

The background of the slide features a close-up of a black wrought-iron gate. A prominent gold-colored octagonal seal is mounted on the gate, depicting a classical building with columns and the words "TEMPLE UNIVERSITY" and "PHILADELPHIA" around its perimeter. To the left, a red banner with white Chinese characters is partially visible. The overall scene is set outdoors with trees and a blue sky in the background.

# Opportunistic WiFi Offloading in a Vehicular Environment: Waiting or Downloading Now?

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# Agenda

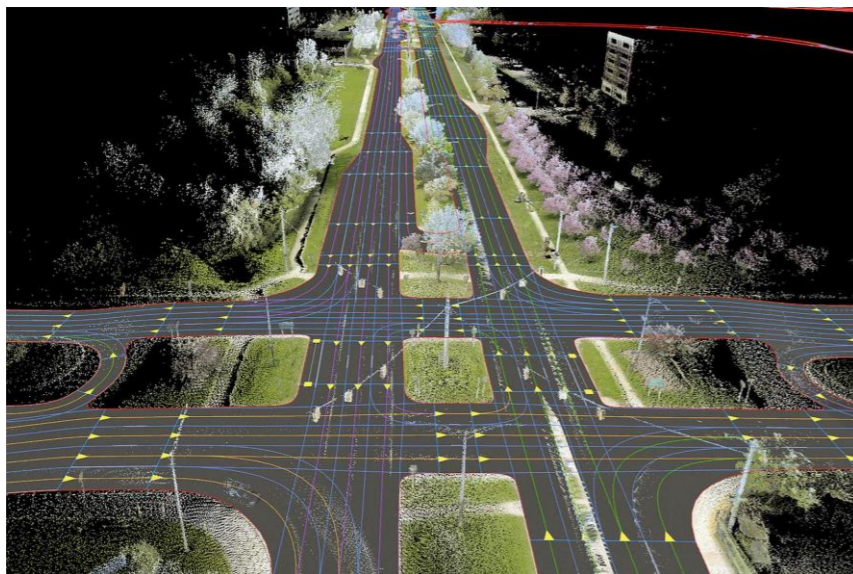
- Motivation
- Model and problem formulation
- Theoretical analysis
- The idea of the proposed algorithm
- Performance evaluations





# Motivation

- Data downloading during the driving
  - Self-driving vehicles
    - Traffic and safety information
    - High-resolution digital maps
  - On boarding applications
    - Video, music, social networks
    - .....



android auto



Apple CarPlay





# Related works

- Opportunistic offloading
  - Mobile Data Offloading through Opportunistic Communications and Social Participation. (TMC 2012)
- User's satisfaction decay with time
  - Toss: Traffic offloading by social network service-based opportunistic sharing in mobile social networks (INFOCOM 2014)
- Roadside Units deployment
  - On-road ads delivery scheduling and bandwidth allocation in vehicular cps (INFOCOM 2013)





