

# Khare-a-Ride

## A Search optimized Peer-to-Peer Dynamic Ride Sharing System

Koyel Mukherjee

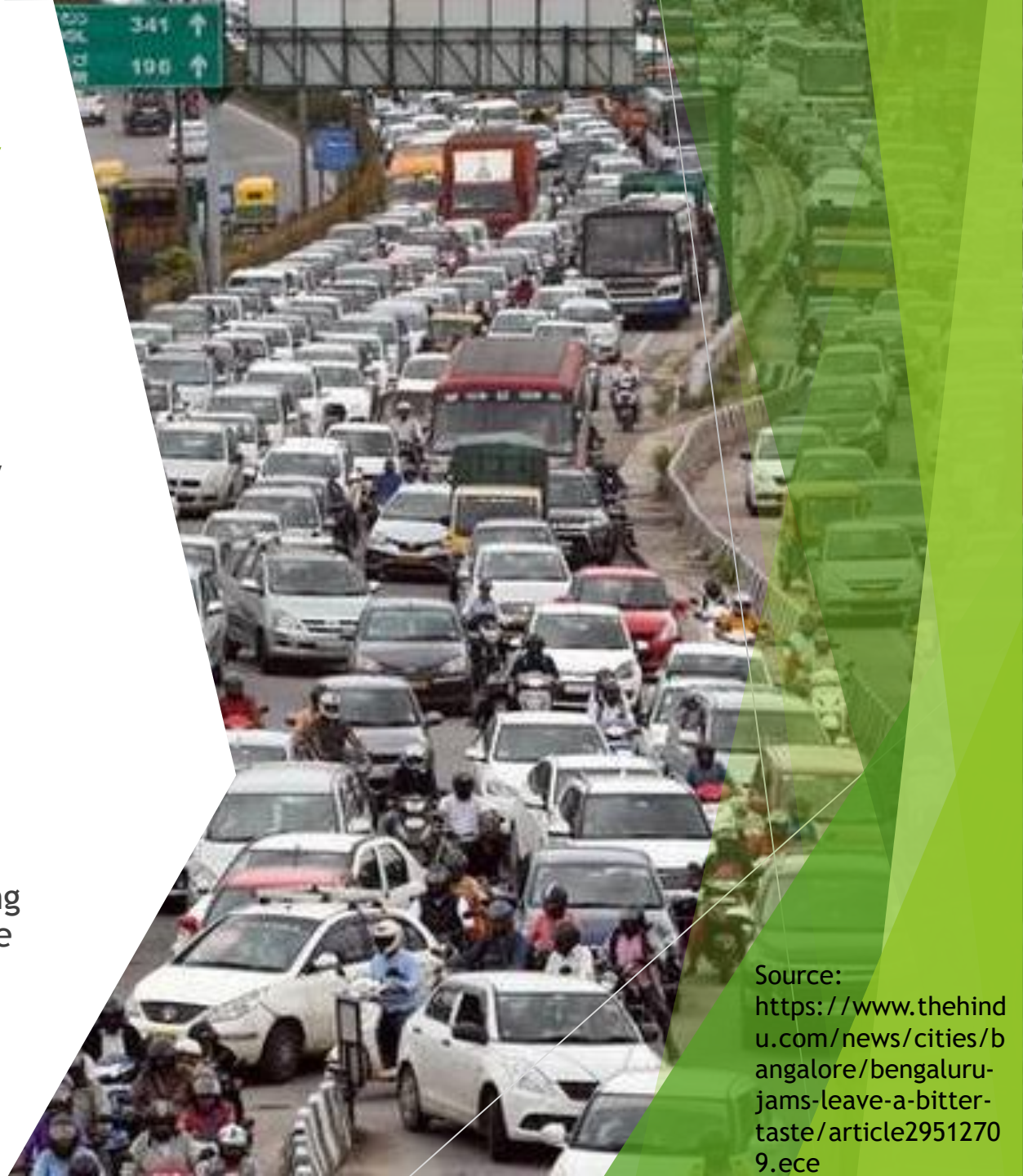
Advisory Research Scientist

IBM Research - India

(This work was done while the author was a Senior Research  
Scientist, in Xerox Research Center India, 2015-2016.)

