

# Routing in human interaction networks

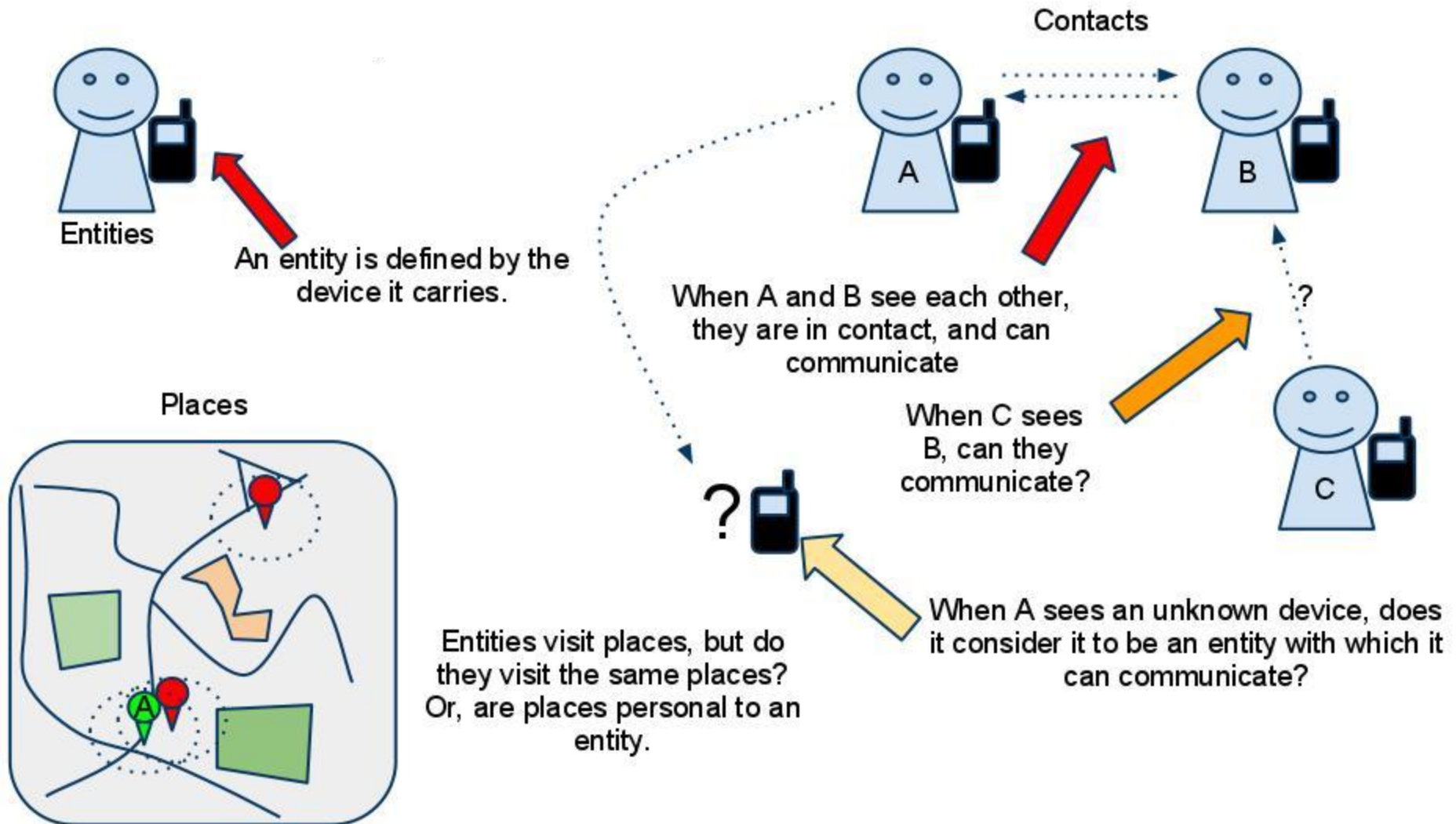
?

