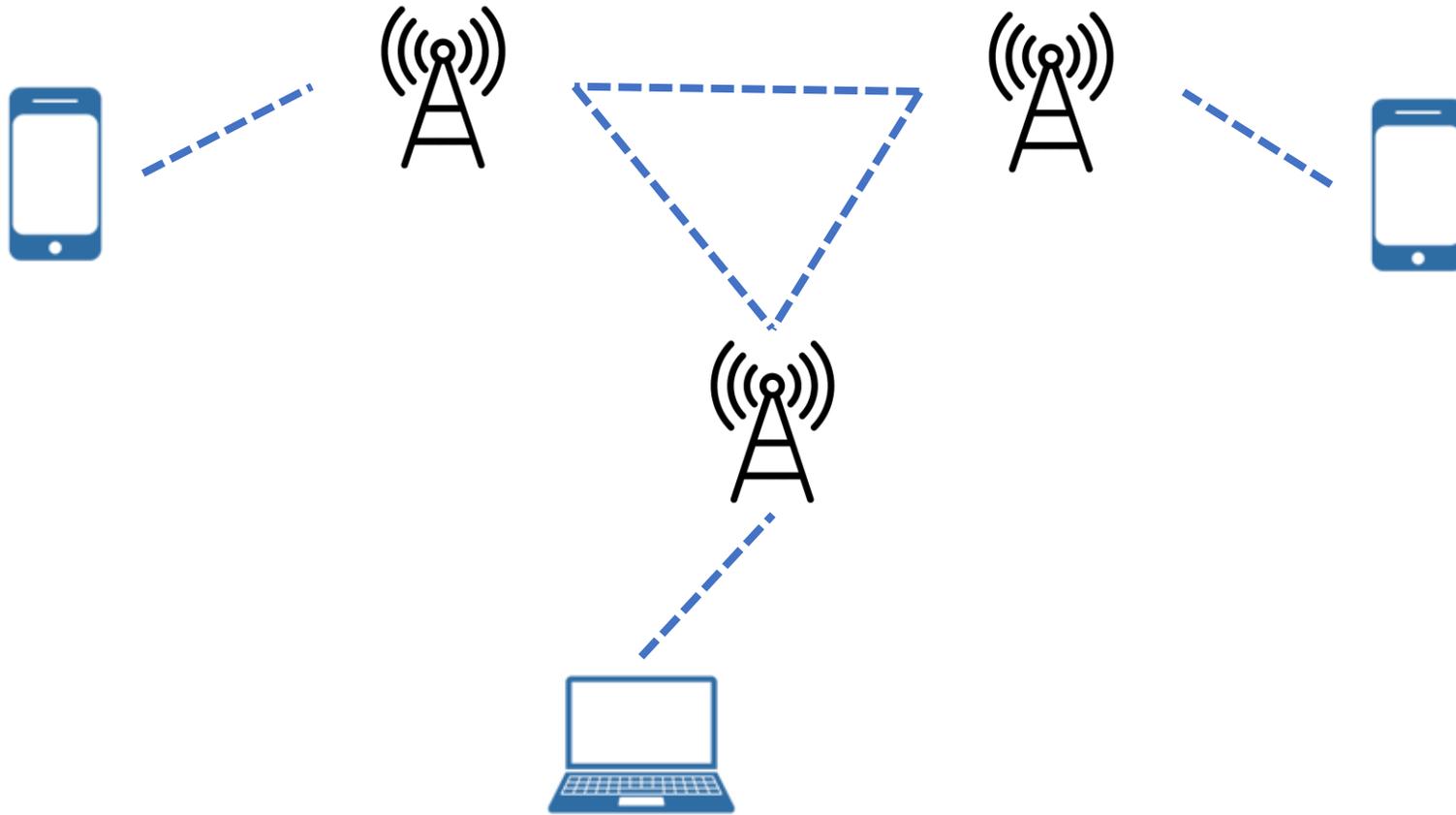
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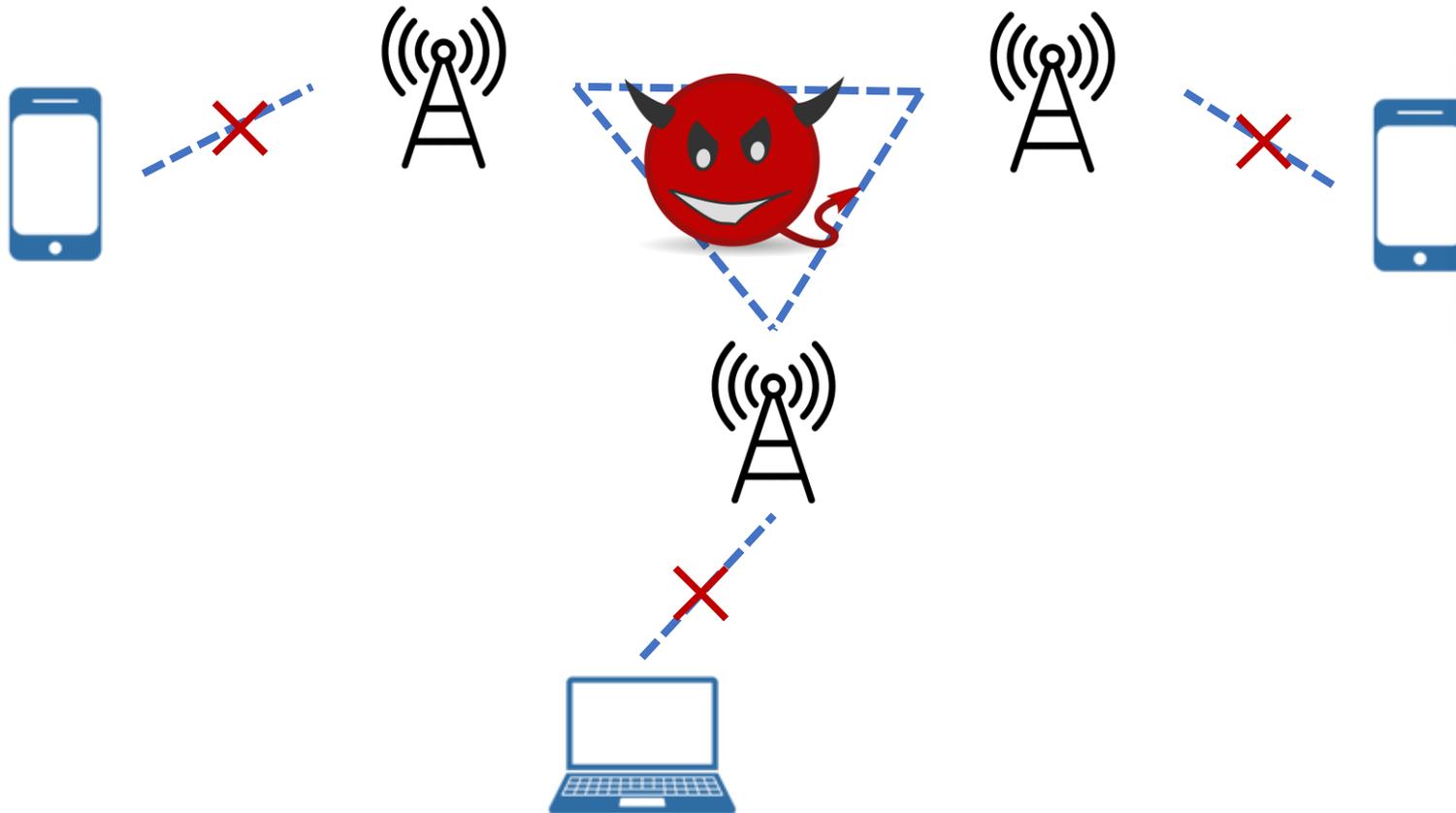
³*Ariel University*



