## Spatio-Temporal Routing Algorithms

 Panel on Space-Time Research in GIScience Intl. Conference on Geographic Information Science 2012Shashi Shekhar<br>McKnight Distinguished University Professor<br>Department of Computer Sc. and Eng., University of Minnesota

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## Dynamic Nature of Transportation Network



Traffic during non-rush hours



Traffic during Rush hours

ECT Dill


## Implication of Dynamic Nature

## ©lye Nett Hork ©imes

U.P.S. Embraces High-Tech Delivery Methods (July 12, 2007)

By "The research at U.P.S. is paying off. .......- saving roughly three million gallons of fuel in good part by mapping routes that minimize left turns."


## Problem 1: Time-dependent network models

$\square$ Input:
a) A Spatial Network
b) Temporal changes of the network topology and parameters.
$\square$ Output: A model that supports efficient correct algorithms for computing the query results.
$\square$ Objective : Minimize storage and computation costs.

- Constraints:
(i) Predictable future
(ii) Changes occur at discrete instants of time,
(iii) Logical \& Physical independence,


## Challenges in Representation

- Conflicting Requirements
- Expressive power
- Storage efficiency
- New Semantics for network concepts
- Lagrangian shortest paths
$\square$ Time dependence of shortest paths
- Best start-time paths
- Violates assumptions behind algorithms
- Prefix optimality, stationary ranking of alternative paths
- Dijkstra's, A*, Dynamic Programming


## Representations of (Spatio-)temporal Networks

(1) Snapshot Model 「Guting 04〕
Node: N. Edge: Travel time



(2) Time Expanded Graph (TEG) [Ford 65]


Holdover Edge
Transfer Edges
(3) Time Aggregated Graph (TAG) [Our Approach]

■ Attributes aggregated over edges and nodes.


Edge $\xrightarrow{\left[m_{1}, \ldots \ldots,\left(m_{T}\right]\right.} \quad \begin{gathered}m_{i} \text { - travel time at } t=\mathrm{i} \\ 6\end{gathered}$

## TAG vs. TEG: Storage Cost Comparison



## TAG compared to Related Work

- TAG has lower storage cost
- No replication of nodes and edges across time-frames
- Allows sharing/compression of time-series
- TAG leads to faster and scalable algorithms
- Smaller representation
- TAG transformations, partitions, ...
- Relative to TEG,
a Provides logical-physical independence
- Can model properties beyond travel-time


## Problem 2: ST Shortest Path Algorithms

$\square$ Input:
a) A Spatial Network
b) Time-series edge-weights.
c) An (origin, destination) pair
d) A start time
$\square$ Output: A spatio-temporal route (and schedule)
$\square$ Objective : Minimize route cost (e.g., travel-time or fuel consumed)
$\square$ Constraints:
(i) Predictable future
(ii) Changes occur at discrete instants of time,

## Challenges

## Non Stationary ranking of paths

| Time | Preferred Routes |
| :---: | :--- |
| 7:30am | Via Hiawatha |
| 8:30am | Via Hiawatha |
| 9:30am | via 35w |
| 10:30am | via 35w |

## Non FIFO Behavior

| Time | Route | Flight Time |
| :---: | :---: | :---: |
| 8:30am | via Detroit | 6 hrs 31 mins |
| 9:10am | direct flight | 2 hrs 51 mins |
| 11:00am | via Memphis | 4 hrs 38 mins |
| 11:30am | via Atlanta | 6 hrs 28 mins |
| 2:30pm | direct flight | 2 hrs 51 mins |

*Flight schedule between Minneapolis and Austin (TX)
> Violation of stationary assumption dynamic programming
$>$ Violates the no wait assumption of Dijkstra/A*

## Dealing with non-FIFO edges using Waits

Find the shortest path travel time from N1 to N5 for start time $t=1$.


|  | N | N 2 | N | N | N |
| :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | 1 | $\infty$ | 3 | 4 | 5 |
| $\infty$ | $\infty$ | $\infty$ | $\infty$ |  |  |
| 2 | 1 | $\not 2$ | 3 | $\infty$ | $\infty$ |
| 3 | 1 | 2 | $\not 2$ | 3 | $\infty$ |
| 4 | 1 | 2 | 3 | $\not 2$ | $\infty$ |
| 5 | 1 | 2 | 3 | 3 | 8 |

Dijktra's algo.: Reaches N5 at $t=8$.
Total time $=7$


Optimal path: Reach N4 at $t=3$;
Wait for $t=4$;
Reach N5 at $t=6$
Total time $=5$

## Dealing with non-stationary ranking of routes

Idea: Divide into time-intervals with stationary ranking of routes


Result is a collection of Stationary TAG.
Dynamic programming may be used within each sub-TAG!

## Summary: ST Routing Algorithms



TAG: Transform to Stationary TAG


## More ST Shortest Path Problems

| Static | Time-Variant |
| :--- | :--- |
| Which is the shortest travel time <br> path from downtown Minneapolis <br> to airport? | Which is the shortest travel time <br> path from downtown Minneapolis <br> to airport at different times <br> of a work day? |
| What is the capacity of Twin- <br> Cities freeway network to evacuate <br> downtown Minneapolis ? | What is the capacity of Twin- <br> Cities freeway network to evacuate <br> downtown Minneapolis at different <br> times in a work day? |

- New Routing Questions
- Best start time to minimize time spent on network
$\square$ Account for delays at signals, rush hour, etc.


## Dealing with new Semantics, e.g., Best start time

Identify best start-time for travel from N1 to N5., if Shortest Path is dependent on start time!!


Start at $\mathrm{t}=1$ :
Shortest Path is N1-N3-N4-N5;
Travel time is 6 units.

Node: N.
Edge: Travel time


Start at $\mathrm{t}=3$ :
Shortest Path is N1-N2-N4-N5;
Travel time is 4 units.
Best Start Time is 3