- Sending messages *without the need* for infrastructure
  - Low cost, low importance
  - Network specific data
  - Sensor networks?
- Utilising interaction patterns
  - Contacts
  - Locations
- Tolerating delays
  - Sparse network
  - Intermittent connectivity

# Outline

- Metrics for routing
- Existing techniques
- Datasets for Simulation
- Persistence Based Routing in detail
  - Results
- Location routing (LBR)
  - Results

# Entities, Contacts and Places



# Structures

- Visited places graph
  - Node where a person visits
  - Directed edge between places that a person visits
  - Time ordering of
  - Aggregate graph of all visited places
- Encountered individuals graph
  - Node is a person
  - un-directed edge between nodes that have met
  - Aggregate graph of all node encounters

# Metrics for routing

## 4.1 Encounter age

Rationale	Nodes that have been encountered recently are likely to be encountered again soon.
Properties	<ul style="list-style-type: none"><li>– Small values (recent contact) are good indicators of proximity.</li><li>– As values get larger, they become poorer.</li></ul>
Algorithms	PROPHET [61], Seek/Spray and Focus [79, 81]

## 4.2 Inter-contact time (ICT)

Rationale	In order to minimise delay, route towards nodes that are likely to connect again soon.
Properties	<ul style="list-style-type: none"><li>– Aim to minimise delivery delay, rather than explicitly maximise delivery ratio.</li><li>– Short, bursty connections may lower inter-contact times while total duration of contacts remains low.</li></ul>
Algorithms	MED/MEED [51, 53], RAPID [7], MH* [22]

## 4.3 Meeting Frequency

Rationale	Nodes that we meet most frequently are likely to be met again soon.
Properties	<ul style="list-style-type: none"><li>– Easily counted.</li><li>– Number of connections does not account for duration or burstiness.</li></ul>
Algorithms	Meets and Visits [17], MaxProp [15]

## 4.4 Rate of change of connectivity

Rationale	<ul style="list-style-type: none"><li>– High rate of change of neighbours imply high mobility.</li><li>– More mobile nodes are more likely to encounter the destination.</li></ul>
Properties	<ul style="list-style-type: none"><li>– Purely a measure of mobility.</li><li>– High mobility is not necessarily an indicator of a good path to particular destinations.</li></ul>
Algorithms	CAR [63]

## 4.5 Link duration

Rationale	Nodes which spent a lot of time in contact in the past, are likely to be in contact now or in the future.
Properties	<ul style="list-style-type: none"><li>– Explicitly aims to maximise delivery ratio.</li><li>– Does not count frequency or sequencing of connections.</li></ul>
Algorithms	SEPR [83]

## 4.6 Network science measures

Rationale	Measuring closeness to a destination via clustering or using betweenness centrality shows how important a node is for quick delivery to destinations.
Properties	<ul style="list-style-type: none"><li>– Utilise measures of network properties.</li><li>– Measure are locally calculable.</li><li>– Very sensitive to how graph aggregation occurs.</li></ul>
Algorithms	SimBet [24], BubbleRap [48]

# Requirements

- High delivery ratio
- Low delivery cost
- Low delivery latency
- Decentralised\*

\* *ideally*

# Existing Techniques




































*for comparison*

Name	Delivery Ratio	Cost
Flooding	Excellent	Very high
Random / Epidemic (1 copy)	OK	High
Prophet	Good	High
Bubble-Degree	OK	Low
Persistence Based Routing (PBR)	Good	Low

Others include: Spray and Focus, Hold and Wait, CAM, MED/MEED, RAPID, MH\*, Meets & Visits, MaxProp, SEPR, SimBet, Etc.



# Datasets for Simulation

	#Nodes	GPS	WiFi	Bluetooth	Cell	Locations / Places	Contacts / Interactions
SocialSensing							
GeoLife							
Reality Mining *							
Cab Spotting *+							
Synthetic + (per-gen)							

\* Cited in literature

+ Not human movement

Others: CenceME, Rollernet, TomStalker, etc.

# Example: Persistence Based Routing

*simple version*

- Route based on amount of time connected to destination node
- Route tables shared amongst nodes and distributed over contact network

## 7.1 Persistence Based Routing

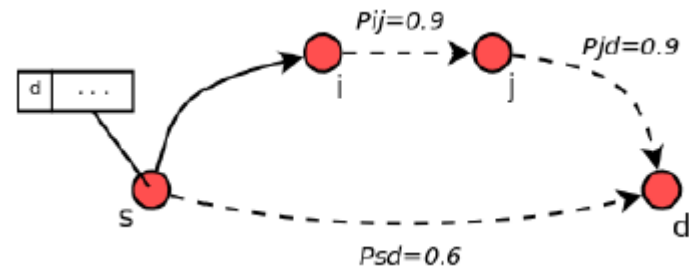
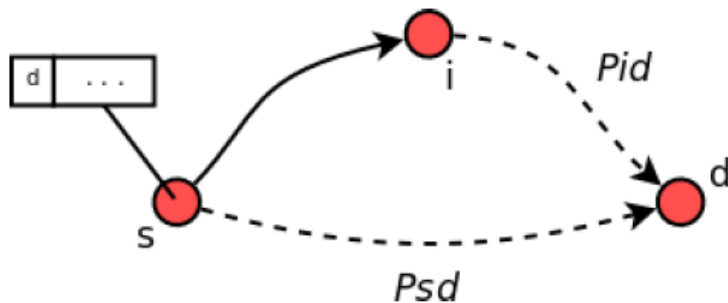
The Basic Premise:	The more time we spent in contact with a given node in the past, the more likely we are to come into contact with them in the future.
The Routing Question:	“When I come into contact with a node $i$ , is that node more likely to deliver a message to it’s destination than I am?”
The Goal:	To maximise the number of successfully delivered messages with preference to reducing delivery time.