Motivation: When Internet Fails



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Mobile Ad Hoc Networks

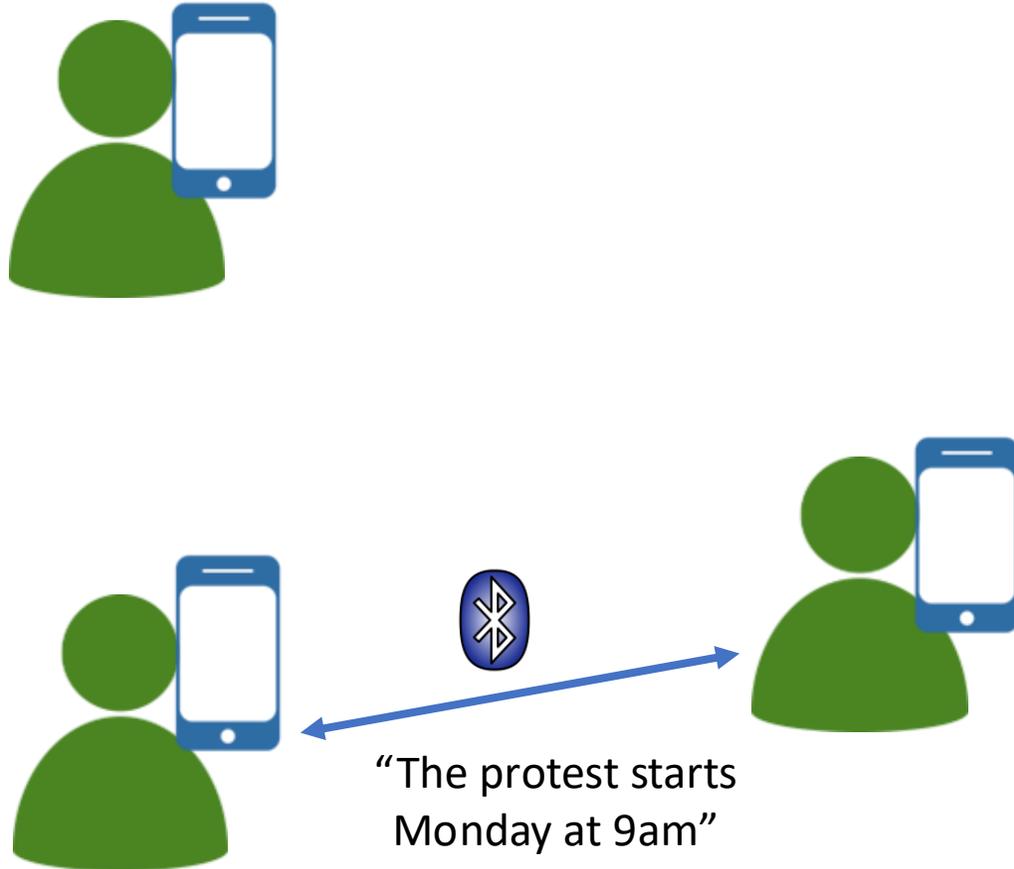


Mobile Ad Hoc Networks



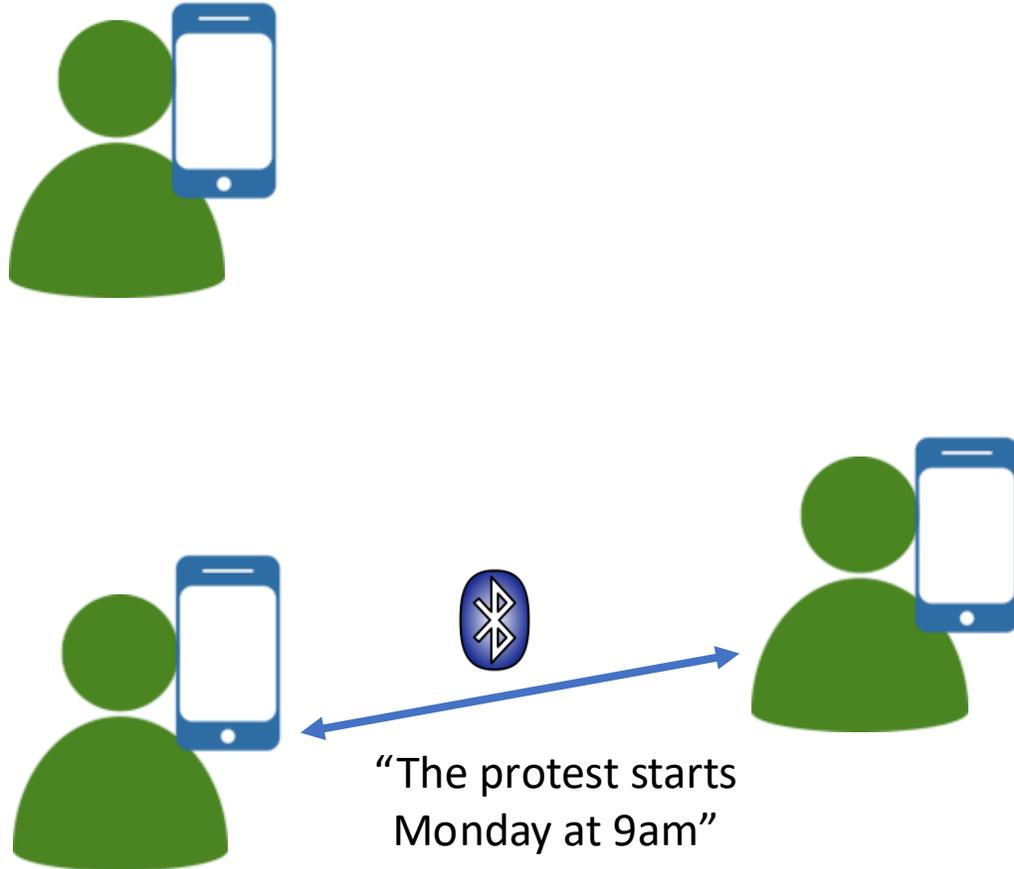
- Messages transfer upon physical encounter (e.g., over Bluetooth LE or WiFi direct)

Mobile Ad Hoc Networks



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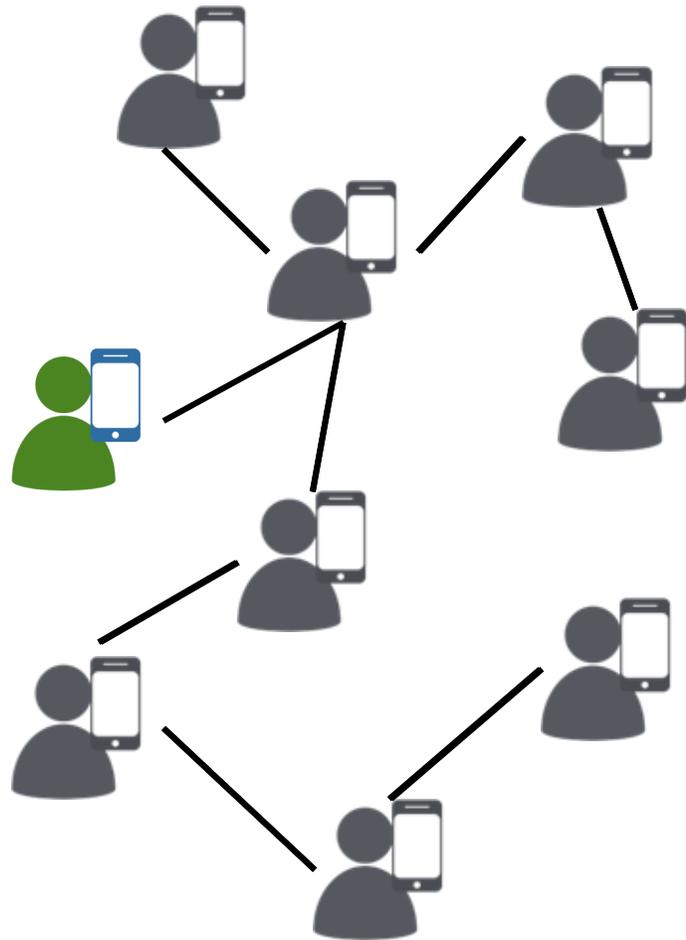
Mobile Ad Hoc Networks



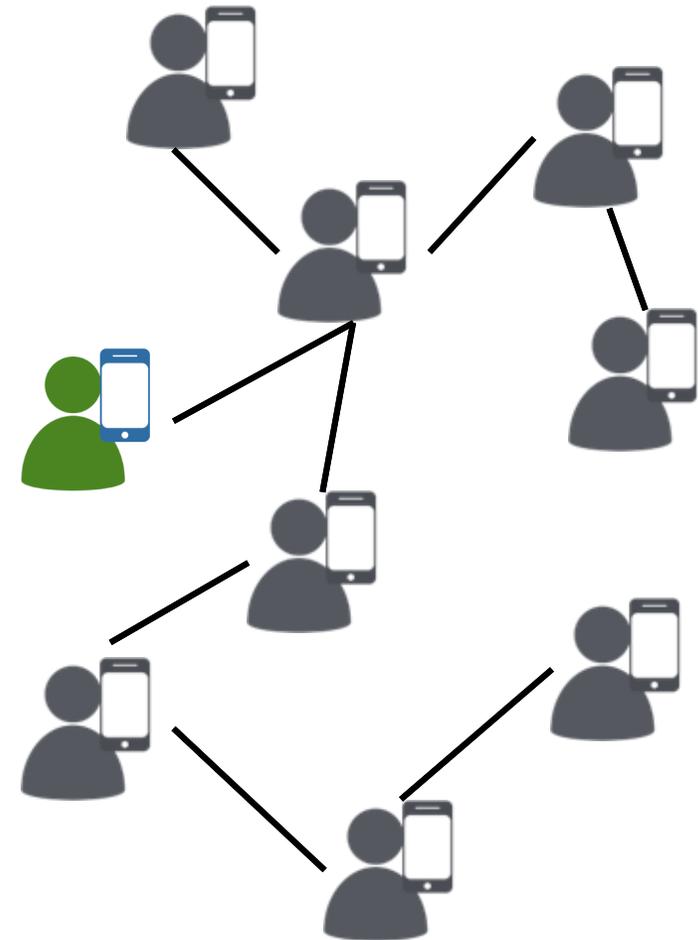
- Messages transfer upon physical encounter (e.g., over Bluetooth LE or WiFi direct)
- No centralized routers or ISP
- **Messages move where people move**

