



# **Route Planning** in Road Networks

– simple, flexible, efficient –

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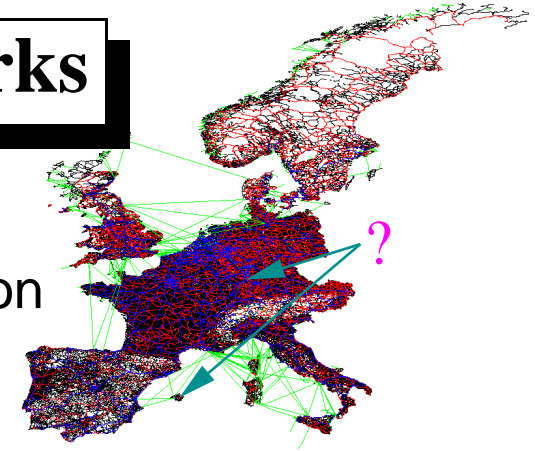
`http://algo2.iti.uka.de/schultes/hwy/`

Bertinoro, October 1, 2007



## Static Route Planning in Road Networks

**Task:** determine **quickest route** from source to target location



**Problem:** for large networks, simple algorithms are **too slow**

**Assumption:** road network **does not change**

**Conclusion:** **use preprocessed data** to accelerate source-target-queries

(research focus during the last years [ $\rightarrow$  e.g., 9th DIMACS Challenge])