# Motivation

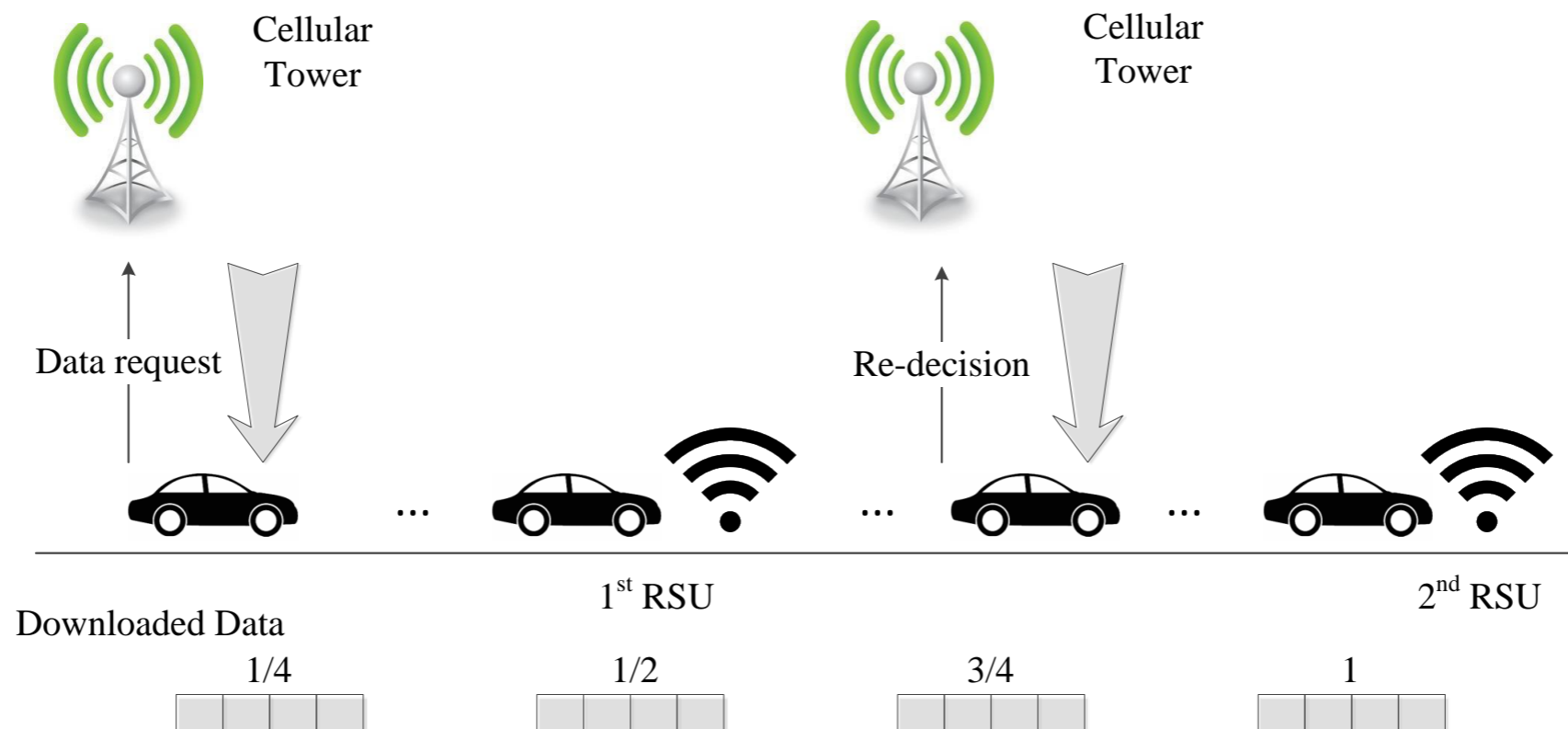
- **A hybrid network**
  - Roadside Units with WiFi (RSUs).
    - Limited coverage, high bandwidth, cheap
  - Cellular network
    - Full coverage, low bandwidth, expensive.
- **Delay-sensitive data downloading**
  - Delay sensitive data
    - Incoming call, safety information update
  - Delay non-sensitive data
    - Music, social network update, etc.





# Network model and Problem

- With the increasing of data size
- A trade-off between the **cost** and **delay**
  - from the Cellular network: No risk but lead to a high cost.
  - from the RSUs network : Risk, high delay, but cheap





# Network model and Problem

- Maximize the user's satisfaction

- If the **cost** is **high**, the user's satisfaction will be **low**.
- If the **delay** is **large**, the user's satisfaction will be **low**.

- Utility model

$$U_t = U_0 - at$$

The sensitivity to the delay

- Cost model

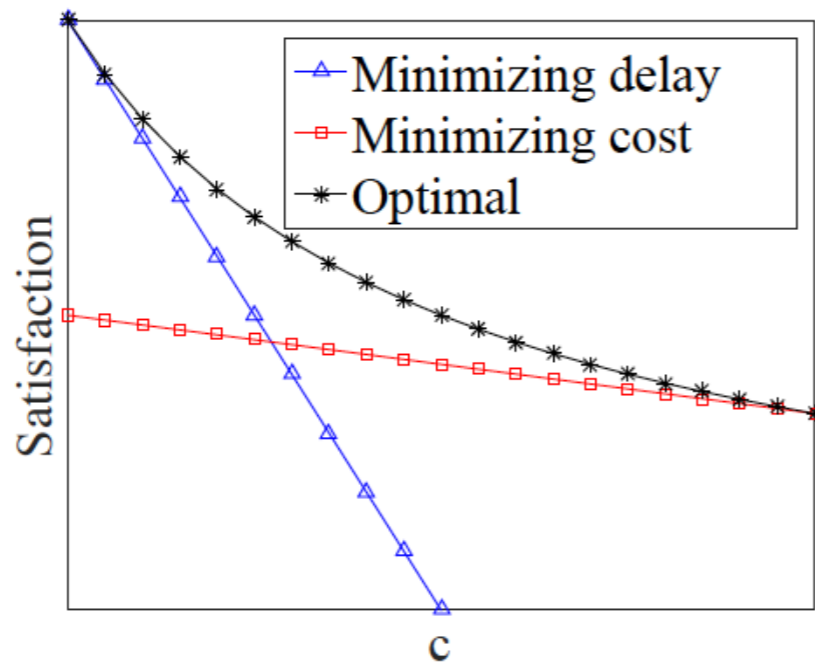
- The price of downloading from cellular networks is **c** higher per bit than the price of downloading from RSUs.