Flooding and Random Walks

Flooding

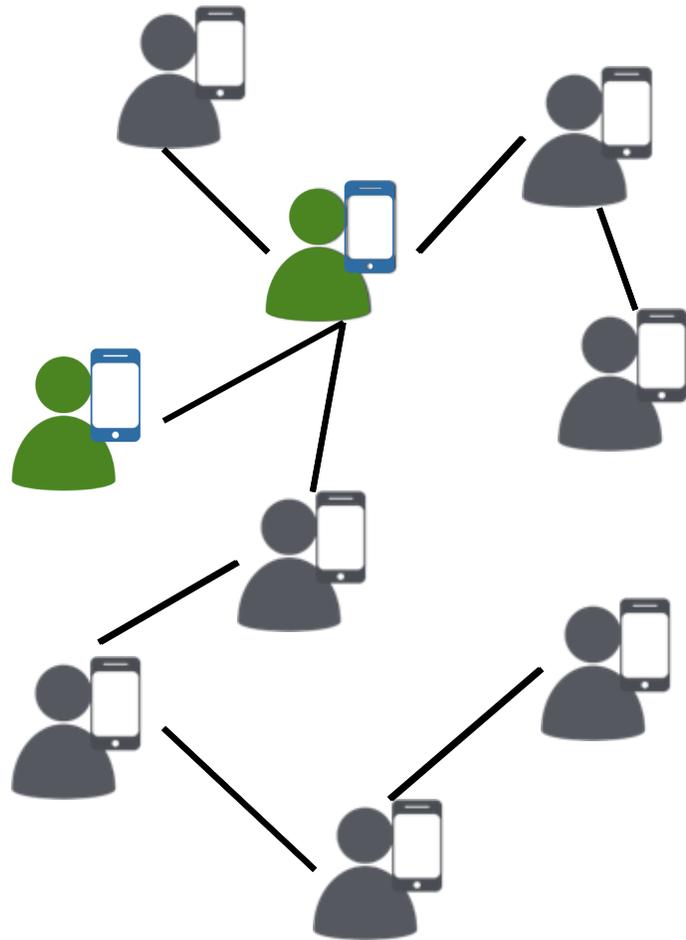


Random Walk

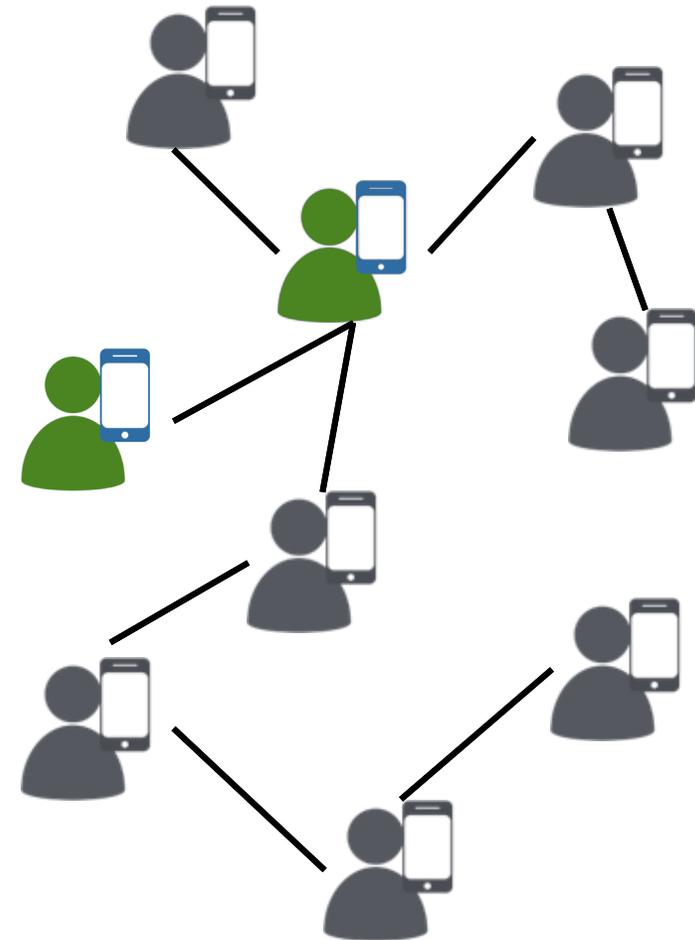


Flooding and Random Walks

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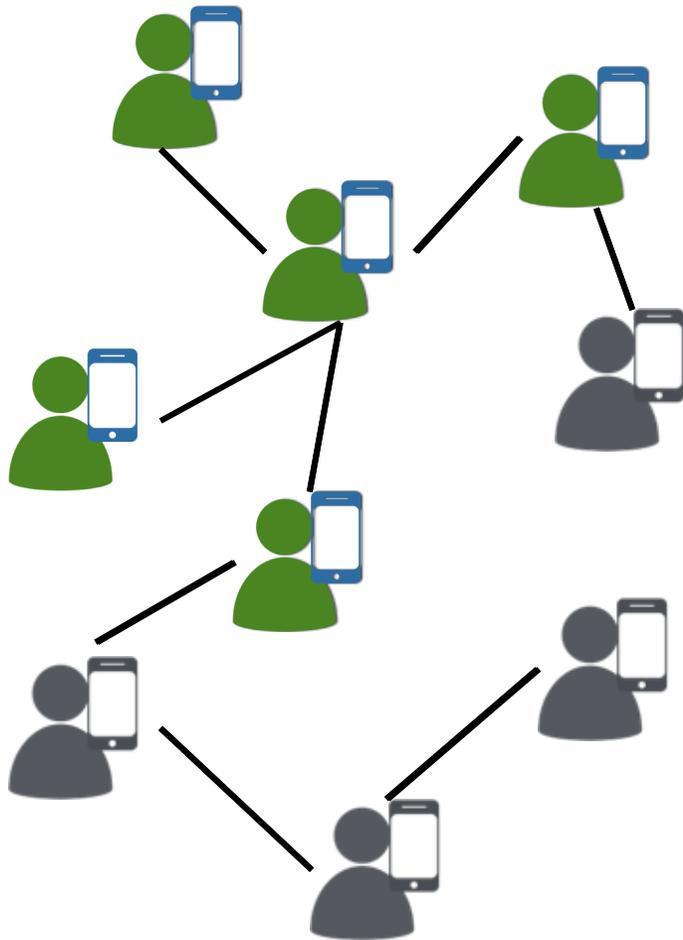


Random Walk

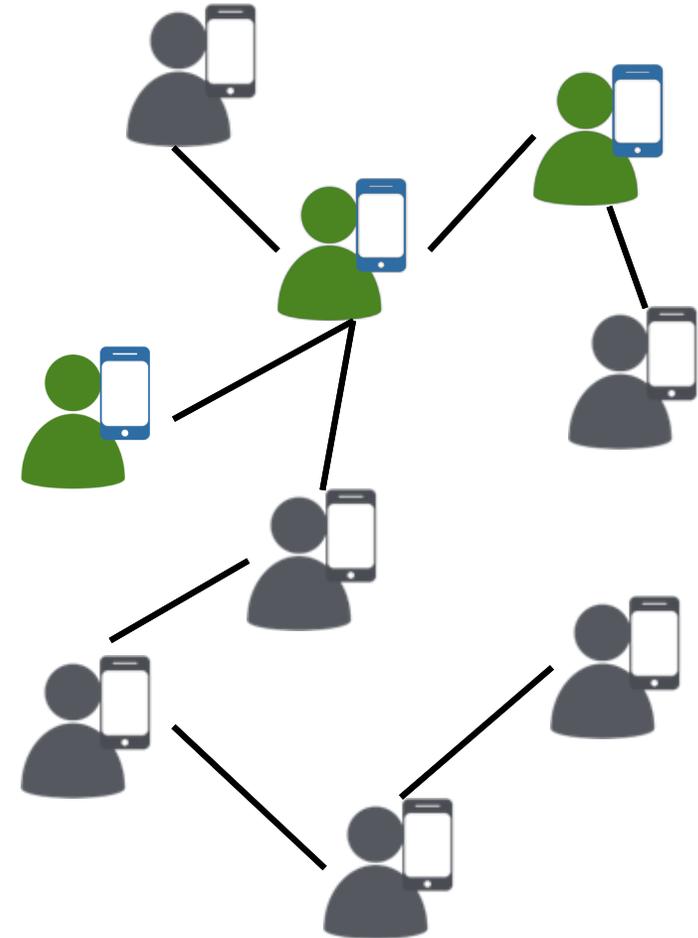


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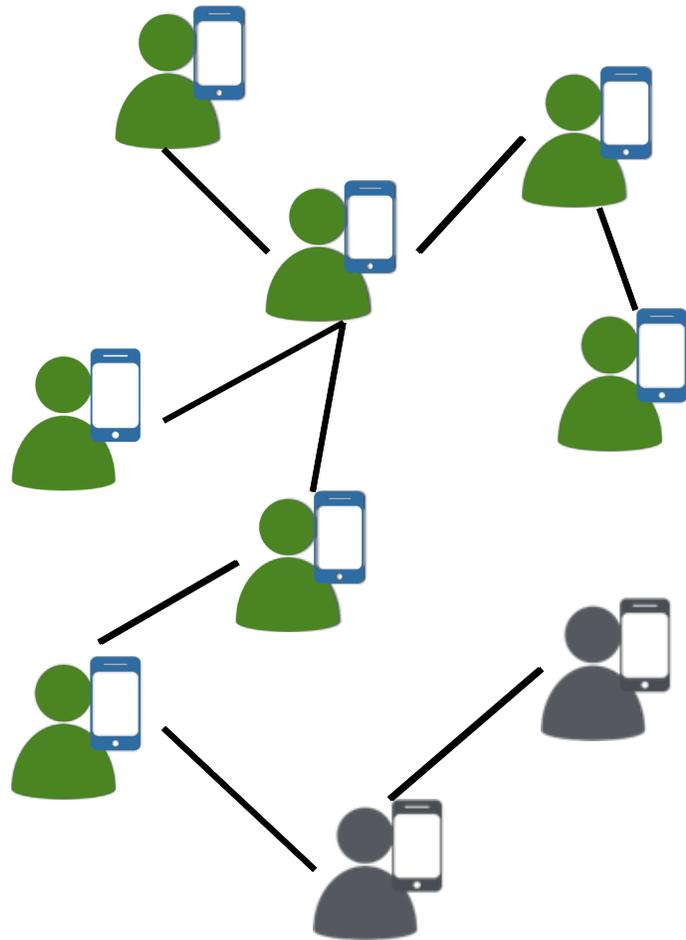


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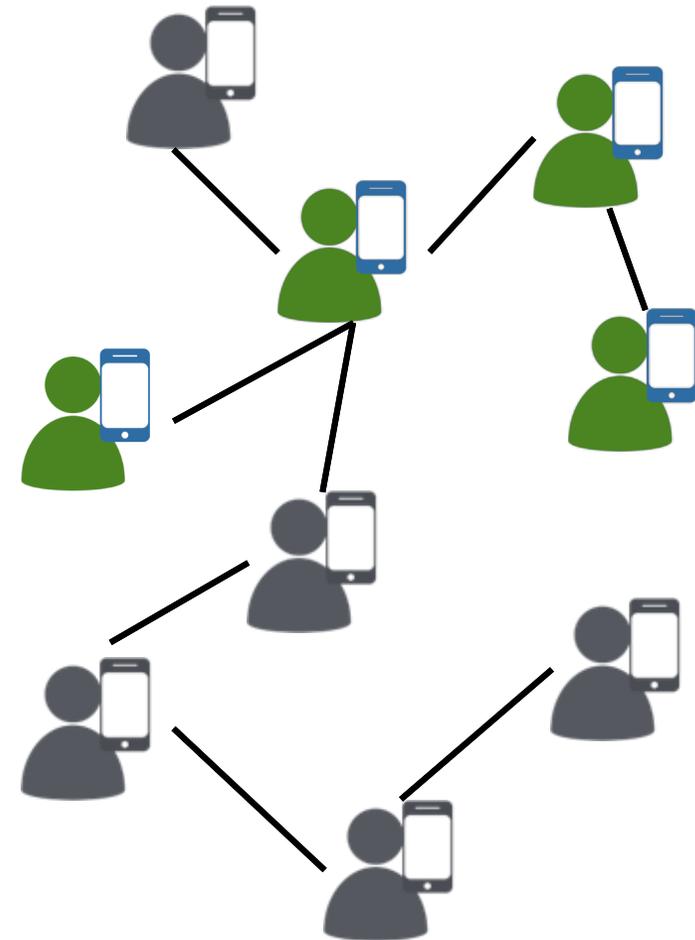


Flooding and Random Walks

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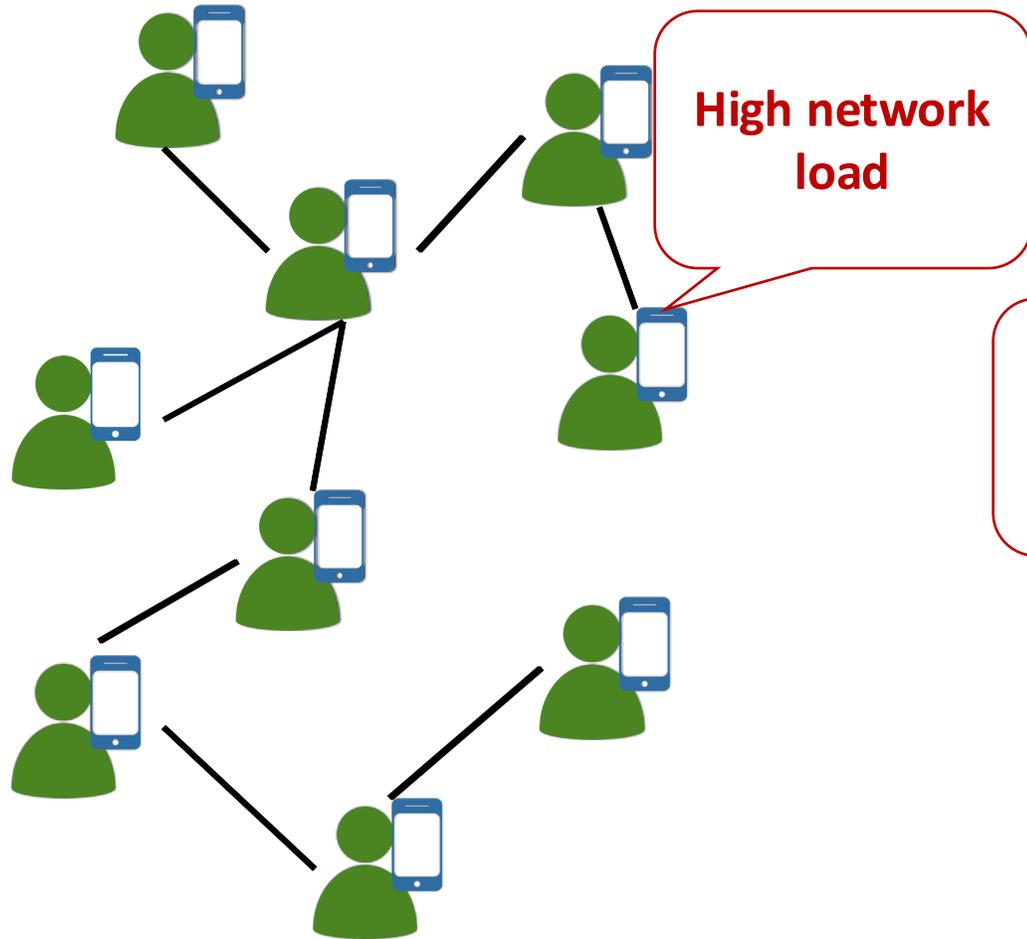


