#### Approximation Algorithms for Conflict-Free Vehicle Routing

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### **CFVRP Problem**

- Undirected graph of stations and roads
- Vehicles(k):
  - Source-Destination stations
- Discretized time
  - At each timestep every vehicle waits to the current position or moves to a neighbor station
- Conflicts:
  - No vehicles traverse the same edge at the same timestep
  - $^\circ~$  No vehicles are on the same station at a certain timestep
- Goal:
  - Conflict-free routing with minimum makespan(total routing time)



# **Sequential Routing Approaches**

- Simple approach:
  - Sequentially send one vehicle after another on the shortest path to its destination
  - Makespan: O(k\*L)
  - L: maximum s-t distance for vehicles
  - L<=OPT
  - O(k)-approximation
  - No efficient algorithm substantially beats this approach



# **Sequential Routing Approaches**

#### Improved approach:

- Greedy direct sequential routing
- Greedy: Consider the vehicle in a given order
- Direct: Vehicles never stop while advancing to their destination
- For each vehicle find the earliest departure time that has no conflict with previously routed vehicles.
- No theoretical improvements
- O(k)-approximation



# Complexity

- CFVRP is NP-hard even on paths
- Choosing a good ordering for greedy direct routing is also NP-hard
- Sub-linear in k approximation algorithms are known for grids
  - Takes advantage of the existence of two disjoint alternative paths for each s-t path
- This paper presents:
  - 4OPT+k approximation for trees
  - $\circ O(\sqrt{k})$ -approximation for general graphs
  - $\circ O(\log^3(k))OPT + k$  randomized approximation algorithm based on tree embeddings



## **Tree Approximation**

- DFS numbering on the tree nodes
- Increasing- Decreasing vehicles:
  - Increasing if label of destination is larger than the label of origin
  - Bending node: the node of the path that is closer to the root
  - in-label: last node before the bending node
  - out-label: first node after the bending node





## **Tree Approximation**

- Sort vehicles using the following priorities:
  - Increasing vehicles have priority over decreasing ones
  - Among two increasing vehicles the higher out-label has priority
  - Among two decreasing vehicles the lower in-label has priority
  - Ties are broken using an arbitrary fixed vehicle ordering
- Apply greedy sequential routing using the above ordering
  - Makespan: 4L+k



#### Proof

There exists a direct routing with at most 4L+k makespan

- $^{\circ}$  k<sup>+</sup>: number of increasing vehicles
- $^{\circ}$  k<sup>-</sup> : number of decreasing vehicles
- Examine vehicles using the ordering
  - $^{\circ}~$  The first vehicle has passage time from bending node: L
  - The second: L+1
  - •
  - $^{\circ}$  The last increasing: L+k<sup>+</sup>-1
  - $^{\circ}$  If this is conflict free all increasing vehicles can be routed with: 2L+k<sup>+</sup>-1
  - $^{\circ}\,$  The same can be done for the decreasing leading to total makespan 4L+k



#### Proof

- We will show that the previous routing is conflict-free
- Let  $\pi$ ,  $\psi$  be two vehicles and  $\psi$  has higher priority
  - ° Case 1:  $\pi$ ,  $\psi$  don't share any node: no conflict
  - ° Case2:  $\pi$ ,  $\psi$  share only one node v
    - $\circ~$  v is the bending node of at least one of  $\pi,\,\psi$
    - $\circ~\psi$  passes first from v
  - $^\circ~$  Case 3:  $\pi,\psi$  use common subpath in the same direction
    - v the smallest node in the subpath
    - $\,\circ\,\,$  v is the bending node of at least one of  $\pi,\,\psi$
    - $\circ$   $\psi$  passes first from v
  - $^\circ~$  Case 4:  $\pi,\psi$  use common subpath in opposite directions
    - v the smallest node in the subpath
    - $\circ$   $\pi$ ,  $\psi$  can't bend in the subpath(increasing-decreasing)
    - $^\circ~\psi$  passes first from v
    - $\circ ~\psi$  leaves common path before  $\pi$  enters it



## **Hot Spot Routing**

#### General graphs

- Congestion: maximum number of vehicles that pass from a node
- Dilation: length of the longest path
- Congestion, dilation = O(OPT)
- Generate paths with low congestion and dilation
  - Use of Sinivasan and Teo algorithm
- For each v if there are more than  $\sqrt{k}$  vehicles not routed that pass from v
  - Find the shortest path tree routed at v
  - Use TreeRouting
- Route remaining vehicles using greedy direct sequential routing



## **Hot Spot Routing**

- Approximation  $O(\sqrt{k}OPT)$
- At most  $\sqrt{k}$  TreeRouting steps
  - Each TreeRouting takes O(C+D)
  - The first phase is  $O(\sqrt{k}OPT)$
- Second phase(greedy routing)
  - $\circ \pi$  any of the remaining vehicles(not routed in the first phase)
  - For every node in the path of π there are at most  $\sqrt{k}$  previous routed vehicles.
  - ° This routing can stall  $\pi$  at most O(D $\sqrt{k}$ )
  - The second phase is  $O(\sqrt{k} OPT)$



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## **Low-Strech Routing**

- ► Find a collection of *O*(*polylog*(*k*)) trees such that
  - $^\circ~$  each s-t path in T is at most a  $\mathit{O}(\mathit{polylog}(k))\text{-}\mathsf{factor}$  larger than the shortest path in G
  - Assign vehicles to trees
  - Use TreeRouting for each tree
- Randomized algorithm to find trees
  - Transform G=(V,E) to H(W,F) with size  $O(k^2)$
  - Each vehicle has the same s-t distance on both graphs
  - Delete all nodes, edges of G that don't belong to shortest s-t paths
  - Every path of G is replaced by an edge in H if it doesn't contain another node of H
  - A random spanning tree of H has:

$$\mathbf{E}\left[d_{H[T]}(v,w)/d_H(v,w)\right] = O\left(\log^2|W|\right)$$



### **Low-Strech Routing**

- Select p=2log(k) random spanning trees of H
- Find the respective trees (T) of G
- With probability 1-1/k there exists one tree T such that:

 $d_{G[T]}(s_{\pi}, t_{\pi})/d_G(s_{\pi}, t_{\pi}) = O(\log^2 k)$ 

Each TreeRouting needs a makespan of:

 $4\max\{d_{G[T_j]}(s_{\pi}, t_{\pi}) \mid \pi \in \Pi, i(\pi) = j\} + k_j = O(\log^2 k)L + k_j$ 

The total makespan is:

$$O(\log^2 k)pL + \sum_{i=1}^p k_j = O(\log^3 k)L + k$$



#### Ερωτήσεις?

