




## Location Based Advertising and Location *k*-Anonymity

How can our location information be kept safe?

Matthew Gaba



# Protecting Location Privacy with Personalized k-Anonymity: Architecture and Algorithms

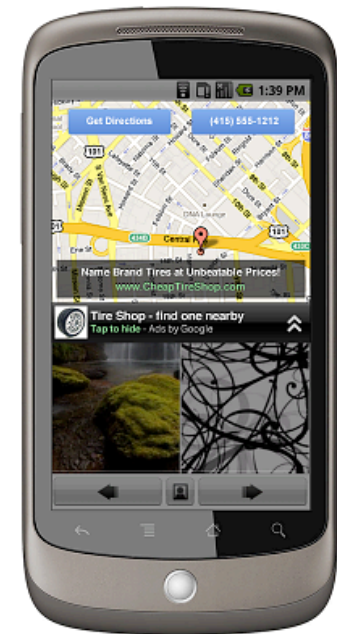
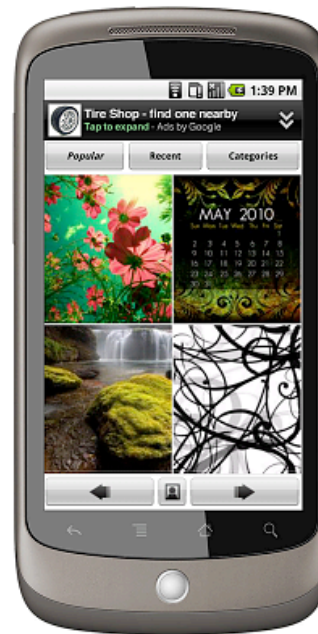
Bugra Gedik, Ling Liu

[http://scholar.google.com/scholar\\_url?hl=en&q=http://citeseerx.ist.psu.edu/viewdoc/download%3Fdoi%3D10.1.1.137.4420%26rep%3Drep1%26type%3Dpdf&sa=X&scisig=AAGBfm1lnG7y2j-ASa3\\_cdR0iAkVECQ4zQ&oi=scholar](http://scholar.google.com/scholar_url?hl=en&q=http://citeseerx.ist.psu.edu/viewdoc/download%3Fdoi%3D10.1.1.137.4420%26rep%3Drep1%26type%3Dpdf&sa=X&scisig=AAGBfm1lnG7y2j-ASa3_cdR0iAkVECQ4zQ&oi=scholar)

# What is LBA?



- A form of advertising that uses user location data to serve users context-specific targeted advertisements.
- “Location data” can be collected from the user with or without the user’s knowledge and consent:
  - IP Geolocation
  - GPS
  - Cellphone Tower Triangulation
- Also may be supplied by the user:
  - Zip code
  - Address
  - Area code



# Why is Location Data Valuable?



- Advertisers are paying almost 4x more for ad spots with location data, but why?
  - Demographic information
    - A rich or poor neighborhood?
    - Young or old?
    - Yale or Harvard?
    - Urban, suburban or rural?
  - Lifestyle choices
    - Safeway can “steal” costumers who frequent Target stores.
    - Did you run a 5k this weekend? Drink Gatorade!
  - Usage context
    - I am playing Angry Birds at home
      - Download Fruit Ninja Pro Advanced 3x!
    - I am playing Angry Birds in line at the supermarket
      - Use this coupon for Tide Laundry Detergent!



## Location Data as Sensitive Information



- People are rightfully concerned about their location being tracked.
  - Controversy over iPhone logging information data.
- Just like location data reveals information to advertisers, it can reveal information to an adversary.
  - Political affiliation
  - Alternative Lifestyles
  - Medical Problems
  - Business practices

## How do we protect this sensitive info?



- We want to preserve the value of location data, while, at the same time, mitigating privacy risks.
  - This is tricky, because location data is inherently personal and private, and LBAs target individuals using this personal, private information.
- Can we parameterize this value-privacy tradeoff?
- Personalized  $k$ -Anonymity!