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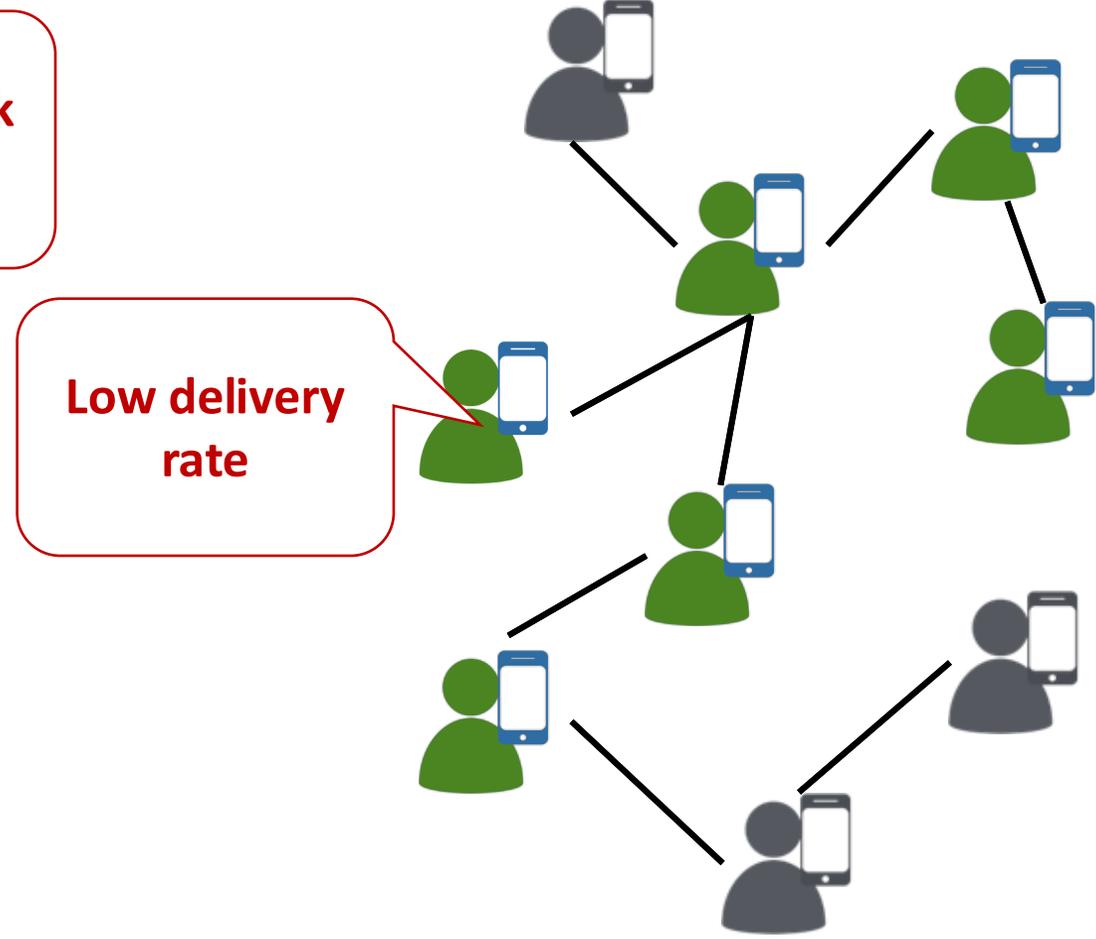


Flooding and Random Walks

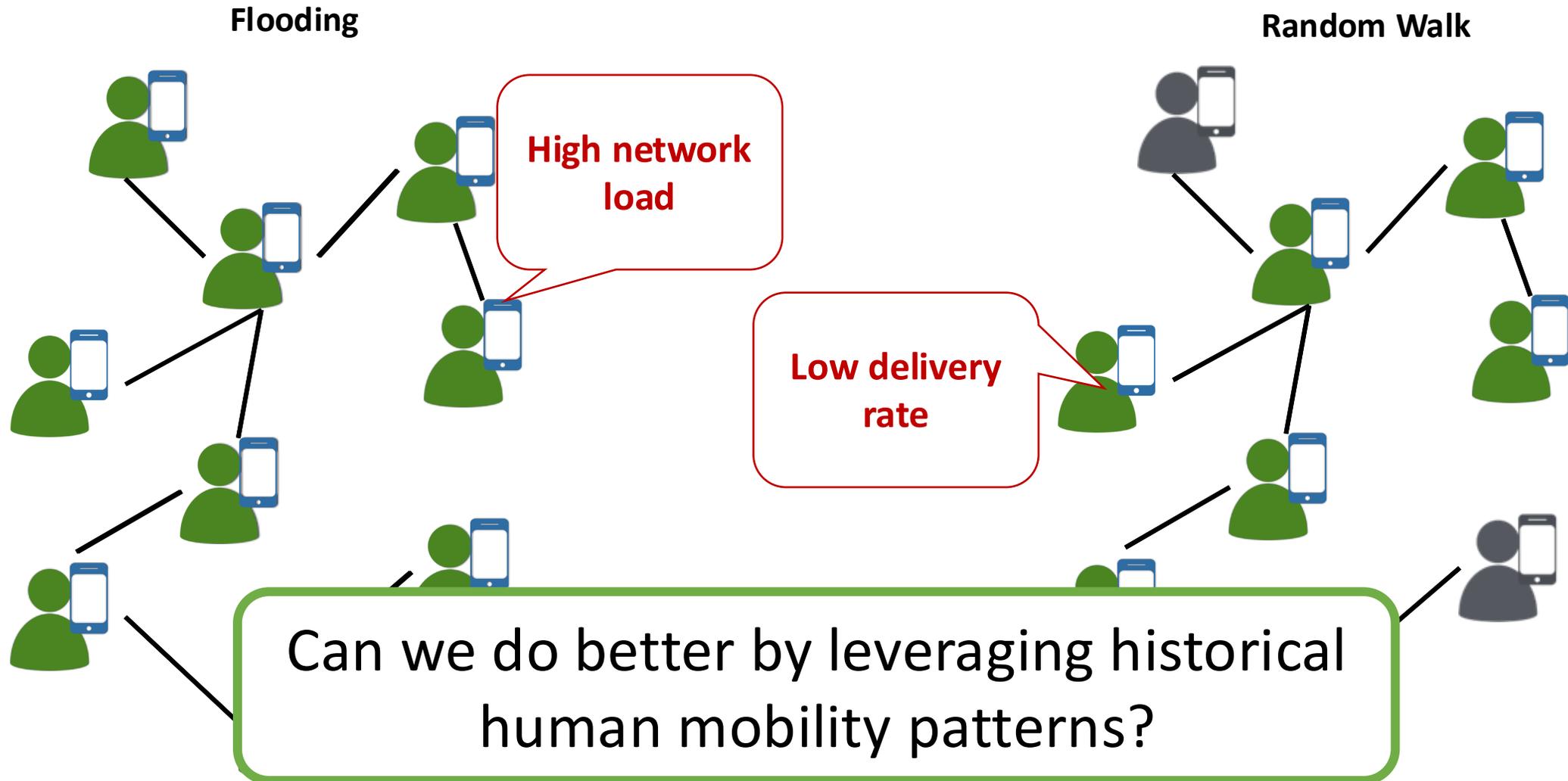
Flooding



Random Walk



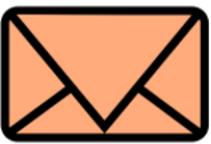
Flooding and Random Walks



HumaNets

(Aviv, Sherr, Blaze, and Smith, 2010)

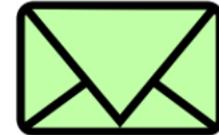
- Mobility-aware routing that leverages predictable movement patterns
- Messages are addressed to **districts**



Harvard Square



Seaport District



Downtown Boston

HumaNets

(Aviv, Sherr, Blaze, and Smith, 2010)

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Routing leaks mobility information ☹️

This Work: Private HumaNets

- We show that **existing privacy-preserving HumaNet protocols are vulnerable to statistical disclosure attacks**
 - Even when participants do not directly share mobility information, **routing decisions implicitly leak sensitive movement patterns**

This Work: Private HumaNets

- We show that **existing privacy-preserving HumaNet protocols are vulnerable to statistical disclosure attacks**
 - Even when participants do not directly share mobility information, **routing decisions implicitly leak sensitive movement patterns**
- We develop **Mirage: a private mobility-based routing protocol**
 - Provides **formal privacy guarantees**
 - Achieves **comparable efficiency to prior (non-private) HumaNet protocols**
 - **Evaluated on real-world city-scale mobility data**

Probabilistic Profile-based Routing (PPBR)

(Aviv, Blaze, Sherr, and Smith, 2014)

Districts

1	2	3	4
5	6	7	8
9	10	11	12
13	14	15	16

Periodically
polls location



Probabilistic Profile-based Routing (PPBR)