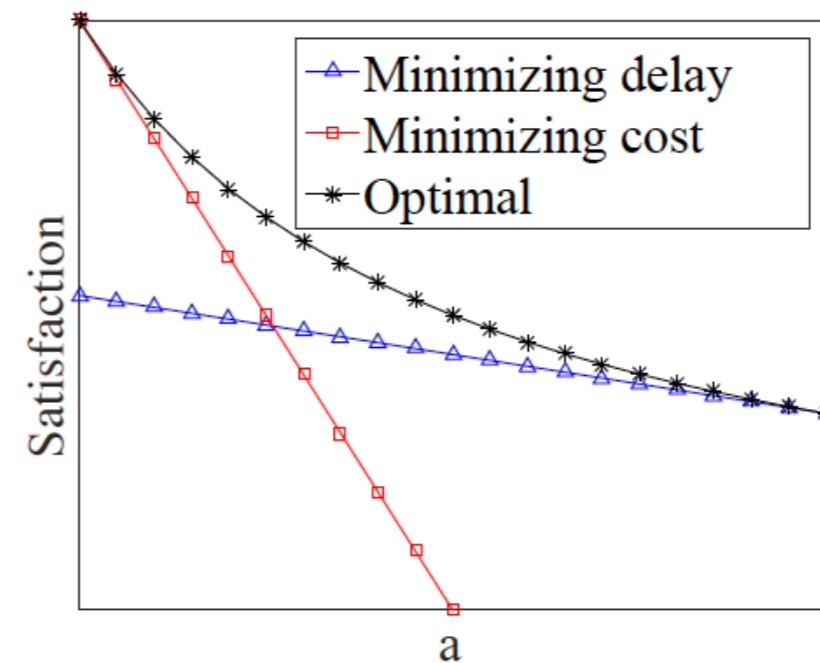


# Challenges

- Simple downloading strategies.
- only get good result in certain scenarios.