## Personalized $k$ -Anonymity

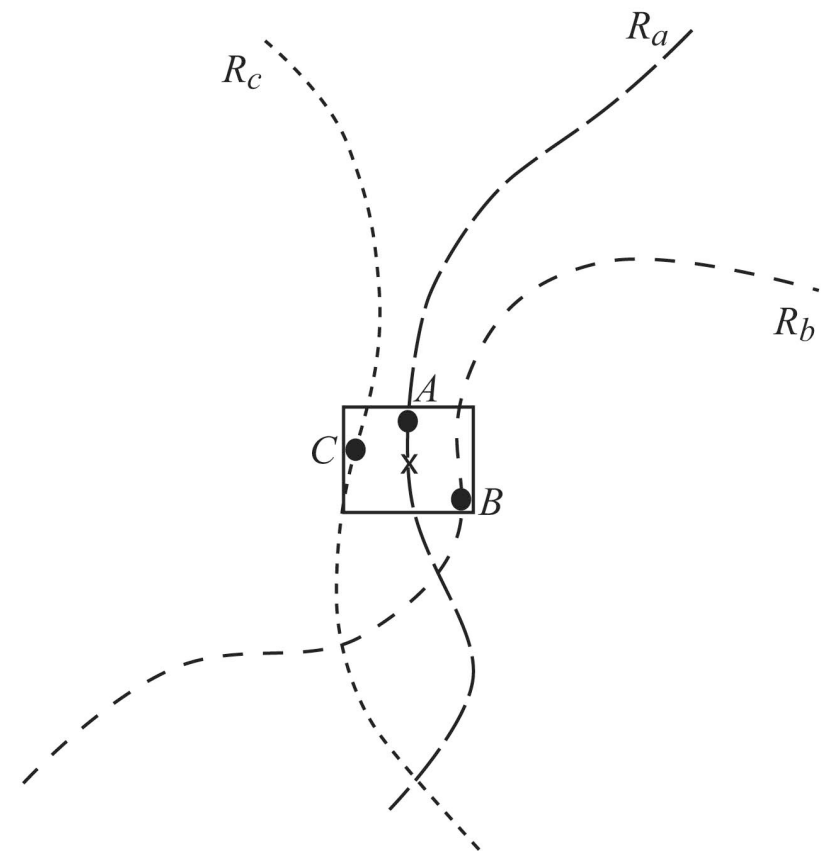


- A particular user's location is indistinguishable from  $k-1$  other user's location.
- This protocol allows a user to choose their own  $k$  on a message-by-message basis.
- Also allows user to specify maximum acceptable loss-of-value of their personal information.

## Why would a user want this?



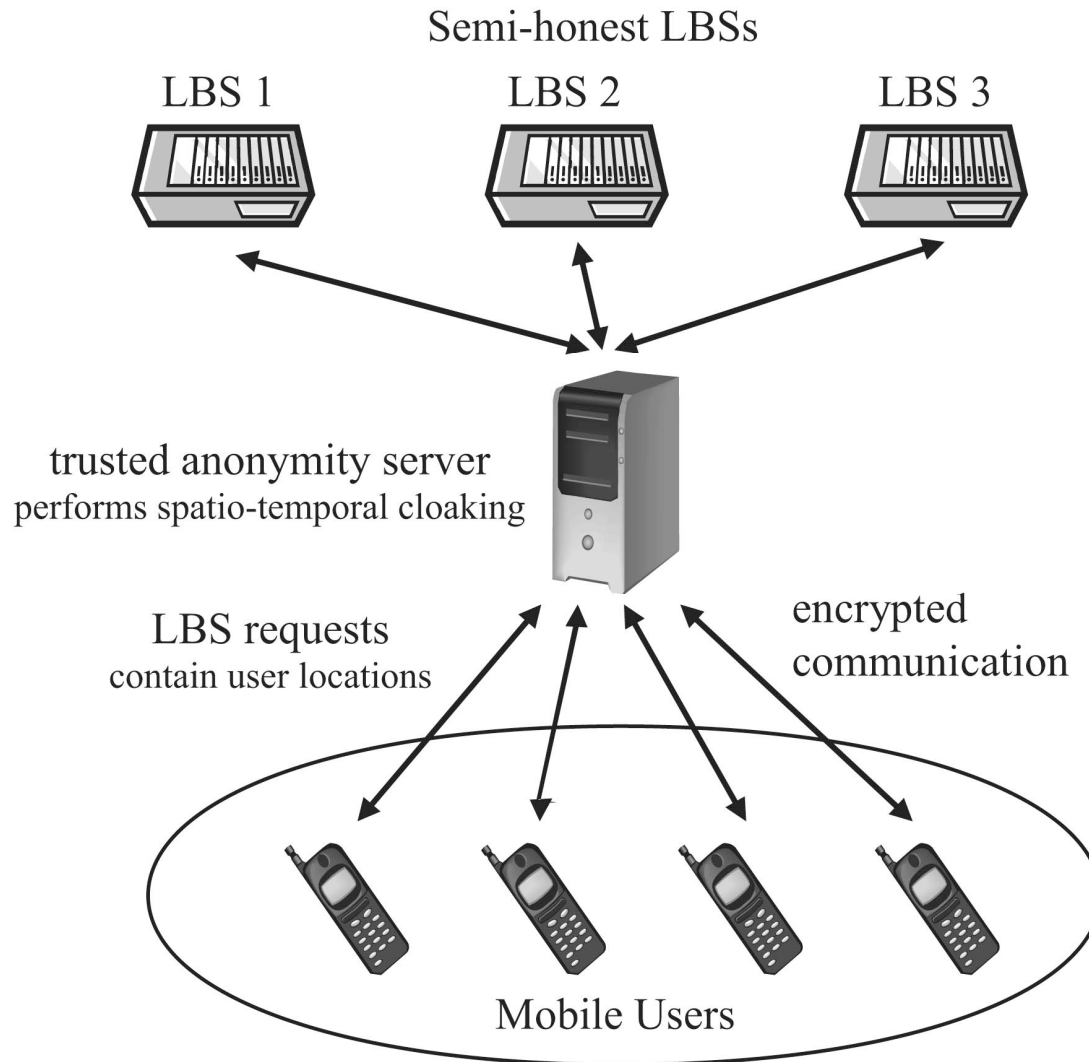
- Why can't we just remove all PII from location messages? Anonymize each individual message.
- An adversary may still be able to identify an individual by using outside information.