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Districts

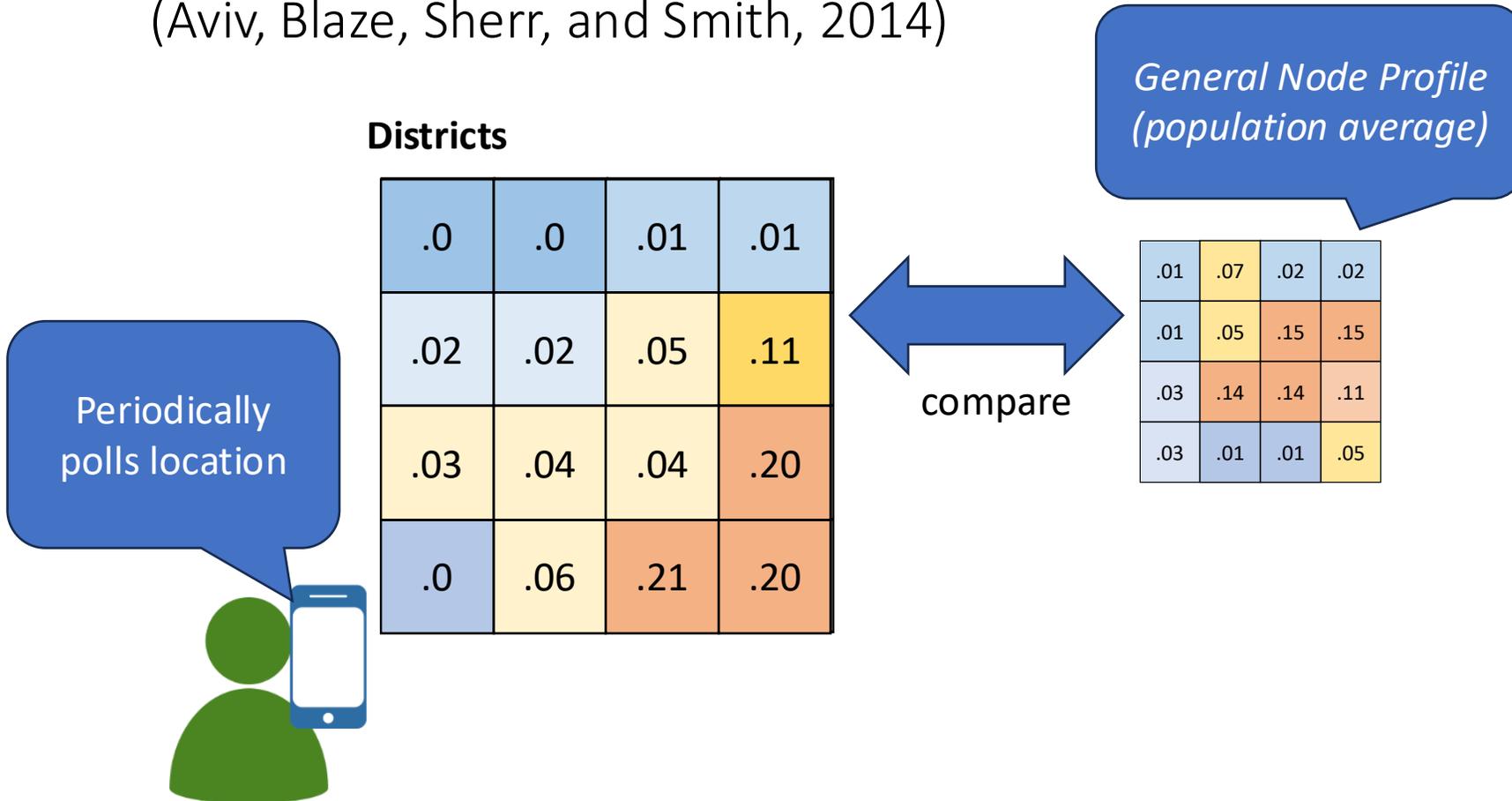
.0	.0	.01	.01
.02	.02	.05	.11
.03	.04	.04	.20
.0	.06	.21	.20

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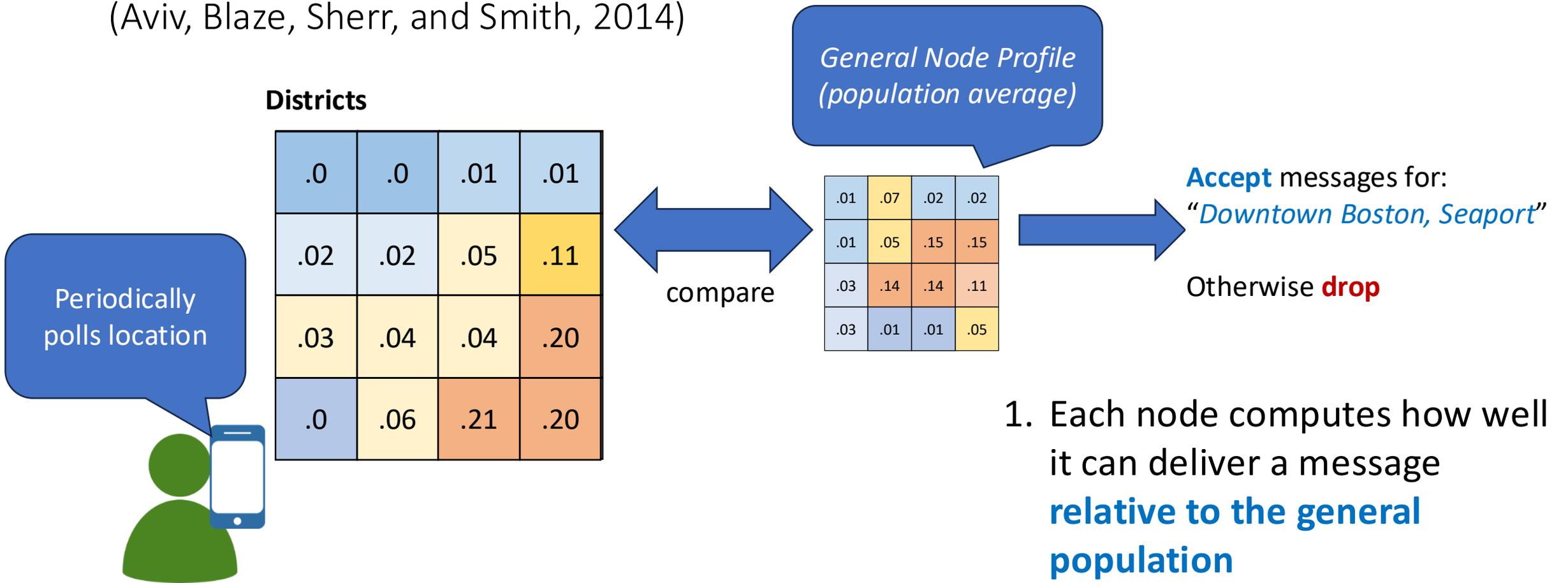
Probabilistic Profile-based Routing (PPBR)

(Aviv, Blaze, Sherr, and Smith, 2014)



Probabilistic Profile-based Routing (PPBR)

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1. Each node computes how well it can deliver a message **relative to the general population**
2. **Silently accept** messages only its **top-K destinations**

Statistical Disclosure Attacks Against PPBR

Districts

1	2	3	4
5	6	7	8
9	10	11	12
13	14	15	16



District 16



Statistical Disclosure Attacks Against PPBR

Districts

1	2	3	4
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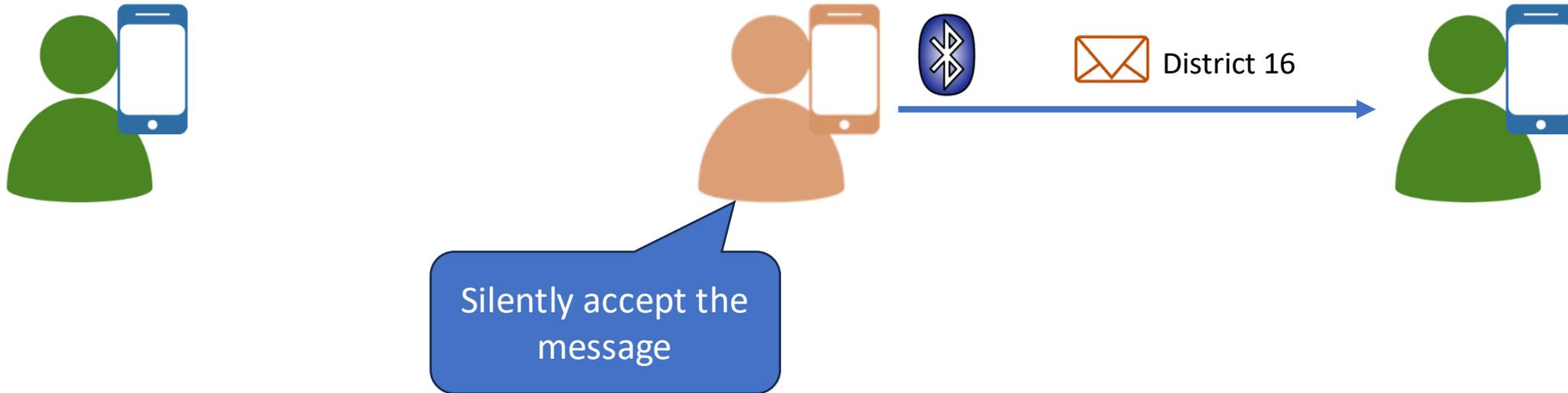


Silently accept the message

Statistical Disclosure Attacks Against PPBR

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Statistical Disclosure Attacks Against PPBR

Districts

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Need **plausible deniability**
that you frequently visit
that district!



District 16



Silently accept the
message



Implicitly reveals that the sender:

1. **Is the message originator** or
2. **Previously accepted the message from someone else**

Mirage Design

Key Idea: the average person frequently travels between a small number of locations (e.g., work, school, and home)

Privatized Mobility Graphs

Districts

1	2	3	4
5	6	7	8
9	10	11	12
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Privatized Mobility Graphs

Districts

.0	.0	.01	.01
.02	.02	.05	.11
.03	.04	.04	.20
.0	.06	.21	.20



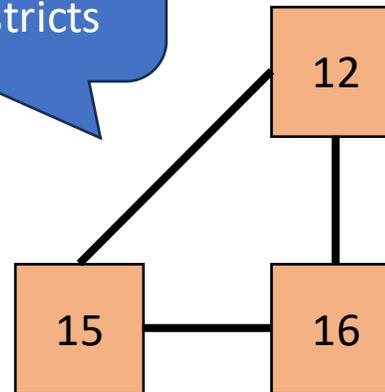
Privatized Mobility Graphs

Districts

.0	.0	.01	.01
.02	.02	.05	.11
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Edges encode frequent transitions between districts

Create a clique between top k most visited districts



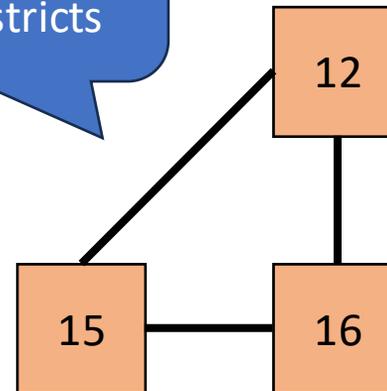
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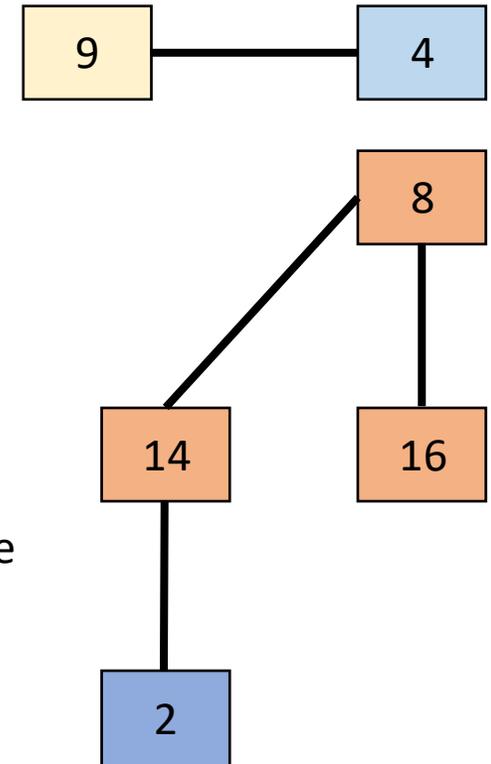
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Edges encode frequent transitions between districts