# PBR

$$A_{ij}(t) = \begin{cases} 1 & \text{if link } i \rightarrow j \text{ occurs in time-slot } t \\ 0 & \text{otherwise} \end{cases}$$

$$\pi_{ij} = P_{ij} = \frac{\sum_T A_{ij}(t)}{T}$$

**if** ( $\pi_{id} > \pi_{sd}$ )      forward message to node  $i$   
**else**                      keep message



$$\pi_{sd} = P_{sd} = 0.6.$$

$$\pi_{id} = P_{ijd} = P_{ij} \cdot P_{jd} = 0.81$$

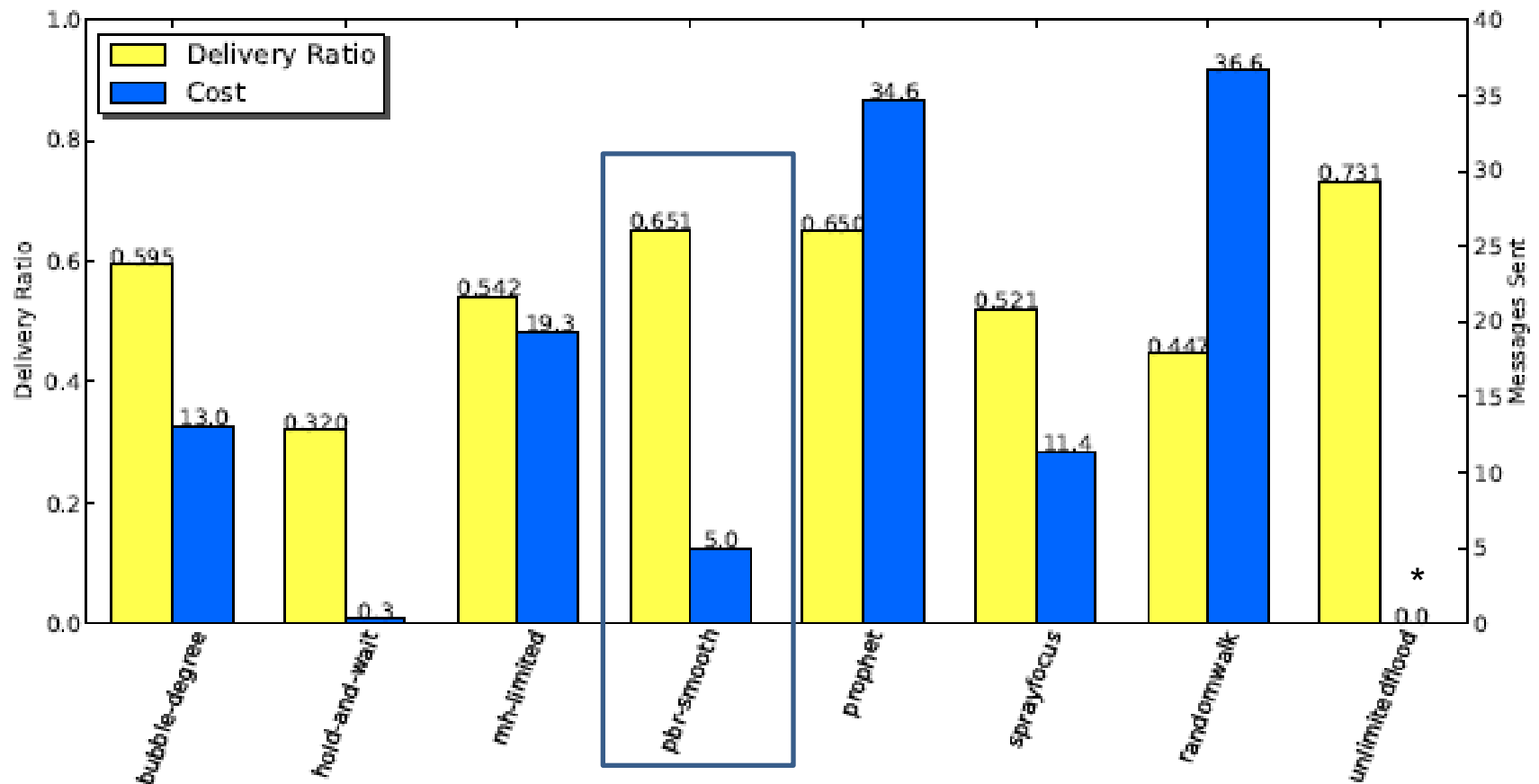
# ContactSim

*a.k.a LocationSim*

- Discreet event simulator
  - Powerful configuration
  - Datasets
  - Protocols
  - Tasks