$\rightsquigarrow$  **correctness** relies on the above assumption

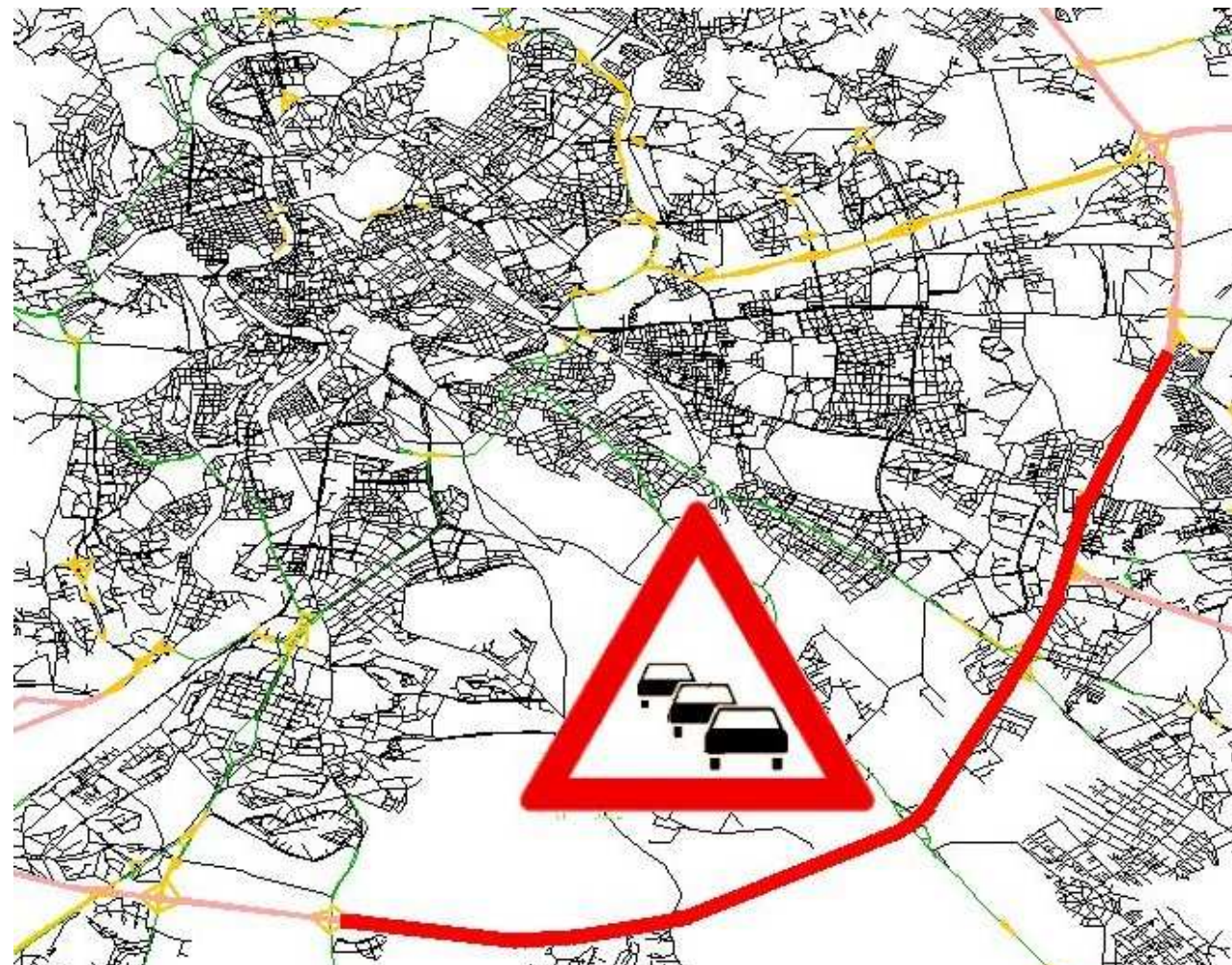


# Dynamic Scenarios

- change entire **cost function**  
(e.g., use different speed profile)



- change a **few edge weights**  
(e.g., due to a traffic jam)





## Constancy of Structure

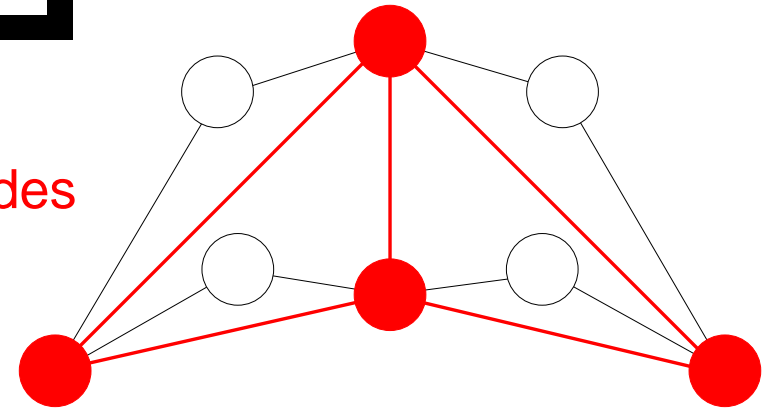
### Weaker Assumption:

- structure** of road network **does not change**  
(no new roads, road removal = set weight to  $\infty$ )  
~> **not** a significant **restriction**
  
- classification** of nodes by '**importance**' might be slightly **perturbed**,  
but **not completely changed**  
(e.g., a sports car and a truck both prefer motorways)  
~> **performance** of our approach relies on that  
(not the correctness)



# Highway-Node Routing

1. **basic concepts:** *overlay graphs*, *covering nodes*

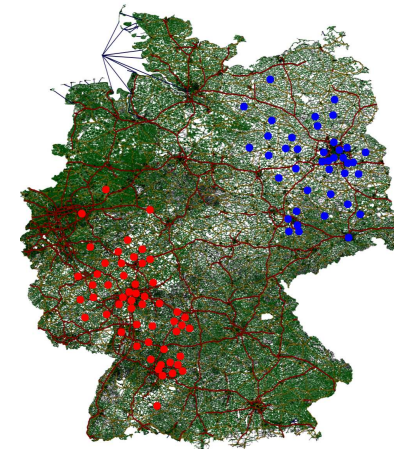
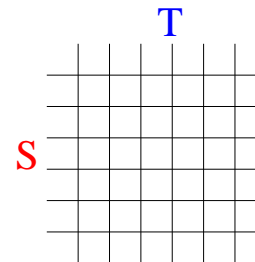