*Linking attack example.*



# Assumptions and Architecture



# What's in a message?



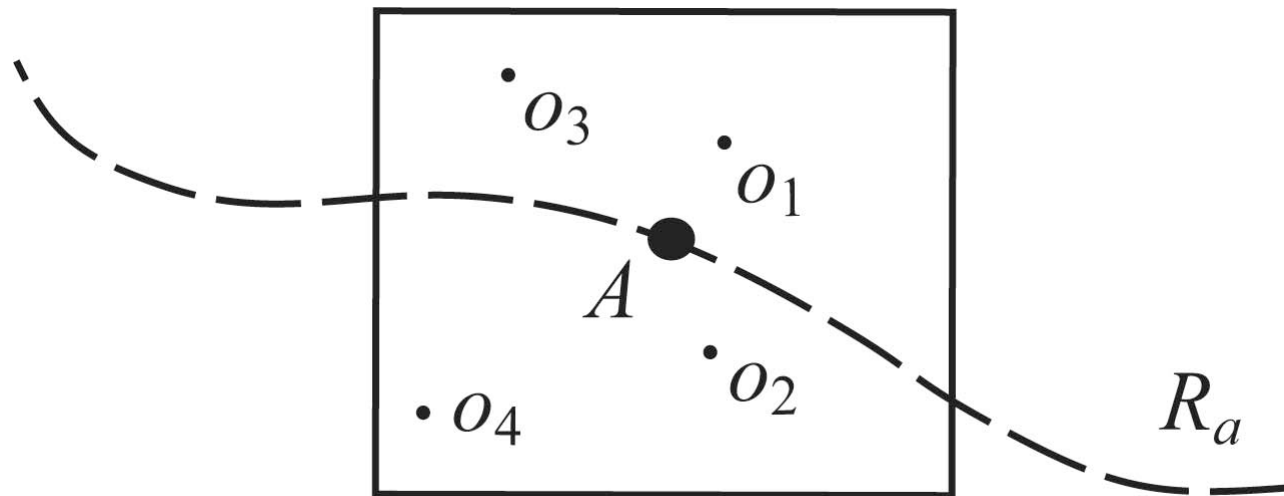
$$m_s \in S : (\underbrace{u_{id}, r_{no}}_{\substack{\text{sender id} \\ \text{message no}}}, \underbrace{\{t, x, y\}}_{\substack{\text{spatio-temporal} \\ \text{point}}}, \underbrace{k}_{\substack{\text{anonymity} \\ \text{level}}}, \underbrace{\{d_t, d_x, d_y\}}_{\substack{\text{temporal and spatial} \\ \text{tolerance}}}, C).$$

- Message sent to anonymizing server:
  - $u_{id}$ : Sender Id
  - $r_{no}$ : Message number
    - A message may be uniquely identified by  $u_{id}$  and  $r_{no}$
  - $t$ : Timestamp of message
  - $x$ : x-coordinate of message
  - $y$ : y-coordinate of message
    - Taken together, define a spatio-temporal point
  - $k$ : Anonymity level
  - $d_t, d_x, d_y$ : Temporal and spatial tolerance
  - $C$ : Content of message

# Need for Temporal and Spatial Tolerance



- Generally, achieving location  $k$ -anonymity with a higher  $k$  requires either a larger cloaking box, or longer temporal flexibility.
- Why is this bad?
- $d_t, d_x, d_y$  components of message allow user to specify just how much loss of service (value) they are willing to tolerate.