Create a clique between top k most visited districts



Remove each edge with probability $1 - p$. Add edges to other districts with prob. $1 - p$

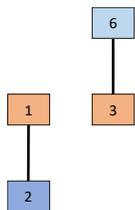
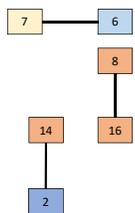
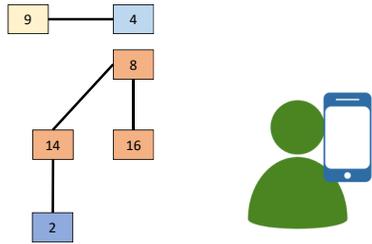


Each graph satisfies ϵ -LDP for $\epsilon = 2k \cdot \log\left(\frac{p}{1-p}\right)$



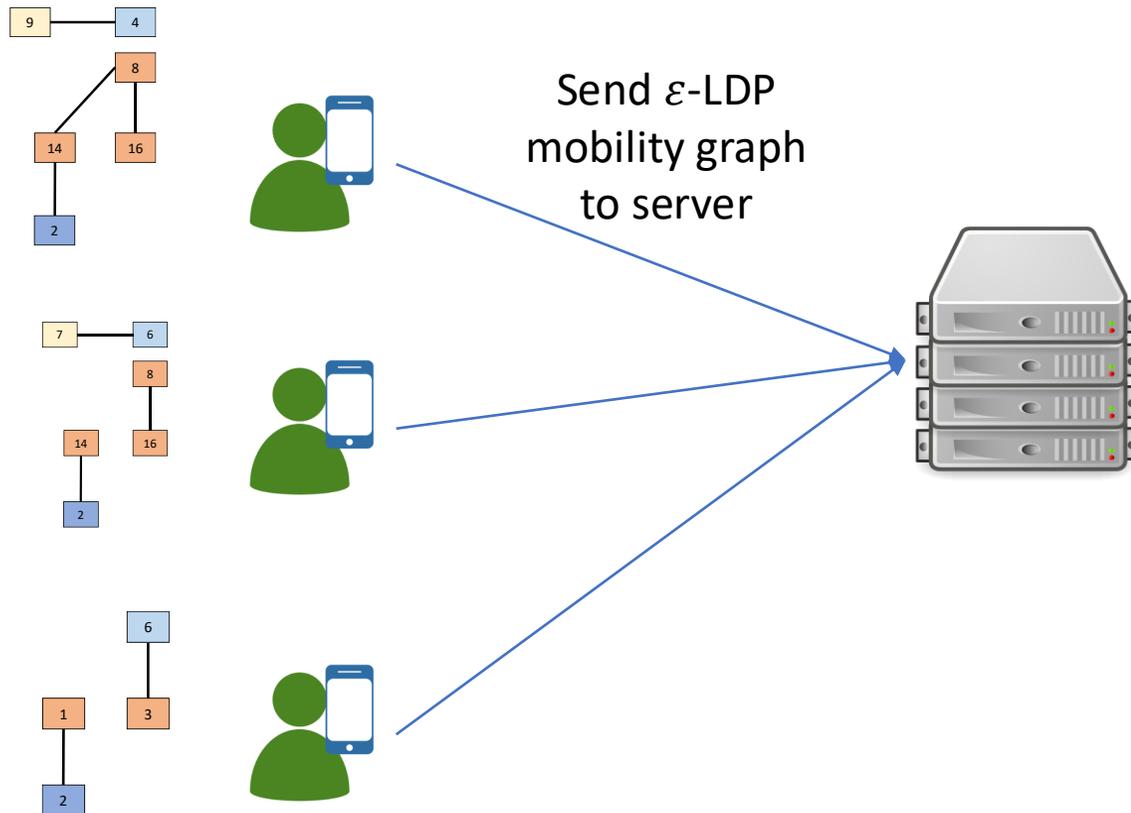
Global Mobility Profile

- Created during a setup phase (e.g., during app install)



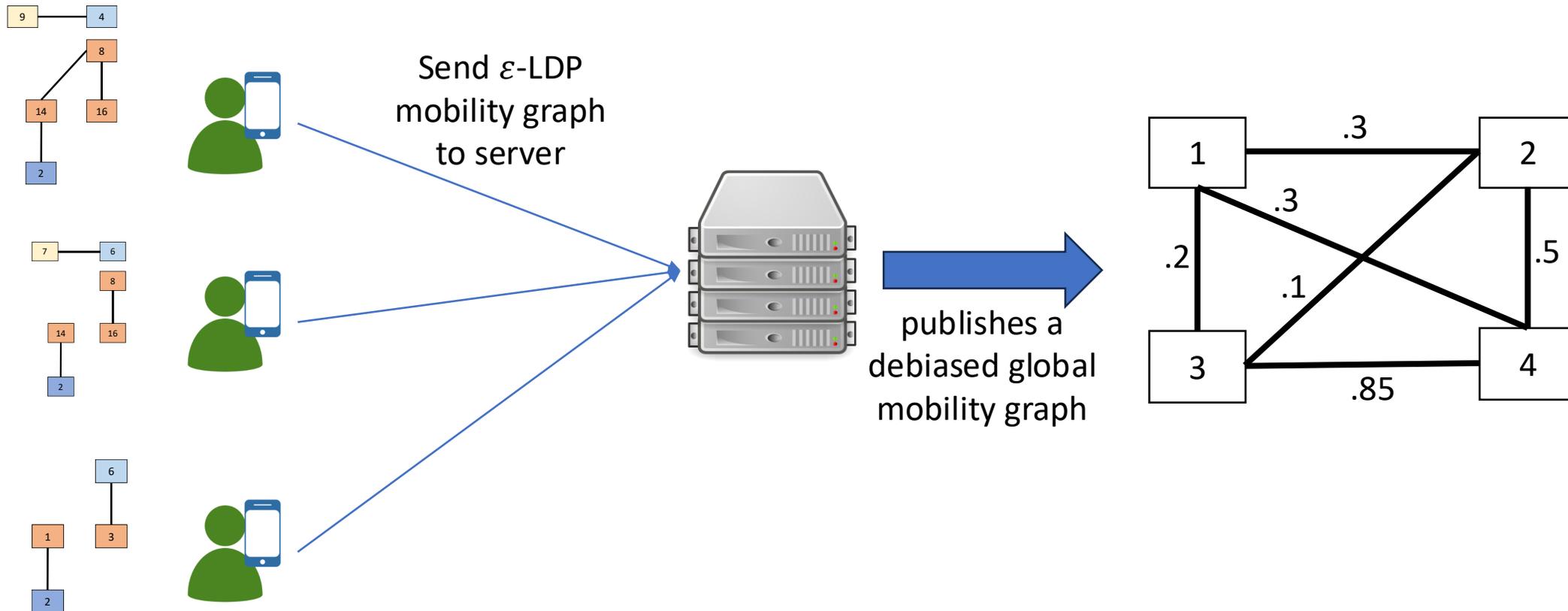
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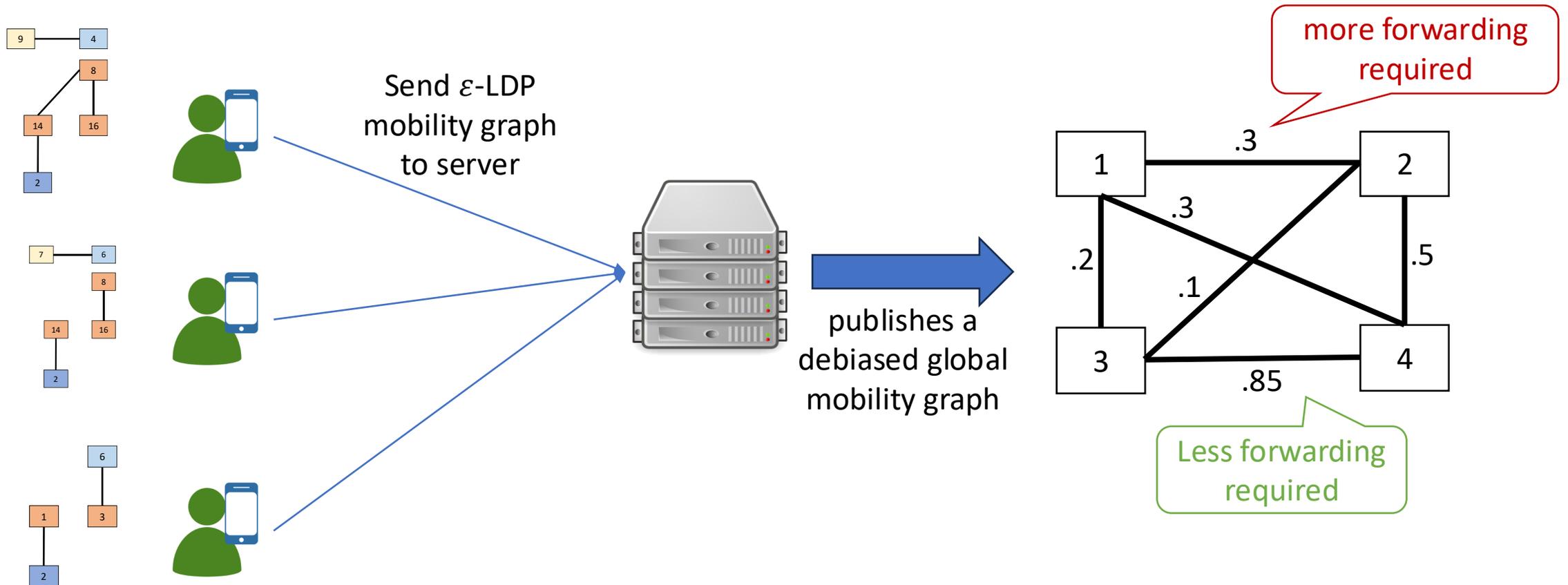
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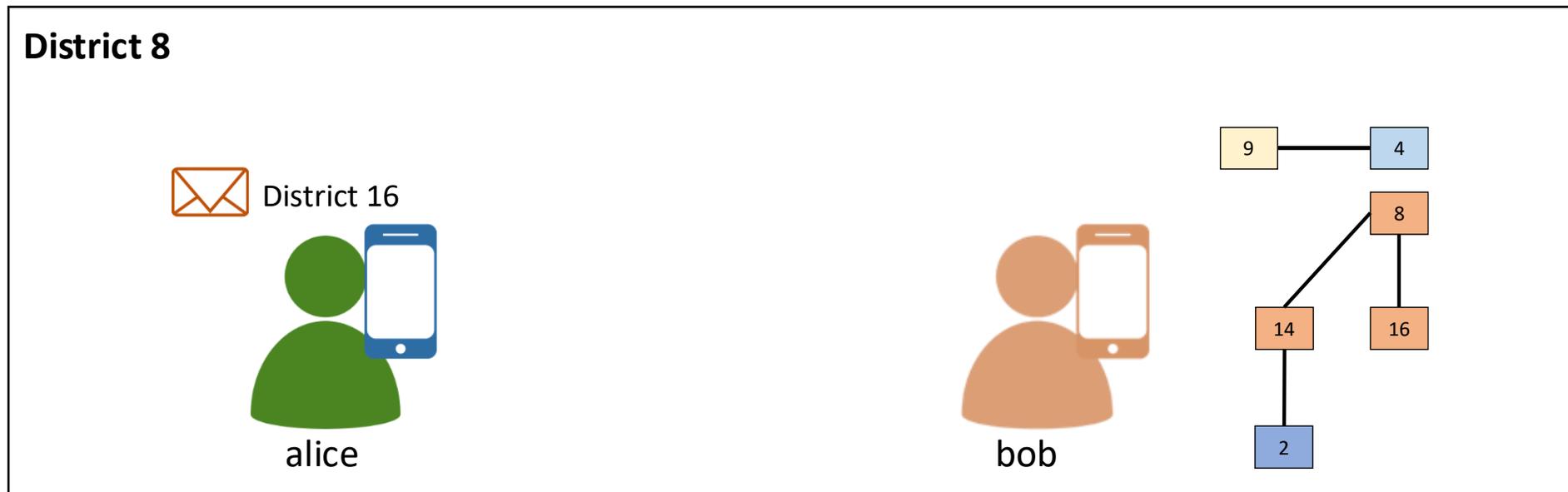