2. lightweight, efficient **static** approach

3. **dynamic** version

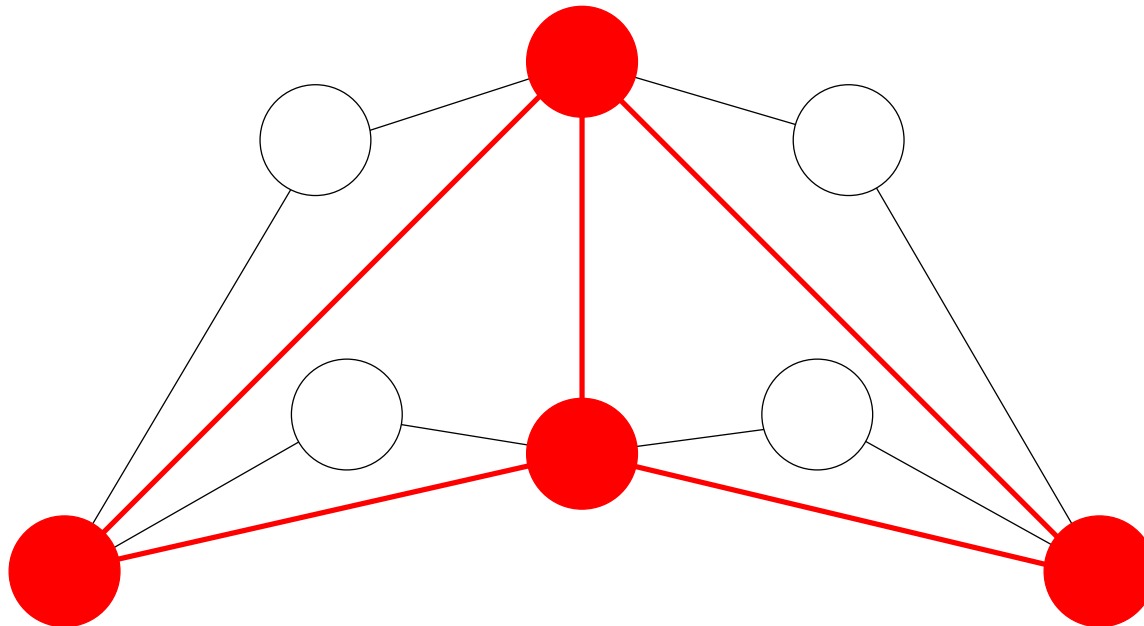


4. **many-to-many** extension





# 1. Basic Concepts

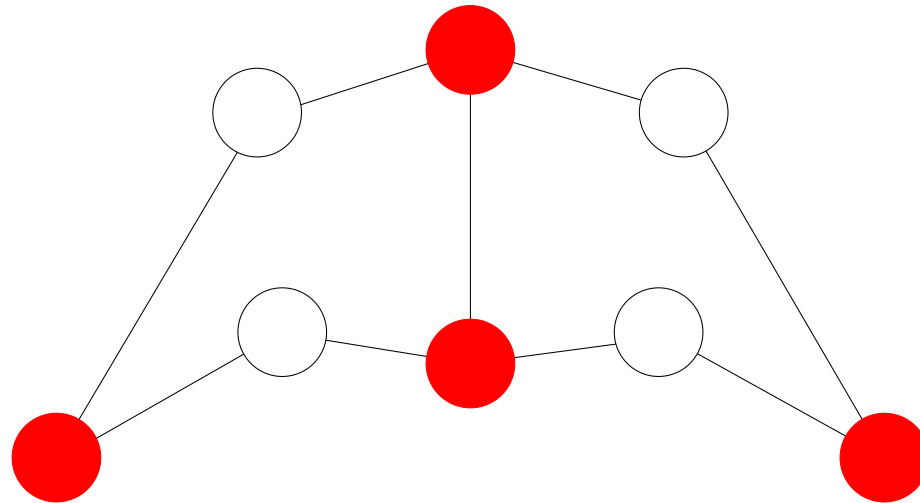




# Overlay Graph: Definition

[Holzer, Schulz, Wagner, Weihe, Zaroliagis 2000–2007]