# Peer-to-Peer Ride Sharing

- ▶ Ride sharing: a sustainable, environmentally friendly mode of commute.
- ▶ Not many platforms for facilitating peer-to-peer ride sharing.
- ▶ Dynamic scenario?
- ▶ Integrated with multi-modal trip planners?
- ▶ Extend the friendly neighbourhood carpooling to a dynamic, large-scale system and platform.



Source:  
<https://www.thehindu.com/news/cities/bangalore/bengaluru-jams-leave-a-bitter-taste/article29512709.ece>

# Khare-a-Ride



A dynamic, scalable ride sharing systems for peer-to-peer ride sharing.



Search optimized, ensures accuracy and quality considerations and constraints e.g. detour and walking preferences.



Integrated with Multi-Modal Trip Planner.



Novel region discretization and indexing for scalable and dynamic ride searching and matching



Learning and Optimizing commuter satisfaction in grouping.



Fairness in Cost Sharing.

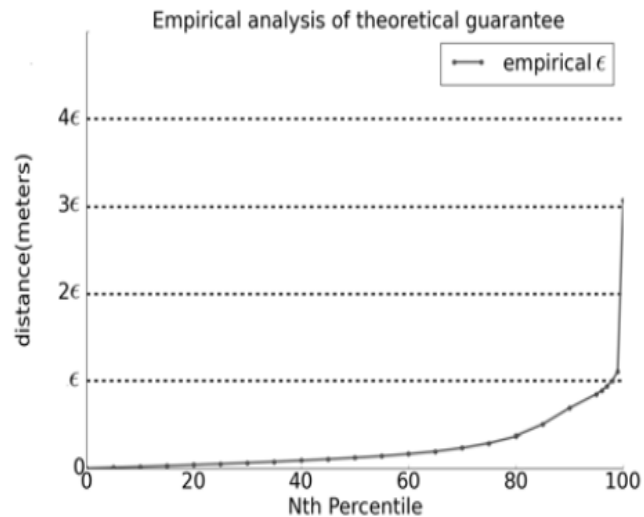
# Hierarchical Region Discretization

- ▶ Three-tiered region discretization: clusters, landmarks and grids.
- ▶ Efficient in-memory indexing for maintaining, updating and efficiently retrieving ride/request spatio-temporal information.
- ▶ Optimized and scalable ride search in real-time
- ▶ Additive approximation guarantee on the total detour and walking distances.
- ▶ Any point location, given by a latitude and a longitude uniquely mapped to a grid, a landmark and finally a cluster, *without any ambiguity*.
- ▶ Hierarchy: region → clusters → landmarks → grids → point locations, with cross relations across the levels.