(a) Different data downloading cost



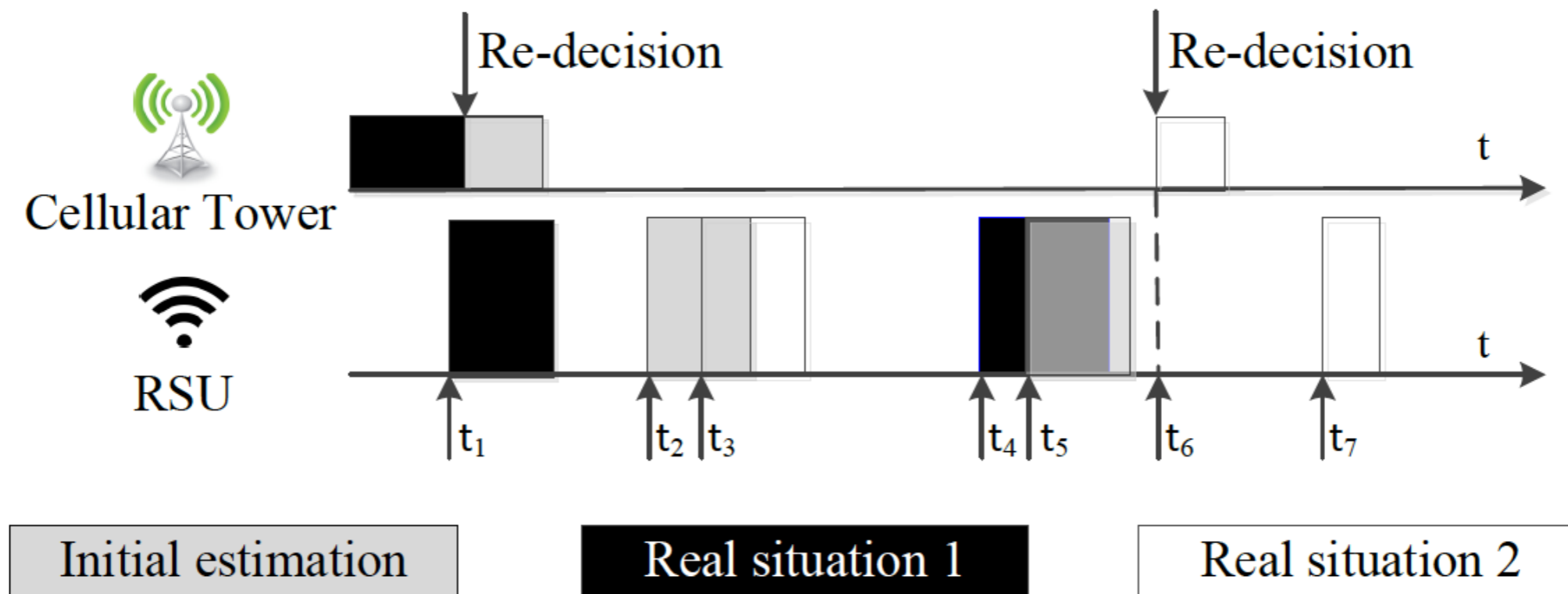
(b) Different data utility decay speed





# Challenges

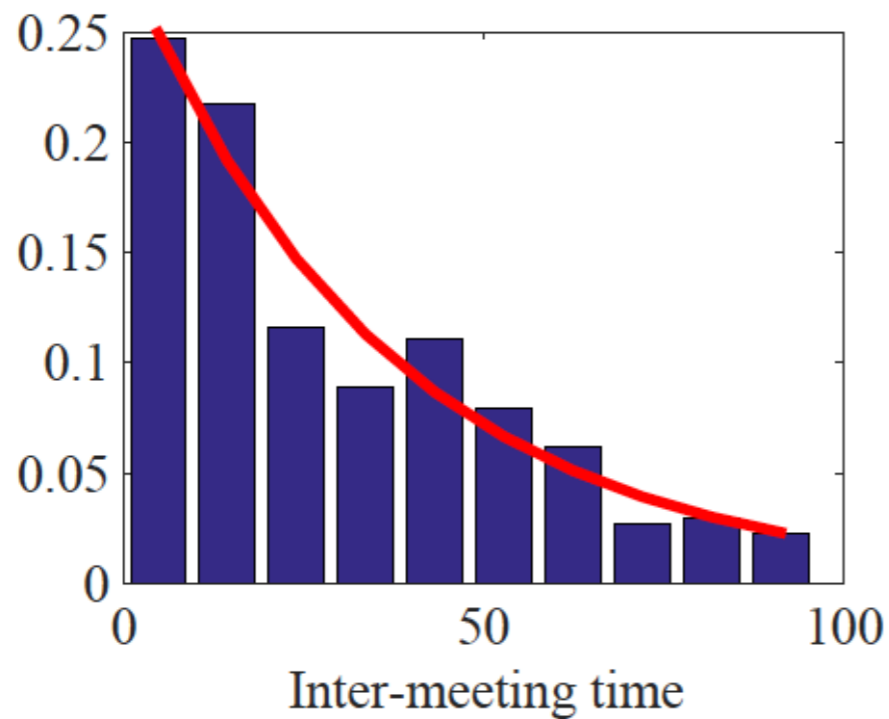
- How to predict the expected utility through RSUs?
- When to adjust your downloading strategy?



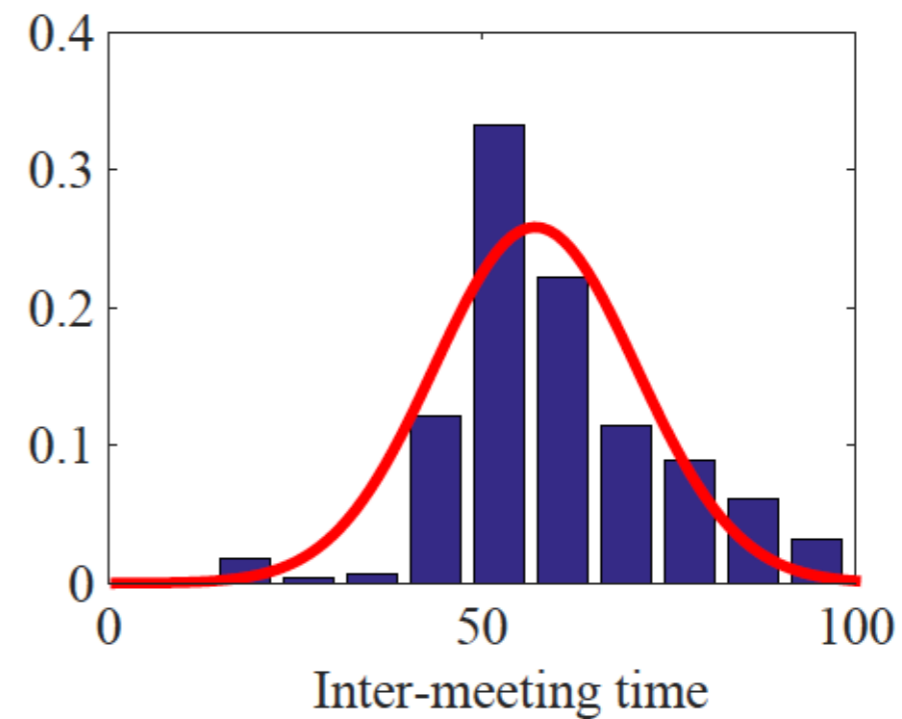


# Real trace

- Inter-meeting distribution between a vehicle and RSUs in Diesel Bus Dataset:



(a) No.3204 bus



(b) No.5676 bus





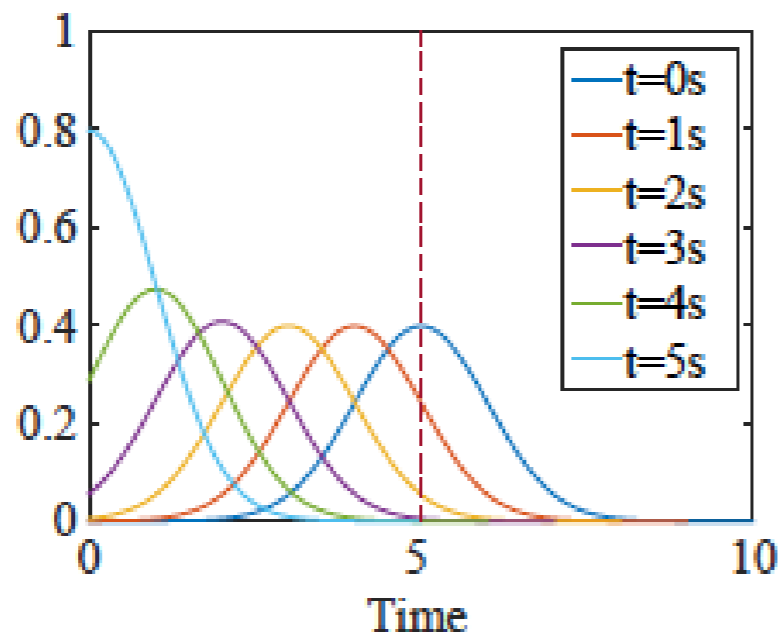
# One RSU

- Exponential inter-meeting distribution
- Memoryless property
- Theorem: For exponential distribution of the encountering time between the vehicle and RSUs, the vehicle only needs to **do the decision once**: download from the cellular network right now, or never. The criterion of choosing the cellular network right now is  $a/2\lambda > c$ .

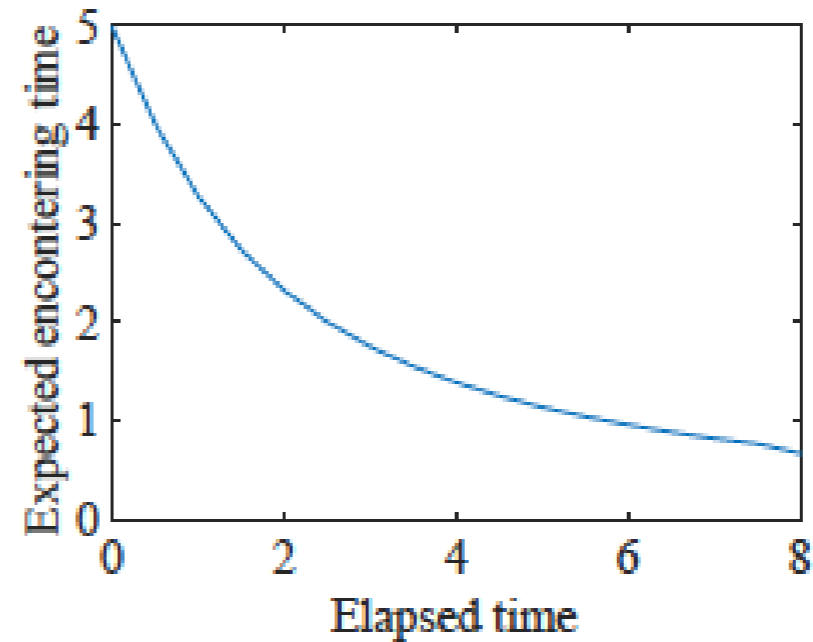


# One RSU

- Gaussian inter-meeting distribution



(a) Probability density function



(b) Expected encountering time

- Theorem: For Gaussian distribution of the encountering time between the vehicle and RSUs, the criterion for choosing the cellular network right now is  $\frac{(T^e)^{\beta+1} a}{\beta} > c.$



# multiple RSUs

- Dependent inter-meeting time in RSUs
- Meet one RSU earlier (later), high probability to meet the following RSUs earlier (later)

$$f(t_1, t_2, \dots, t_k) = \frac{1}{q} \cdot f_1(t) * f_2(t) \cdots * f_k(t),$$

- Theorem: the expected meeting time with  $k$ th RSUs will not change, however the estimation uncertainty will increase  $\sqrt{k}$  times.





# Proposed solution

- Adaptive algorithm
- RSUs meeting prediction by historical information.
- Jointly consider the **expected meeting time** with RSUs and the **uncertainty** to do downloading strategy.
- Re-decision based on the actual situation.

