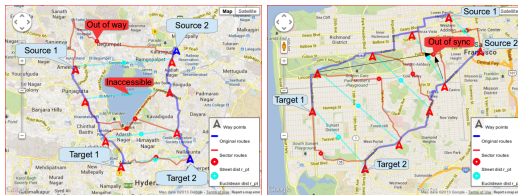


1. Introduction

- ▶ **Goal:** Given the initial and target locations for two agents, find the distance optimal rendezvous location on street network with minimum number of queries to the server.
- ▶ **Example Scenarios:**
 - ▷ meet a friend on your way from office to home
 - ▷ rendezvous between automated taxis for load balancing

2. Challenges

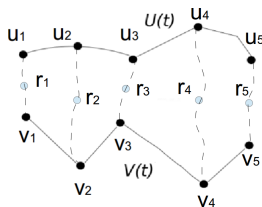
- ▶ **Database query challenge:**
 - ▷ Minimize number of queries to the server
- ▶ **Rendezvous challenges:**
 - ▷ Minimize the total travel distance between the agent's original path and rendezvous location
 - ▷ Minimize waiting time at rendezvous location
 - ▷ Find accessible rendezvous location



Bad examples of rendezvous location

3. Overview

- ▶ **Agents:** A_1 and A_2
- ▶ **Uniformly discretized way points along the agents' paths:** $U(t) = \{u_1, u_2, \dots, u_n\}$ and $V(t) = \{v_1, v_2, \dots, v_n\}$
- ▶ **Potential rendezvous locations are selected as mid points along the paths joining the way points:** $R = \{r_1, r_2, \dots, r_n\}$



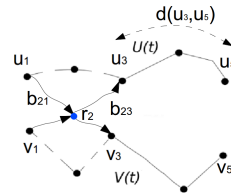
- ▶ **Objective:** Find the rendezvous location with minimum number of queries to the server such that:

$$r^* = \operatorname{argmin}_{r_i} D(r_i, j)$$

- ▶ $D(r_i, j)$ returns the minimum path length $p_{i,j}^*$ for a given rendezvous point r_i and no. of way points skipped j

$$p_{i,j}^* = \min_k p_{i,k}$$

$$p_{i,k} = b_{i,k} + b_{i,(j+k+1)} + d(u_i, u_k) + d(u_{(j+k+1)}, u_n)$$



- ▶ **Types of queries to find distance optimal rendezvous location:**

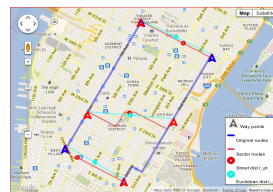
- ▷ **Naive:** Query total number of possible paths $O(n^3) = \frac{n(n-1)}{2} * |R|$
- ▷ **Smart:** Query only bridge distances $b_{i,k}$ and $b_{i,(j+k+1)}$
- ▷ **Euclidean:** Free queries
- ▷ **Hybrid:** Euclidean + Smart queries

4. Rendezvous Algorithm

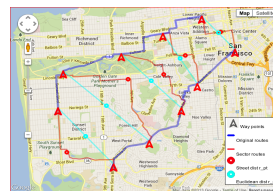
- ▶ **Propose hybrid algorithm to combine Euclidean and street distance:**
 1. Find all path lengths in Euclidean space
 2. Sort them in ascending order
 - ▷ If the shortest path p^* is not expressed in street network distance then make it so and repeat step 2
 - ▷ Else p^* is the true optimal path and the corresponding rendezvous point r^* is the distance optimal rendezvous location

5. Results

Good examples of Euclidean approximation



New York

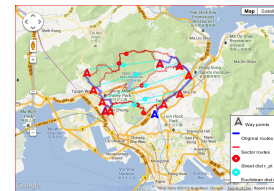


San Francisco

Bad examples of Euclidean approximation

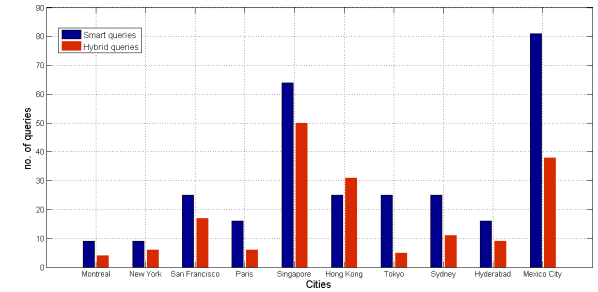


Montreal



Hong Kong

- ▶ Comparing number of **smart** and **hybrid** queries for 10 cities



- ▶ Hybrid algorithm saved **40%** queries on average compared to the smart queries while obtaining a **distance optimal solution**

- ▶ Rendezvous locations obtained using hybrid algorithm were all **accessible**

Cities	Euclidean distance (km)	Real distance (km)	Hybrid distance (km)	Naive	Smart	Hybrid	% Saved	Euclidean rp accessible?
Montreal	2.8	3.4	3.4	27	9	4	55.55%	No (Park)
New York	2.9	3.3	3.3	27	9	6	33.33%	Yes
San Francisco	6.0	7.4	7.4	125	25	17	32%	Yes
Paris	7.3	8.0	8.0	64	16	6	62.50%	Yes
Singapore	12.9	15.0	15.0	512	64	50	21.87%	Yes
Hong Kong	6.9	11.5	11.5	125	25	31	-24%	No (Forest)
Tokyo	8.3	9.2	9.2	125	25	5	80%	Yes
Sydney	7.9	9.0	9.0	125	25	11	56%	No (Harbor)
Hyderabad	5.5	6.9	6.9	64	16	9	43.75%	No (Lake)
Mexico City	19.2	21.4	21.4	729	81	38	53.08%	Yes
Average	7.9	9.5	9.5	192.3	29.5	17.7	40%	—

6. Conclusion and Future Work

- ▶ **Conclusion:**
 - ▷ Leveraged the property that **Euclidean distance is the best first approximation** for real street distance
 - ▷ **Proposed a hybrid algorithm** for efficient rendezvous by combining Euclidean and real street distances
 - ▷ **Reduced query cost** to the server using the proposed hybrid algorithm
- ▶ **Future Work:**
 - ▷ Online and real-time implementation of the hybrid algorithm
 - ▷ Scale the current implementation for multiple agents

7. References

- ▶ **M. Meghjani and G. Dudek** "Multi-Agent Rendezvous on Street Networks", ICRA 2014
- ▶ **M. Meghjani and G. Dudek** "Multi-Robot Exploration and Rendezvous on Graphs", IROS 2012
- ▶ **Bast et al.** "Fast routing in very large public transportation networks using transfer patterns", Algorithms – ESA, 2010
- ▶ **Papadias et al.** "Group nearest neighbor queries", International Conference on Data Engineering, 2004