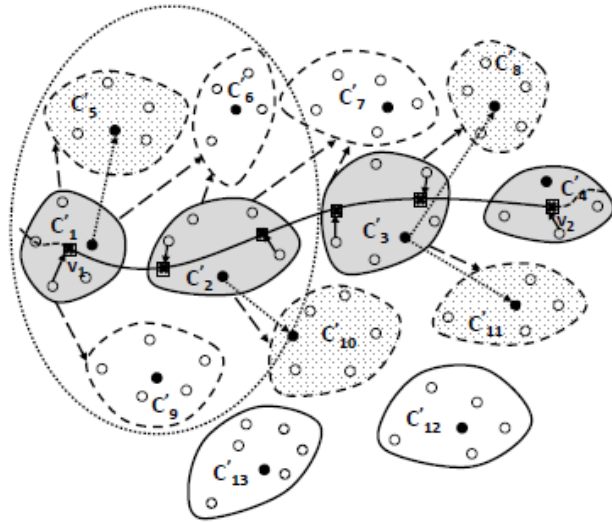
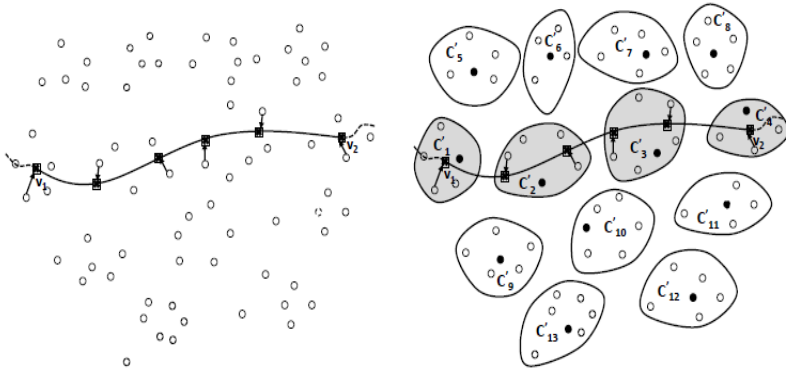
[Xhare-a Ride: A Search Optimized Dynamic Ride Sharing System with Approximation Guarantee, T. Rajasubramaniam, K. Mukherjee, G. Raravi, A. Metrewar, N. Annamaneni, K.Chattopadhyay, ICDE 2017]

# Cluster Optimization

- ▶ Cluster: a collection of landmarks, such that no pair of landmarks in a cluster are more than a specified driving distance away.
- ▶ Cluster Minimization: NP-hard
- ▶ Greedy Search: A bicriteria algorithm that finds a solution  $(k_{OPT}, 4\delta)$  corresponding to  $OPT(k_{OPT}, \delta)$ .
- ▶ Algorithm used Greedy 2-approx for Metric k-Center algorithm as a subroutine.
- ▶ Potential Rides  $\langle r, t \rangle$ : associated with each cluster.



# Ride Representation



- ▶ *Ride*:  $\langle \text{source, destination, departure time, seats} \rangle$
- ▶ *Route*: shortest path (unless alternate route specified)
- ▶ *via-points*: the point locations through which a ride passes;
- ▶ *Segments*: the portion of the route between a pair of via-points.
- ▶ *Pass through clusters*: the clusters through which the ride passes in a segment
- ▶ *Reachable clusters*: the clusters that the ride can reach without violating the detour limit.

# Dynamic Search and Update

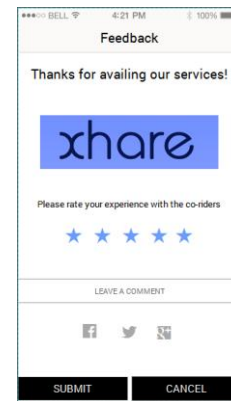
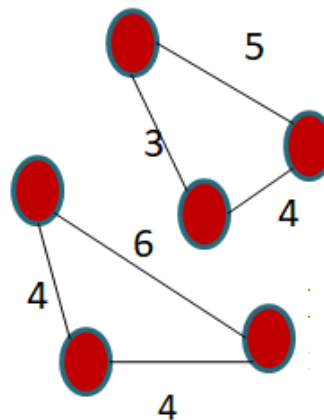
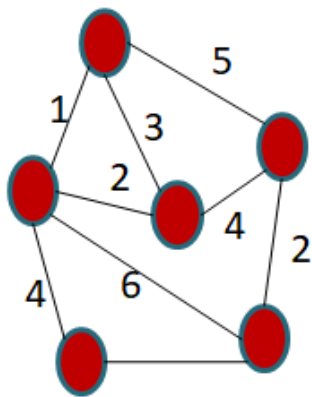
- ▶ Ride Search:
  - ▶ Identify the grid of src.
  - ▶ Find set of *walkable clusters* associated with this grid.
  - ▶ For each cluster from the list of *potential rides*, return those with estimated time of arrival in  $C = \text{departure time}$ .
  - ▶ Do the same for dest.
- ▶ Ride Tracking:
  - ▶ Once ride crosses a pass-through cluster, mark that cluster and associated reachable clusters as obsolete for ride;
  - ▶ Remove the ride from the potential rides of those clusters;
  - ▶ Delete obsolete clusters from list of pass-through clusters.
- ▶ Ride Booking:
  - ▶ Update route.
  - ▶ Update constraints.
  - ▶ Update pass-through clusters and potential rides of clusters.