Private Routing Function

Intuition: Bob wants **plausible deniability** that he frequents a given district

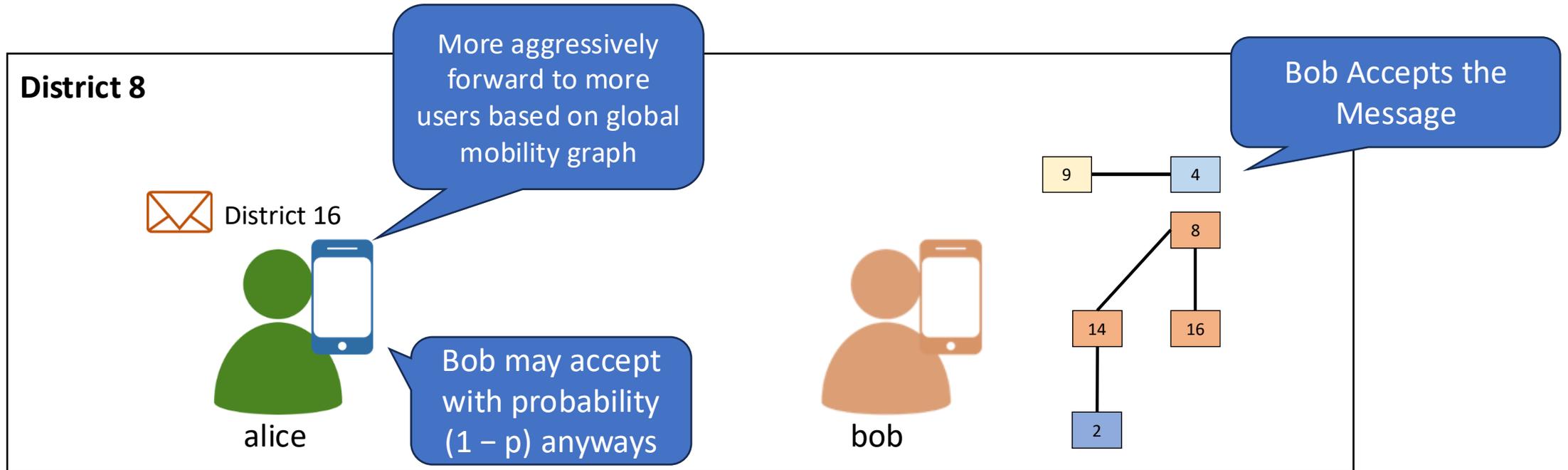
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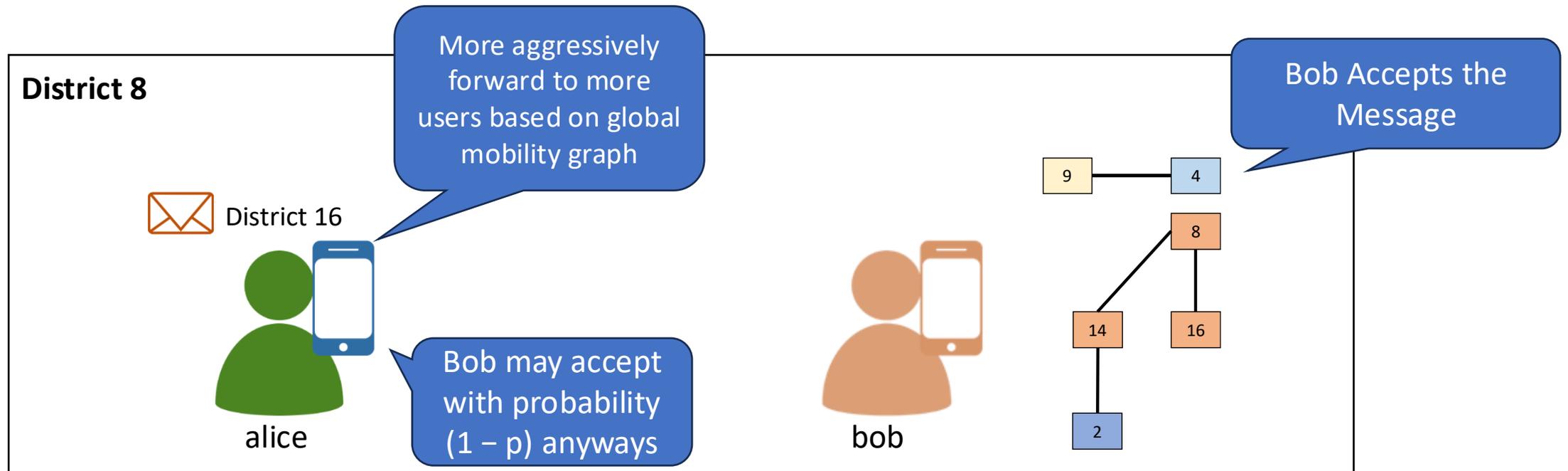
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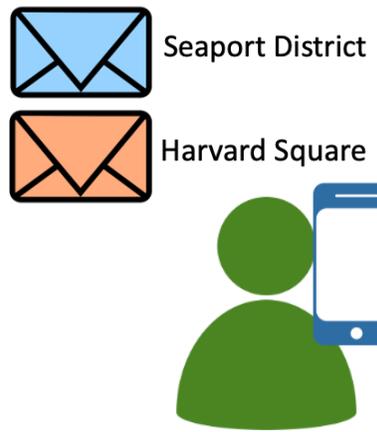
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ϵ -LDP Guarantee: $\Pr[f((\text{alice}, \text{bob}), m) = 1] \leq e^\epsilon \cdot \Pr[f((\text{alice}, \text{charlie}), m) = 1]$

Mirage: Private Mobility-based Routing



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Seaport District



Harvard Square

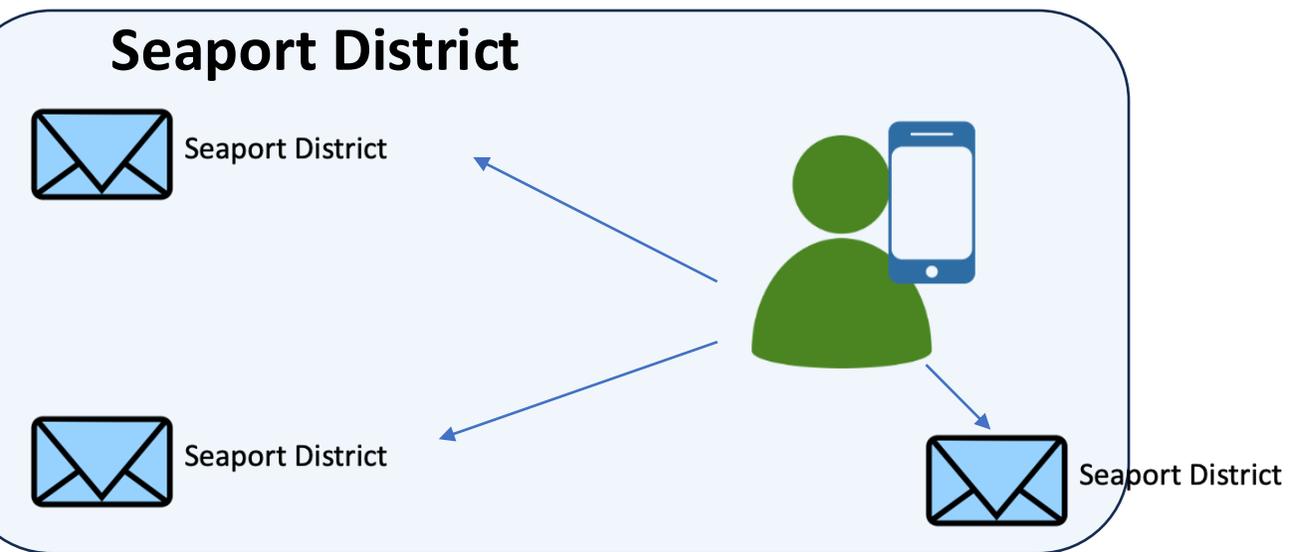
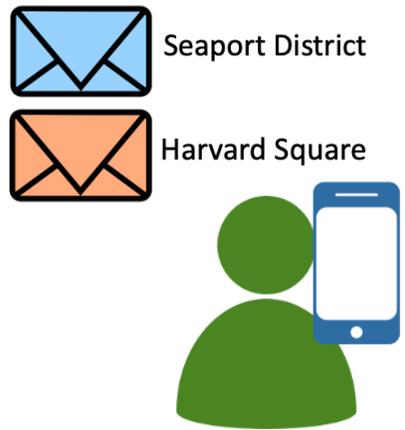