`svn+ssh://kind.ucd.ie/Volumes/Data/svn/software/LocationSim/trunk`

# PBR Results



Delivery ratio and average cost for each delivery algorithm, using MIT reality mining dataset for October 2004

# Using Location

- Calculate ranking of individuals visits to towers
- Route based on rank

Popularity of user  $i = \sum_j \tau_{ij}(p_j + c)$

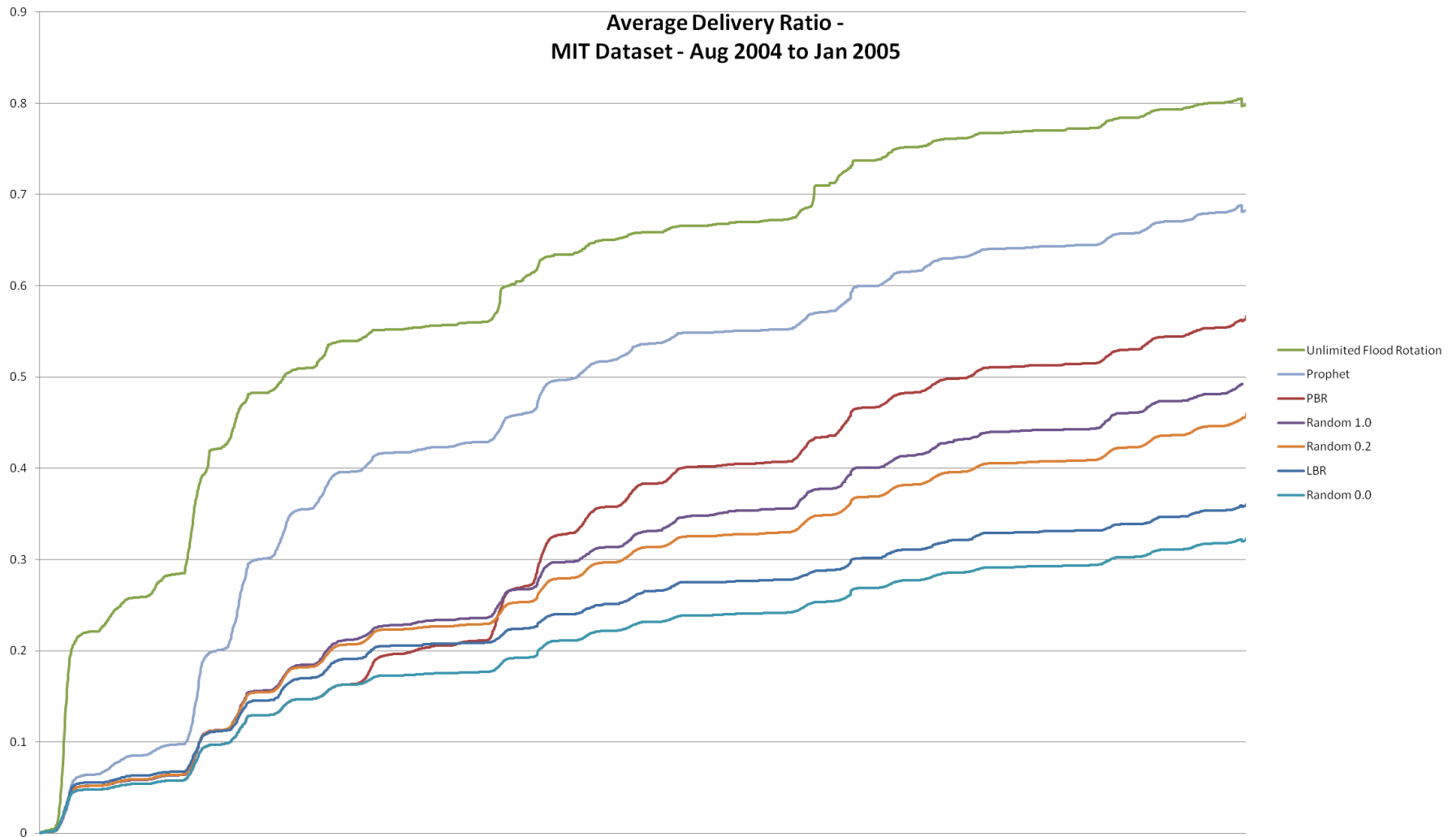
where  $\tau_{ij}$  is the time (or number of times) user  $i$  has visited the tower  $j$ ,  $p_j$  is the popularity of tower  $j$  and  $c$  is a parameter which tunes the importance of user mobility