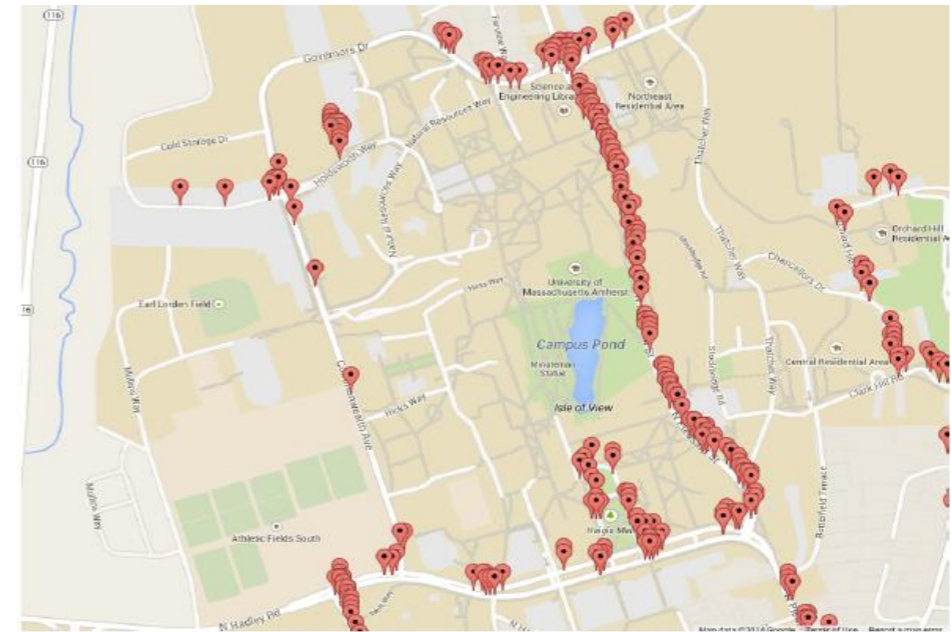




# Performance evaluation

- Trace information
  - Synthetic trace
  - UMass Diesel Trace
    - 40 Buses
    - 47 RSUs
- Experiment setting
  - Average data size 6MB
  - Different cost setting
  - Different decay speed

bandwidth	Cellular	RSUs
Kbps	20	100



- Meeting positions of a bus with RSUs in Diesel data trace, where the red marker represents the contact records between a vehicle and RSUs





# Algorithm comparison

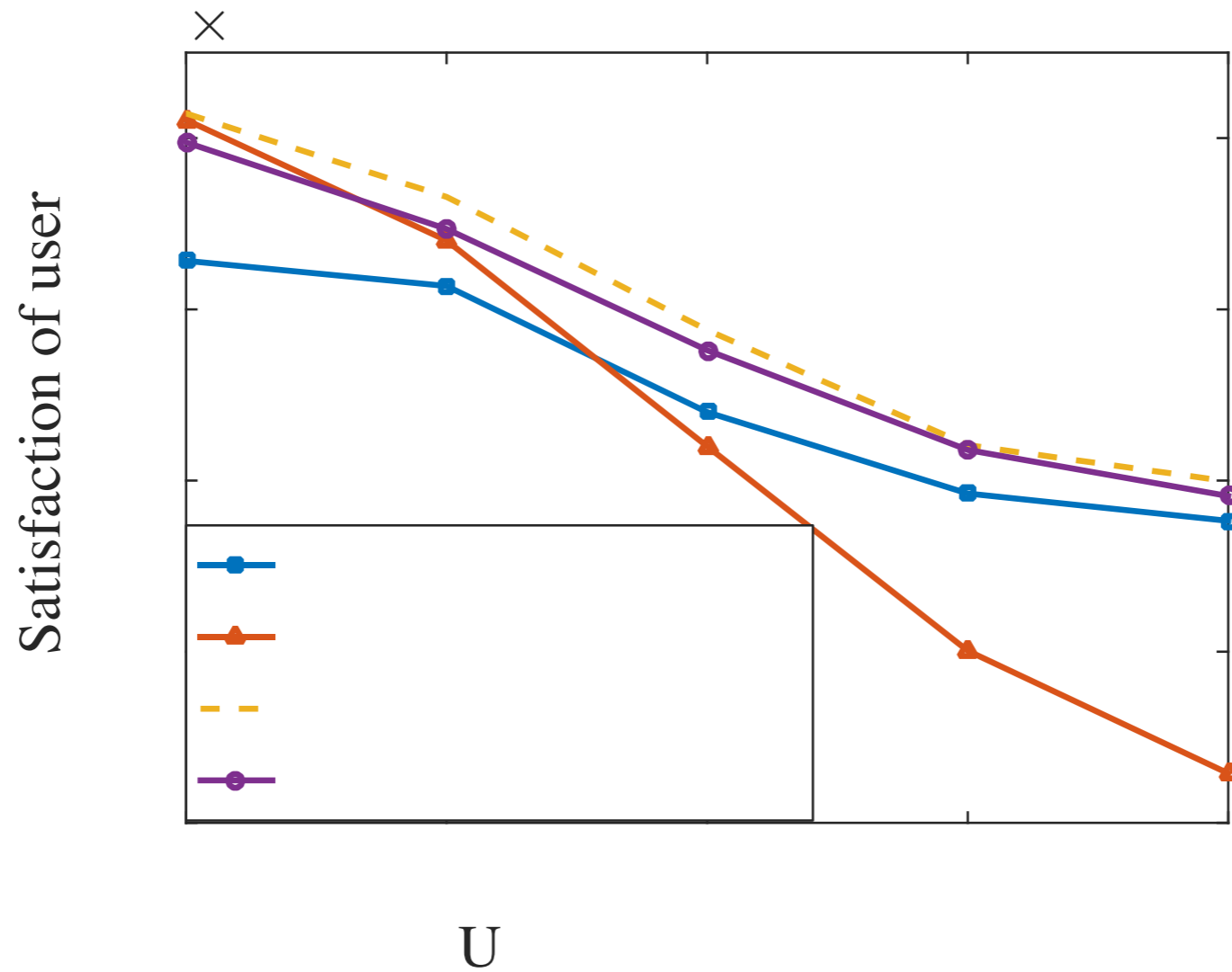
- Algorithms:
  - Minimizing delay: Keep downloading data from cellular network.
  - Minimizing cost: Always wait for the RSUs
  - Optimal solution through brute-force
  - Proposed algorithm