# Commuter Group Satisfaction

- ▶ Different commuters have different pairwise compatibility.
- ▶ For matching rides and requests, it becomes a resource allocation problem: Resources need to be partitioned into  $k$  groups of size  $\leq m$ .
- ▶ We would like to create happy groups!
- ▶ How do we learn Compatibility and Ensure Maximum Group wise happiness?

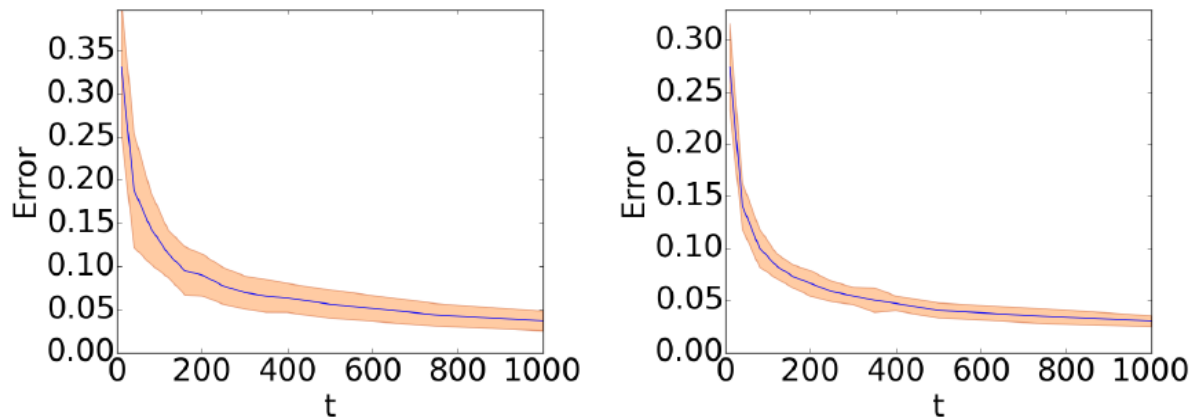
[A. Rajkumar, K. Mukherjee and T. Tulabandhula, Learning to Partition using Score Based Compatibilities, AAMAS 2017]





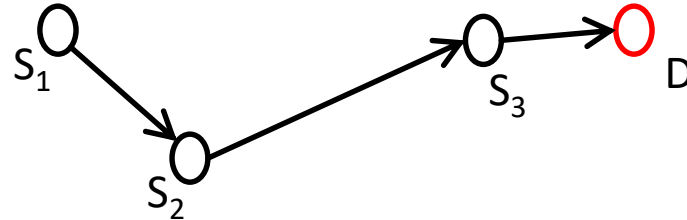
# Commuter Group Satisfaction

- ▶ Partitioning, maximizing different notions of happiness: NP-hard.
- ▶ We show hardness of approximation results.
- ▶ Under a score-based pairwise structure:
  - ▶ P-time algorithms and a  $\frac{1}{2}$  approximation algorithm for different objectives.
  - ▶ Algorithm LearnOrder: adaptively learns the ordering of the score vector, sufficient for grouping.



Performance of LearnOrder on Random Graph and sampled from Facebook<sup>9</sup> friendship graph using Jaccard similarity coefficient of features as scores. .