	T1	T2	T3	T4
U1	10	0	0	0
U2	0	6	6	0
...	...	...	...	...
Total Score	100	80	30	20

*On encountering another node,  
for each message do:*

```
if node is destination node  
    pass message  
else if node has higher rank  
    pass message  
else  
    keep message
```

# Simulation Results



28 day time window, at 7 day intervals, (18 runs)

# Why does LBR perform so poorly?

- Different communities visit different places?
- Highly mobile individuals do not see everyone?
- Different carriers?



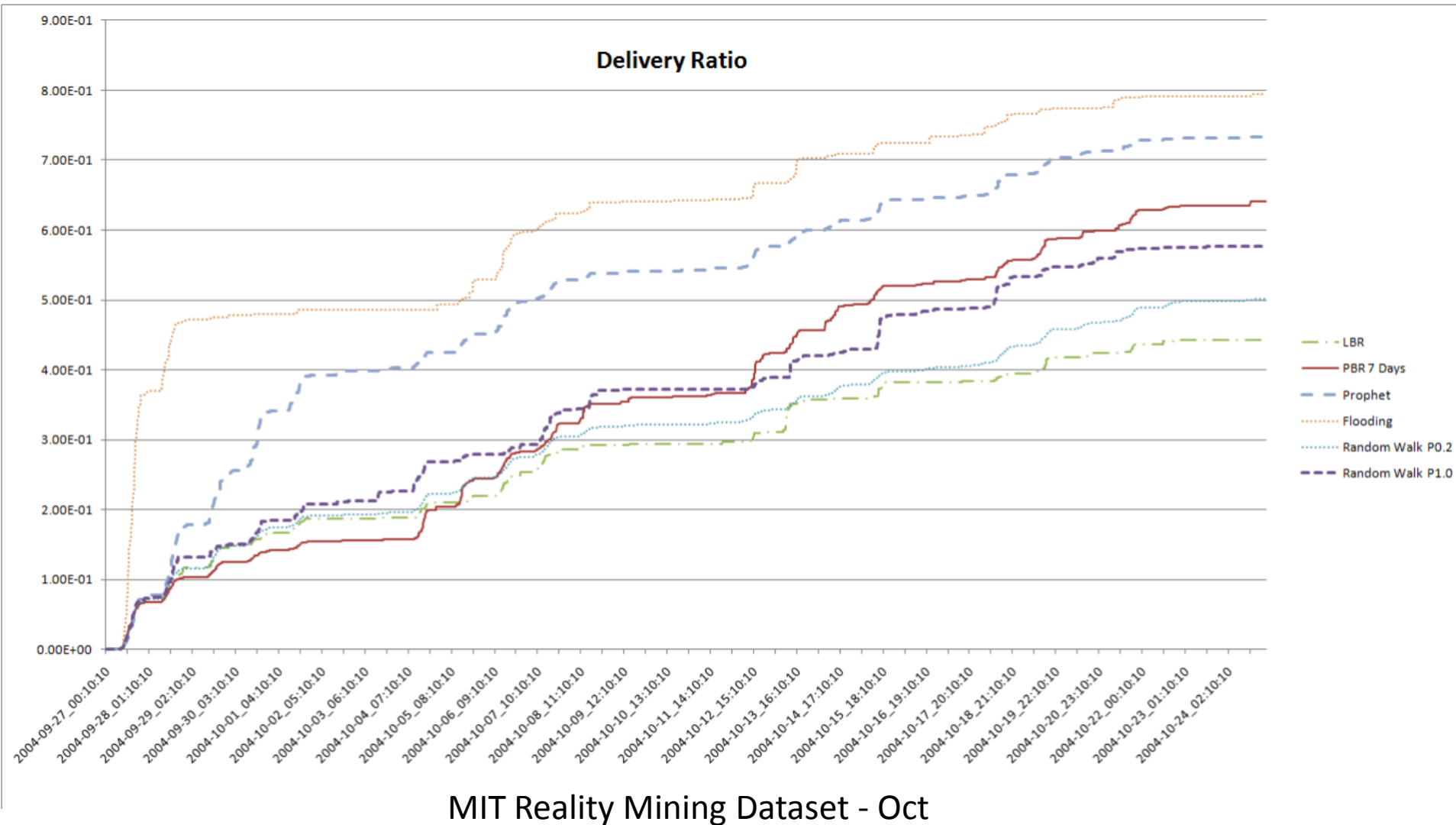
# Improvements to LBR?