Check whether to accept
based on private mobility
profile

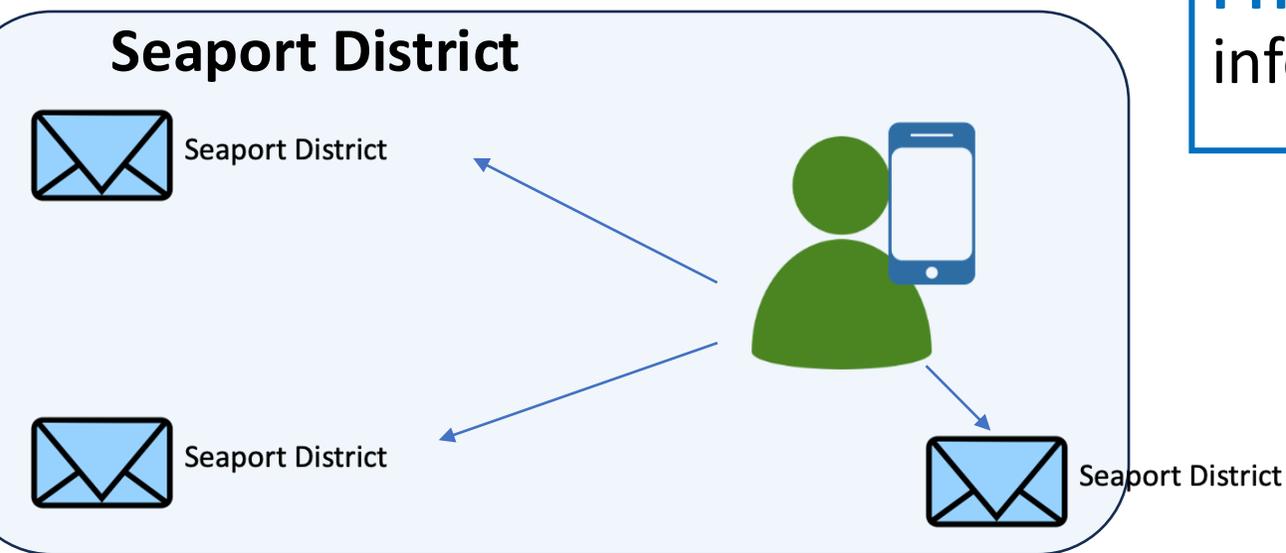
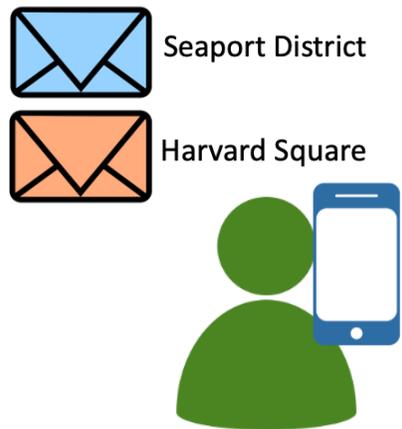
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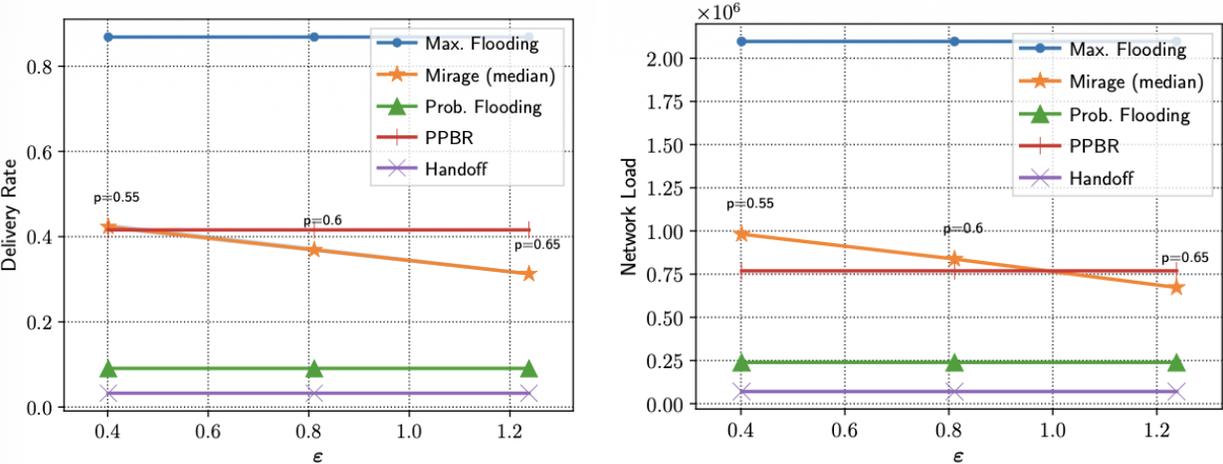
Efficiency: Reduced load vs. flooding, better delivery than random walk

Privacy: formal guarantees on how much information is leaked

Performance Evaluation

- Evaluated within the **Cadence** Human-movement protocol sim (Berger, Sherr, Aviv, 2023)
- Used T-Drive (Beijing taxi traces) and YJMob100K (Japan metropolitan mobility) datasets

YJMob100K Dataset

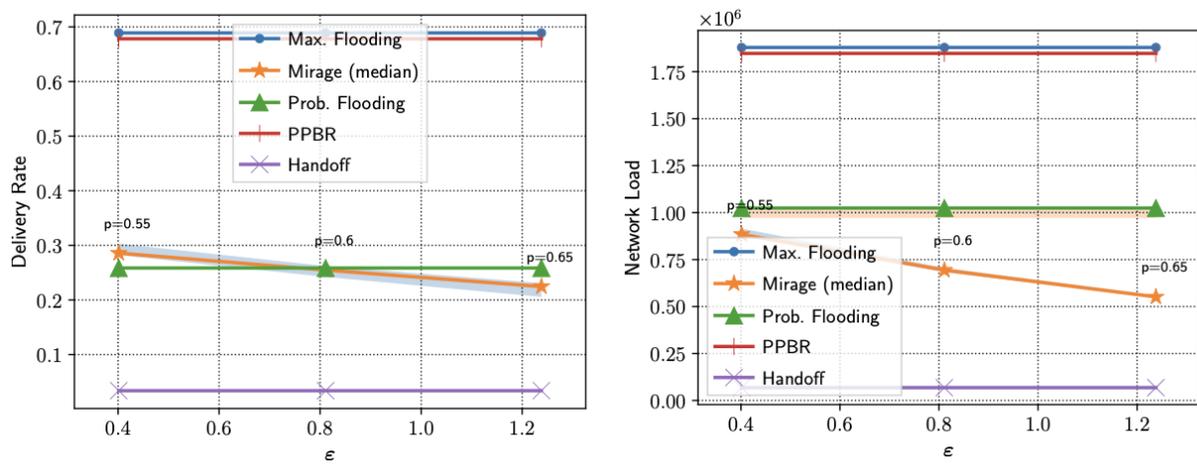


Delivery Rate

Network load

Comparable performance to PPBR!

T-Drive Dataset



Delivery Rate

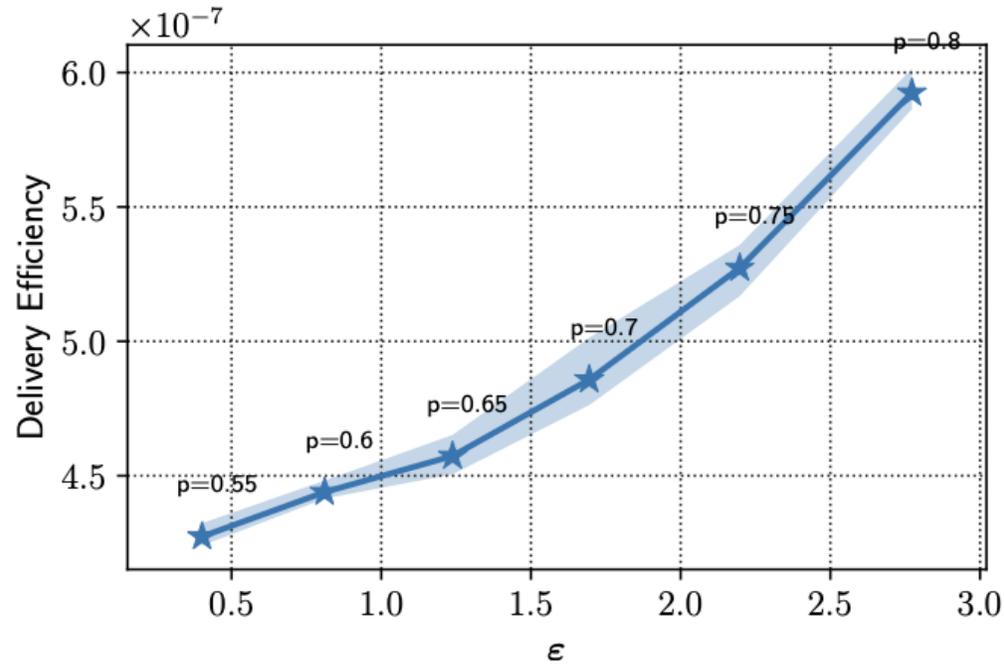
Network load

Worse on delivery rate; Better network load

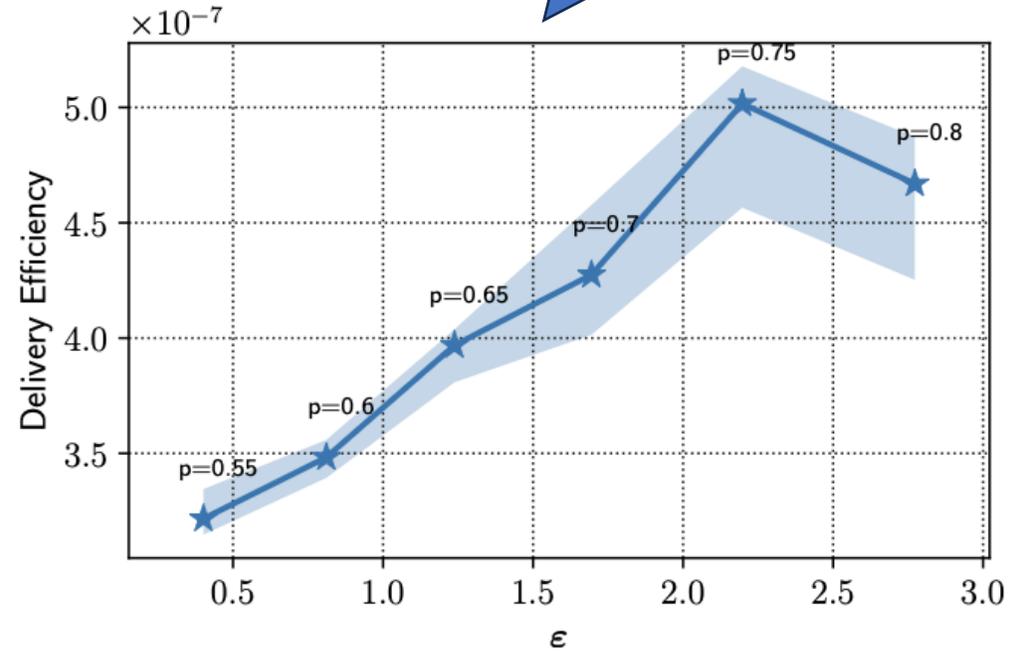
Privacy Tradeoff

Delivery Efficiency Metric: $\frac{\text{Delivery Rate}}{\text{Network Load}}$

Higher $\epsilon \rightarrow$ reduced privacy, but better delivery efficiency



(a) YJMob100K dataset



(b) T-Drive dataset

Questions?