- graph  $G = (V, E)$  is given
- select node subset  $S \subseteq V$

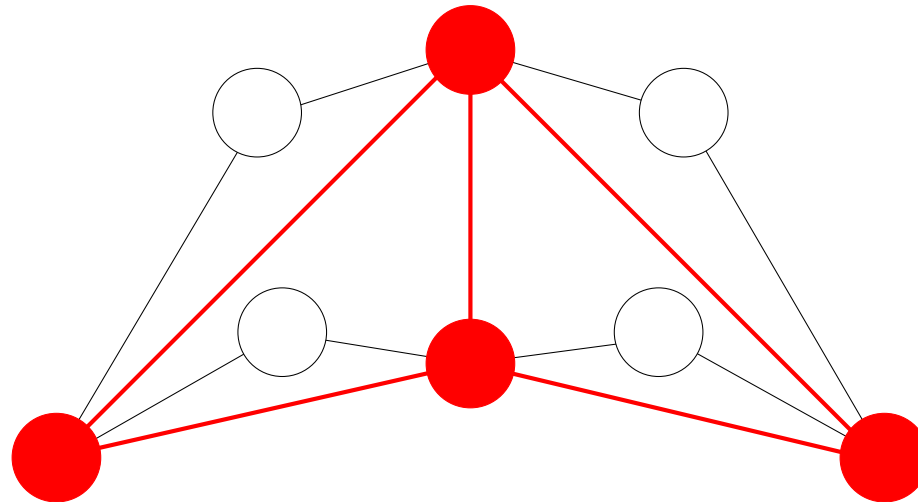




## Overlay Graph: Definition

[Holzer, Schulz, Wagner, Weihe, Zaroliagis 2000–2007]

- graph  $G = (V, E)$  is given
- select node subset  $S \subseteq V$



- overlay graph  $G' := (S, E')$

determine edge set  $E'$  s.t. shortest path distances are preserved

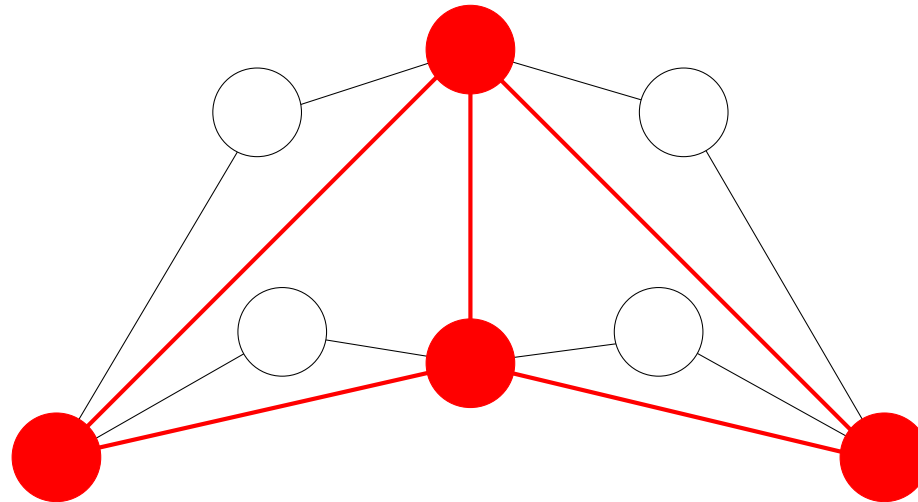




## Minimal Overlay Graph

[Holzer, Schulz, Wagner, Weihe, Zaroliagis 2000–2007]

- graph  $G = (V, E)$  is given
- select node subset  $S \subseteq V$



- minimal overlay graph  $G' := (S, E')$  where

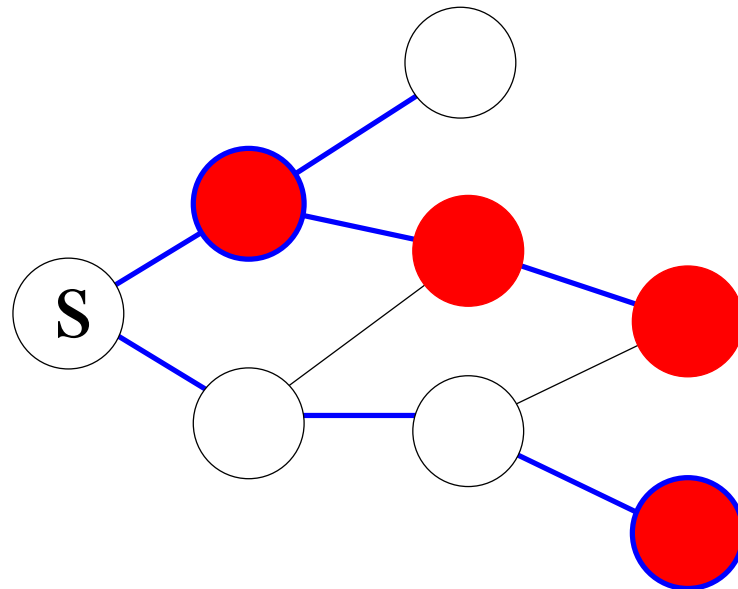
$$E' := \{(s, t) \in S \times S \mid \text{no inner node of the shortest } s\text{-}t\text{-path belongs to } S\}$$