- Consider only popular locations
- Time ordering of visits for future location prediction
- Detect communities based on places visited
- Combine with PBR

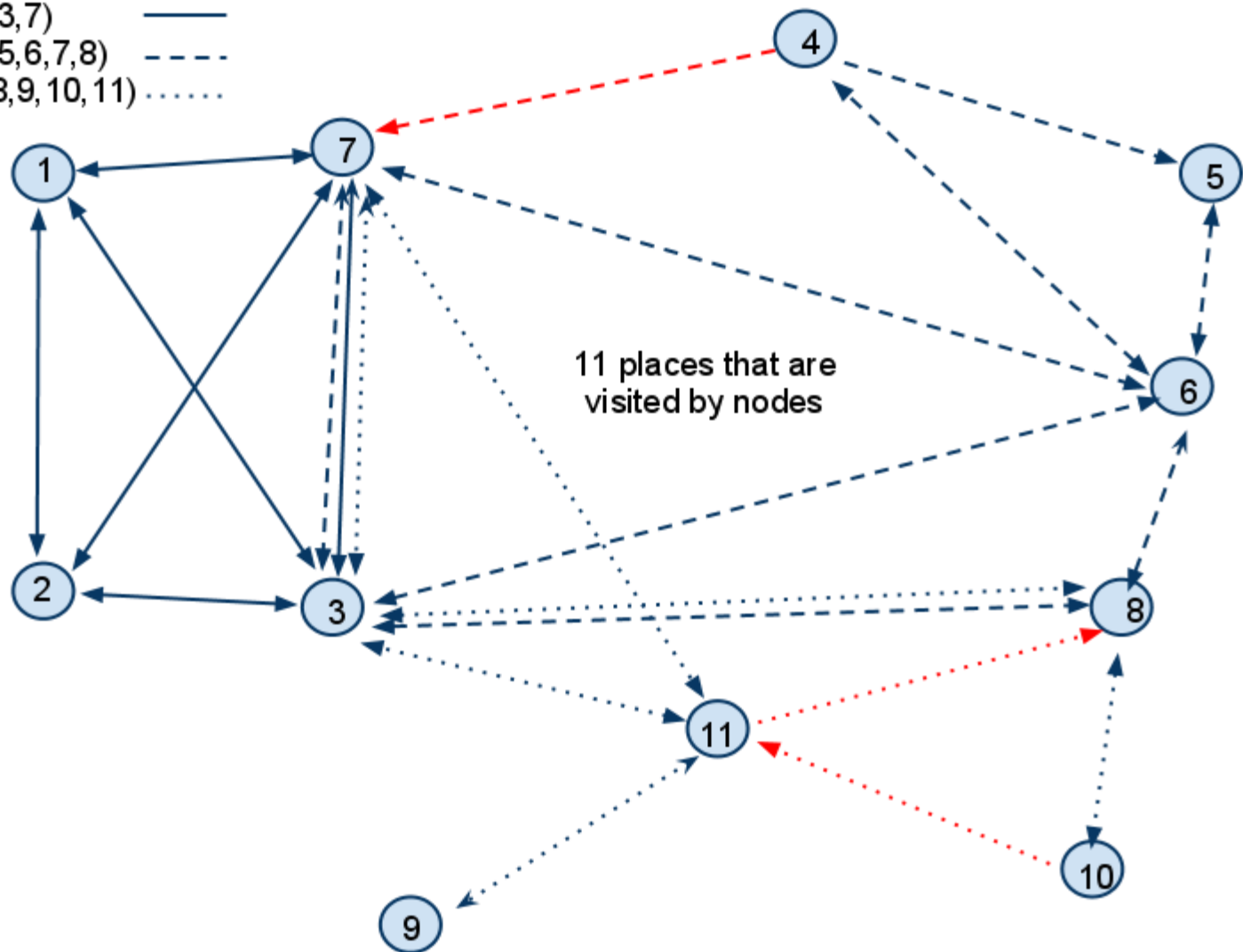
# Questions/Ideas?