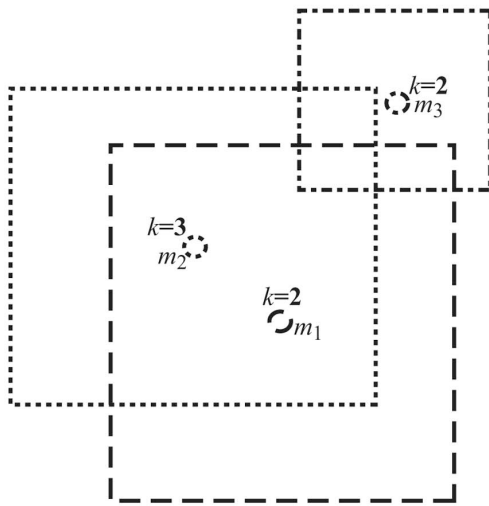
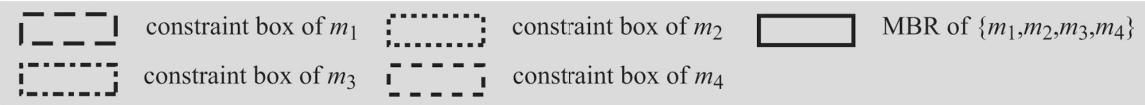


# The algorithm:

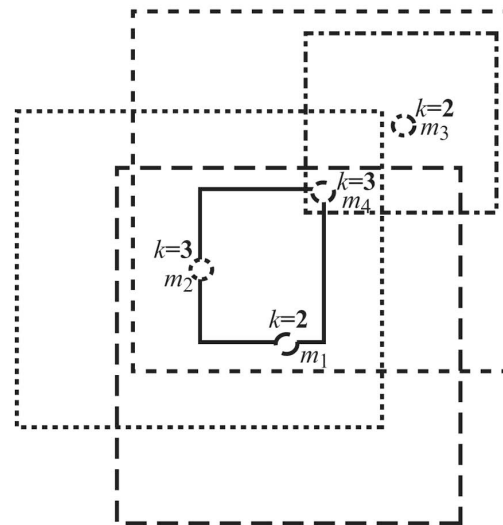


- Transform set of messages received by anonymity server into undirected graph.
- There exists an edge between two messages in the graph if and only if:
  - The messages originate from different mobile clients.
  - Their spatiotemporal points are contained in each other's constraint boxes defined by their tolerance values.
- Search graph for a clique s.t. size of clique is  $\geq$  the max  $k$  value of all nodes in the clique.
  - Gedik and Liu give *CliqueCloak* algorithm for efficiently performing this operation.
- Compute smallest bounding box that contains all nodes in the clique.
- Server forwards this bounding box and a set of user identifiers corresponding to nodes in the bounding box to LBS providers.

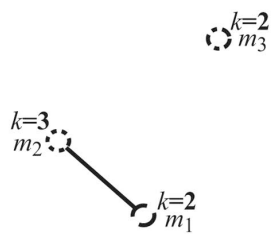
# Algorithm Illustration



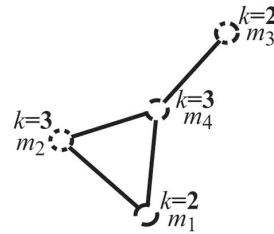
(a)



(b)



(c)



(d)

# Tradeoffs



## Pros

- Protects against several common types of attacks.
- Allows a user to feel more secure in giving up sensitive location data.
- Parameterization gives user control over their privacy.

## Cons

- Requires a trusted third party.
- Not sure how this protocol would extend to the realm of advertising.

# How can we use this in the realm of advertisements?



- A company like Google may want to give users the ability to adjust their  $k$  value in privacy settings
  - Price advertisers pay can scale with the size of the bounding box.
  - Google may be able to specify the temporal-spatial tolerance parameters if there is some cutoff point past which location data is meaningless to advertisers.
- A service provider, like Spotify, will offer a hybrid pay/advertisement system. The service will allow a user to choose a  $k$ , and the higher the  $k$ -value, the more the person has to pay.
  - A clever way of fixing the privacy vs. pay problem of ad-supported services.
  - Complicated.

A green rounded rectangle with a white border. On the left side, there are three overlapping light green circles of varying sizes. The text "Questions?" and "Thoughts?" is written in white on the right side of the rectangle.

Questions?

Thoughts?