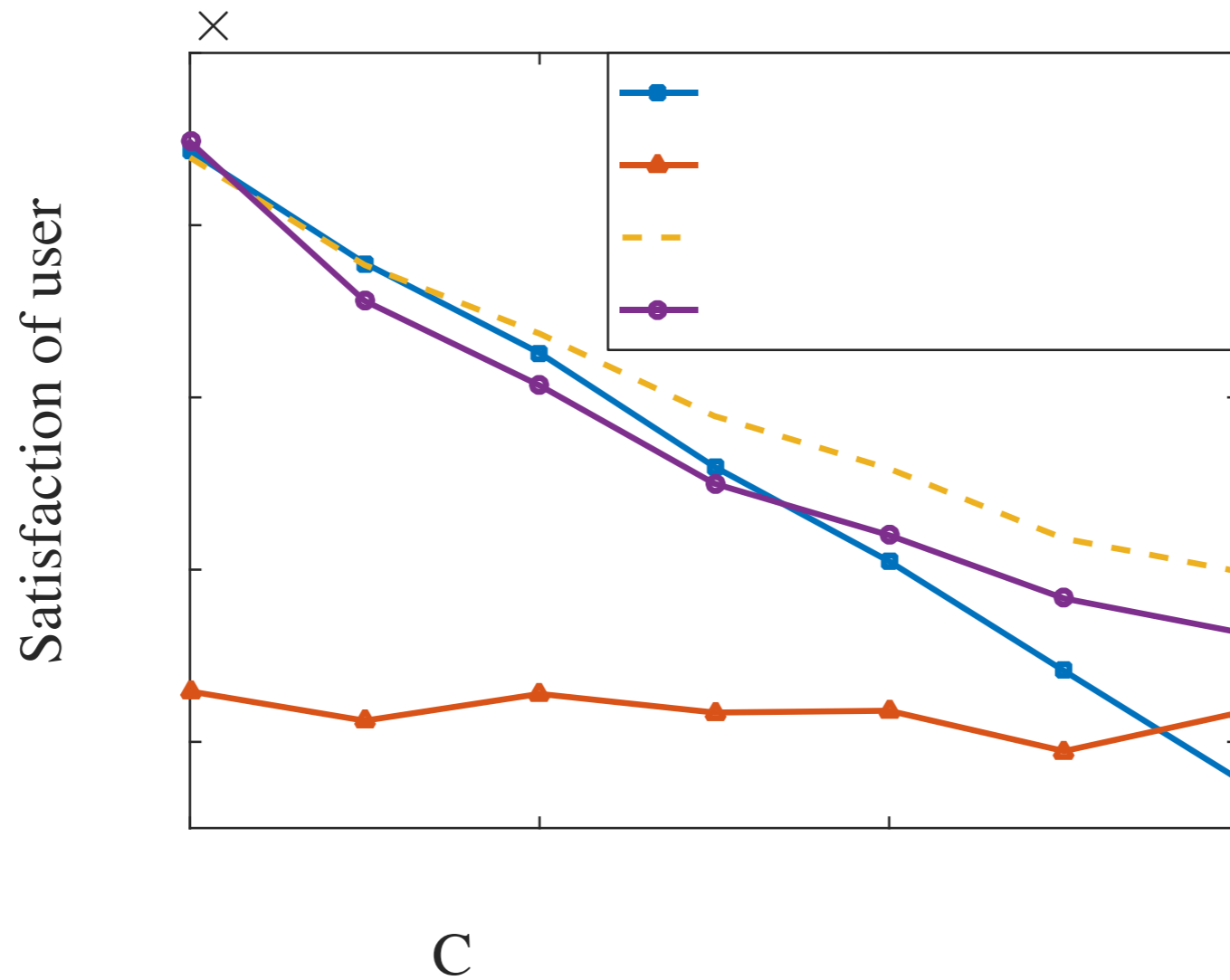


# Experiment result



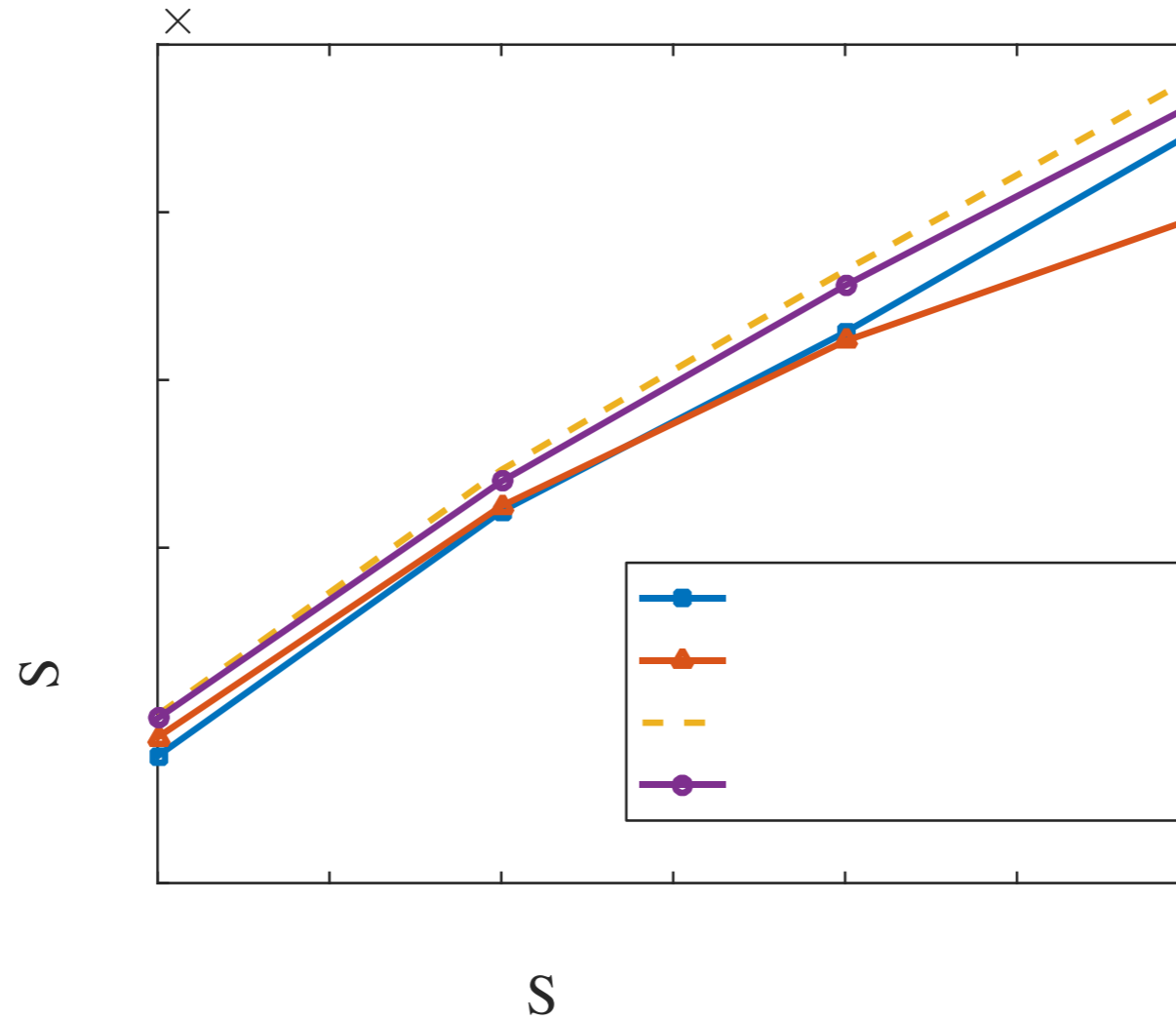


# Experiment result





# Experiment result





# Conclusions

- We investigate the data downloading strategy from a hybrid network (RSUs and Cellular networks), considering the downloading cost and delay.
- We analyze two theoretical meeting distributions and propose an adaptive scheme.
- RSUs inter-meeting prediction.
  - Inter-meeting time and uncertainty

**Future work:** the content sharing between vehicles





# Thank you!

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