# Fair Cost Sharing and Routing



Total cost =  $(S_1S_2 + S_2S_3 + S_3D)$

Split cost evenly in every leg?  $\left\{ \left( S_1S_2 + \frac{S_2S_3}{2} + \frac{S_3D}{3} \right), \left( \frac{S_2S_3}{2} + \frac{S_3D}{3} \right), \left( \frac{S_3D}{3} \right) \right\}$

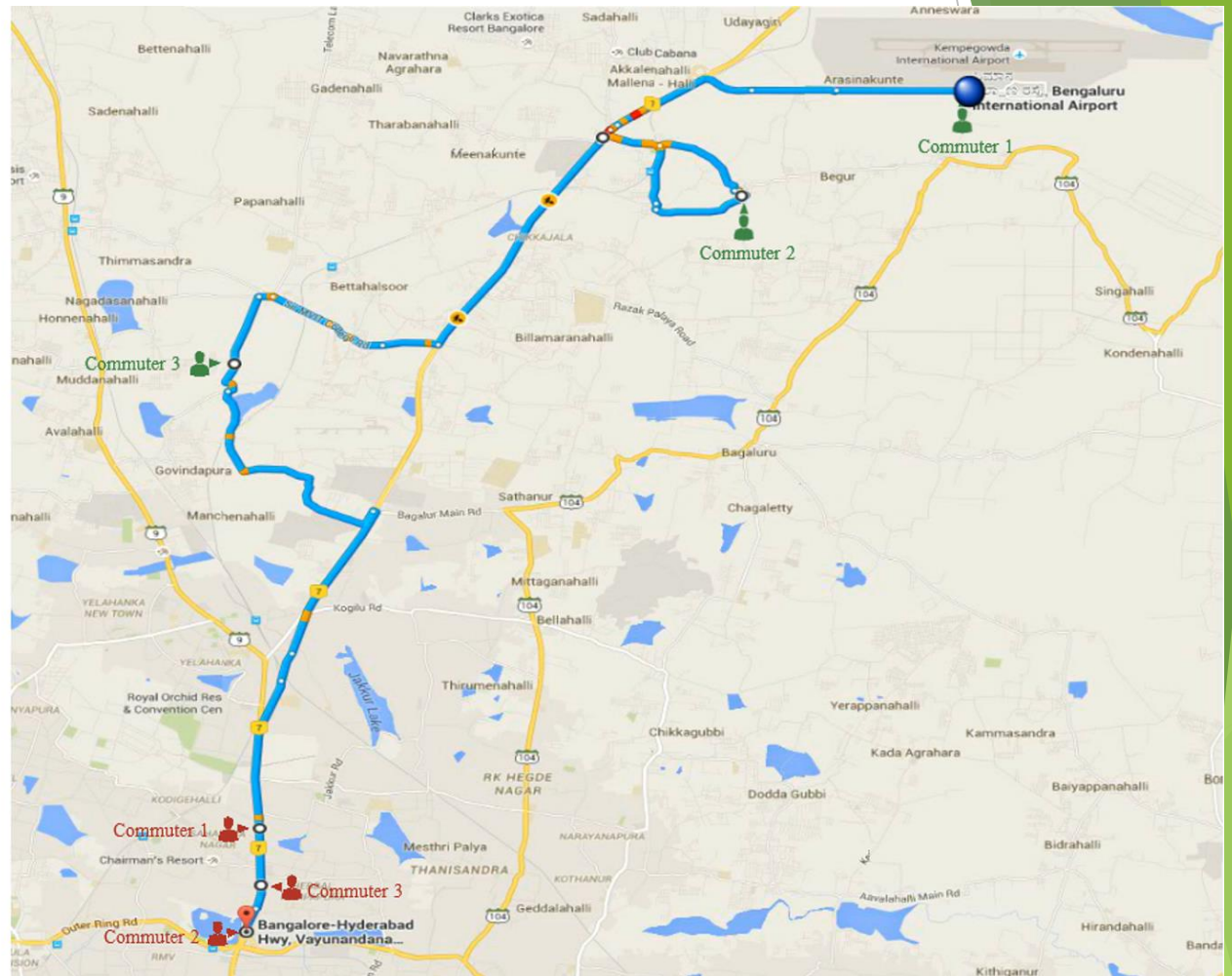
**$S_1$  taking a huge detour and potentially paying for it!**