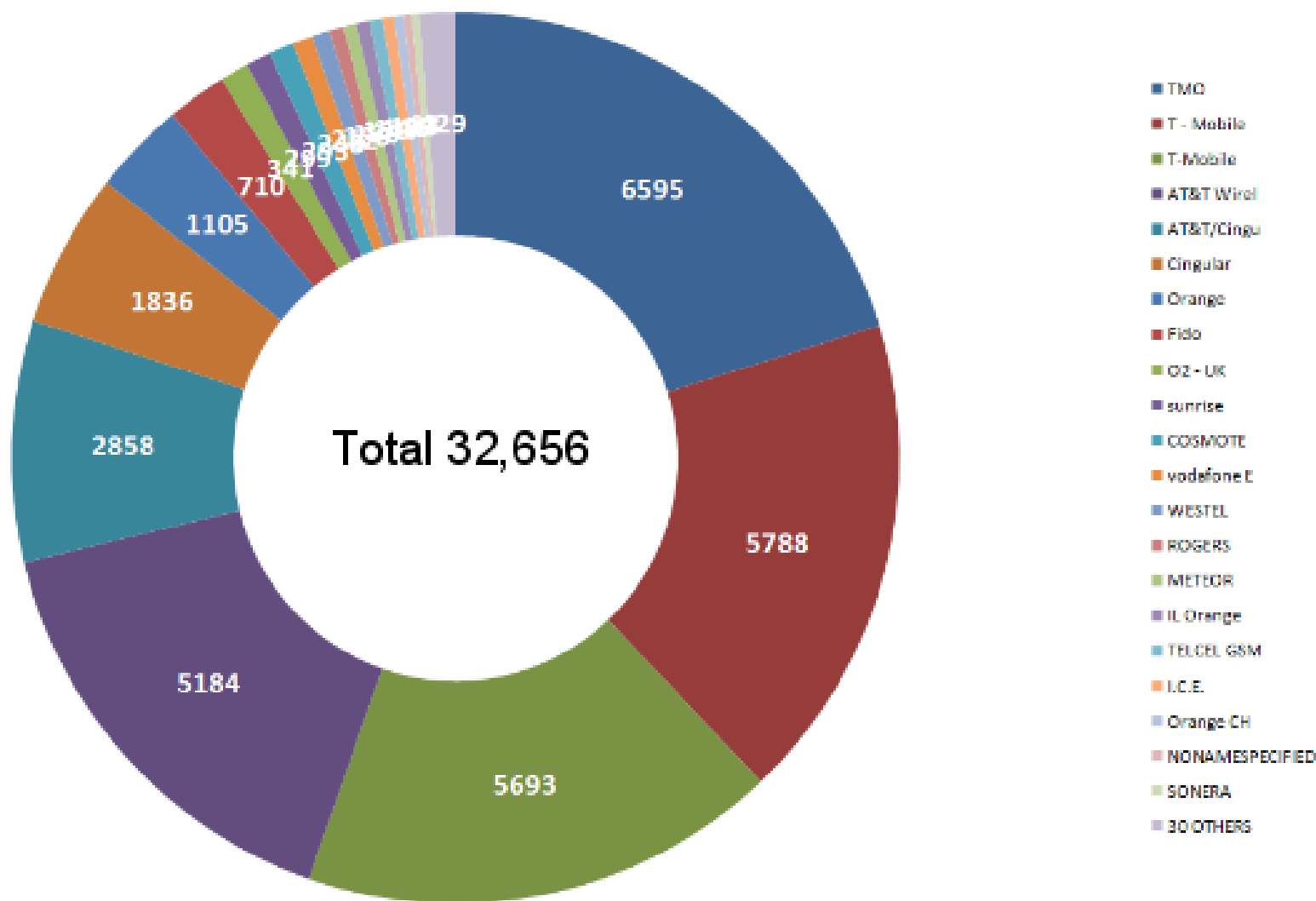
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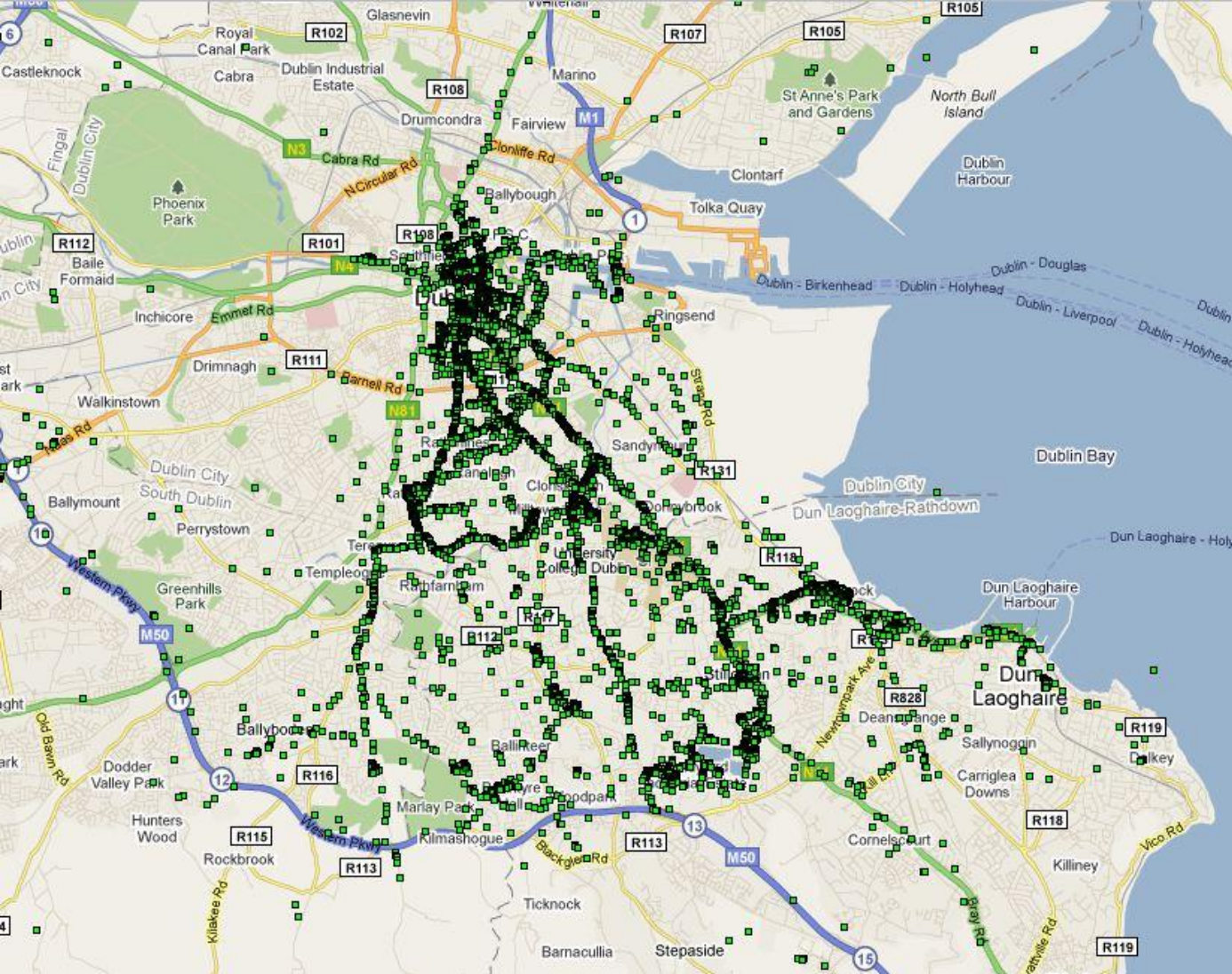


A = (1,2,3,7) ———  
B = (3,4,5,6,7,8) - - - -  
C = (3,7,8,9,10,11) ·····

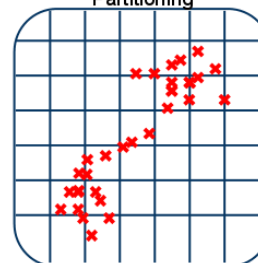


## Number of towers recorded for each carrier

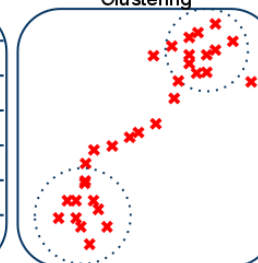




Regular Partitioning



Global Clustering



Individual Clustering