- Passengers **compensate** each other for the detour caused inconveniences.
- **Fair and rational:** estimated costs decrease every time there is new pick-up.

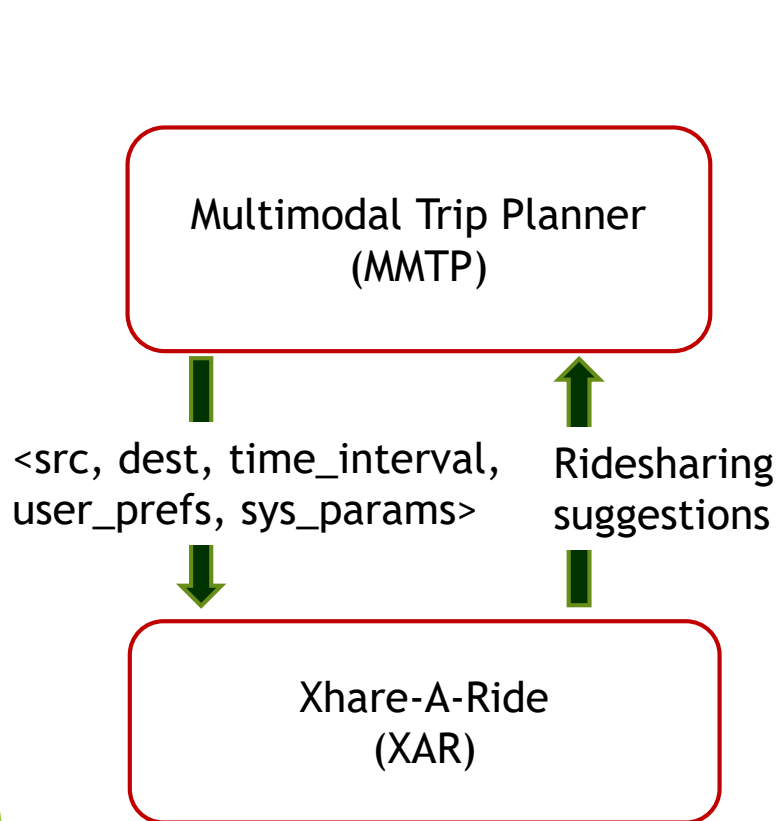
$$S_{i-1}S_i + S_iD - S_{i-1}D \leq \frac{S_iD}{i} \quad \text{for } i = 2, 3, \dots, C$$

These constraints reinforce intuition: The permissible detour keeps decreasing with the number of passengers, and the closer you are to the destination, the smaller it is.

# Fair Cost Sharing and Routing



# Modes of Interaction with Multi-modal Trip Planner



## Aider Mode

- Makes an infeasible trip plan feasible.

## Enhancer Mode

- Makes a trip plan “better”

## Bootstrapping

- Getting started

# Conclusion

- ▶ Xhare-a-Ride: dynamic peer-to-peer ride sharing system integrated with a multi-modal trip planner.
- ▶ Novel, hierarchical geographical representation and in-memory indexing for dynamic update and accurate, optimized search.
- ▶ Several associated research threads: learning and optimizing commuter satisfaction, fair cost splitting, shared location tracking, approximation guarantees with layered system design.
- ▶ 4 Top-Tier Publications, 5 USPTO patents.
- ▶ Collaboration with external commercial partners.

# Thank You!

[kmukherj@in.ibm.com](mailto:kmukherj@in.ibm.com)