# Covering Nodes

## Definitions:

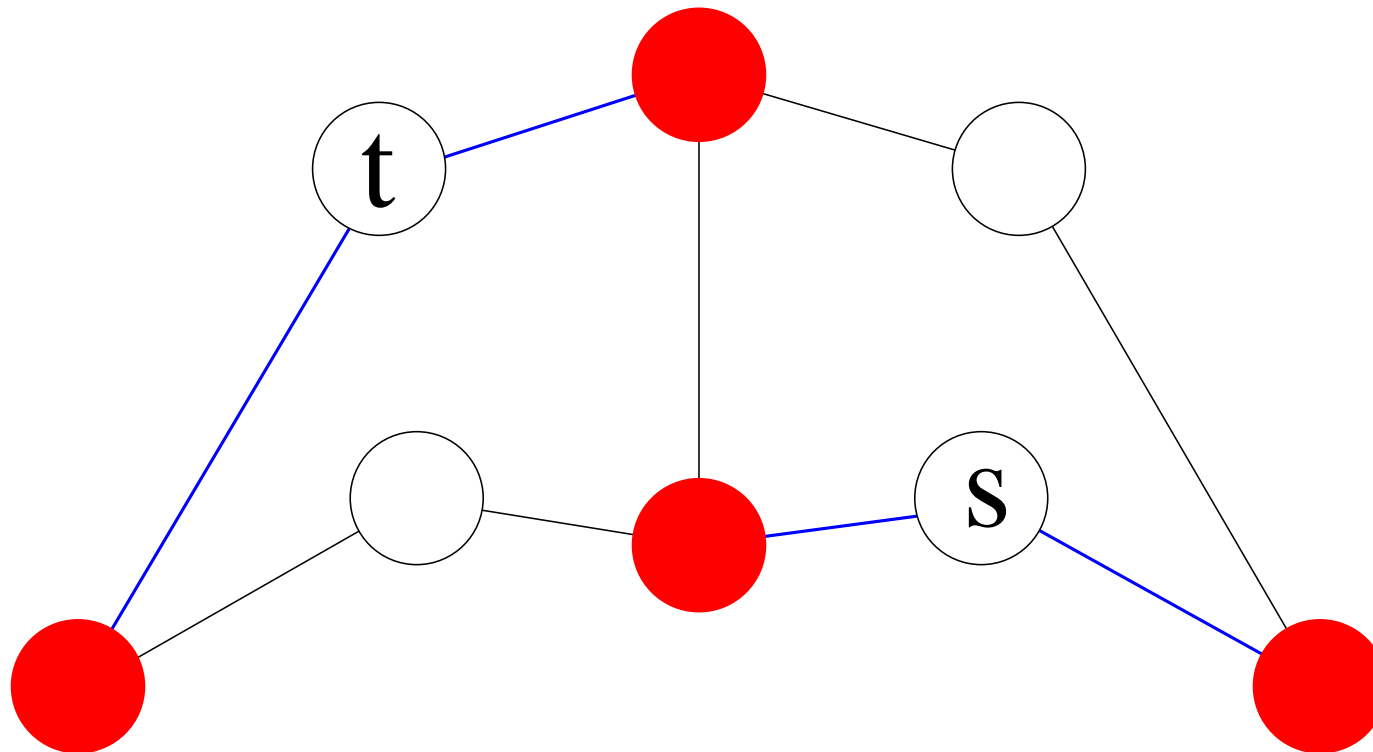
- covered branch: contains a node from  $S$
- covered tree: all branches covered
- covering nodes: on each branch, the node  $u \in S$  closest to the root  $s$





# Query: Intuition

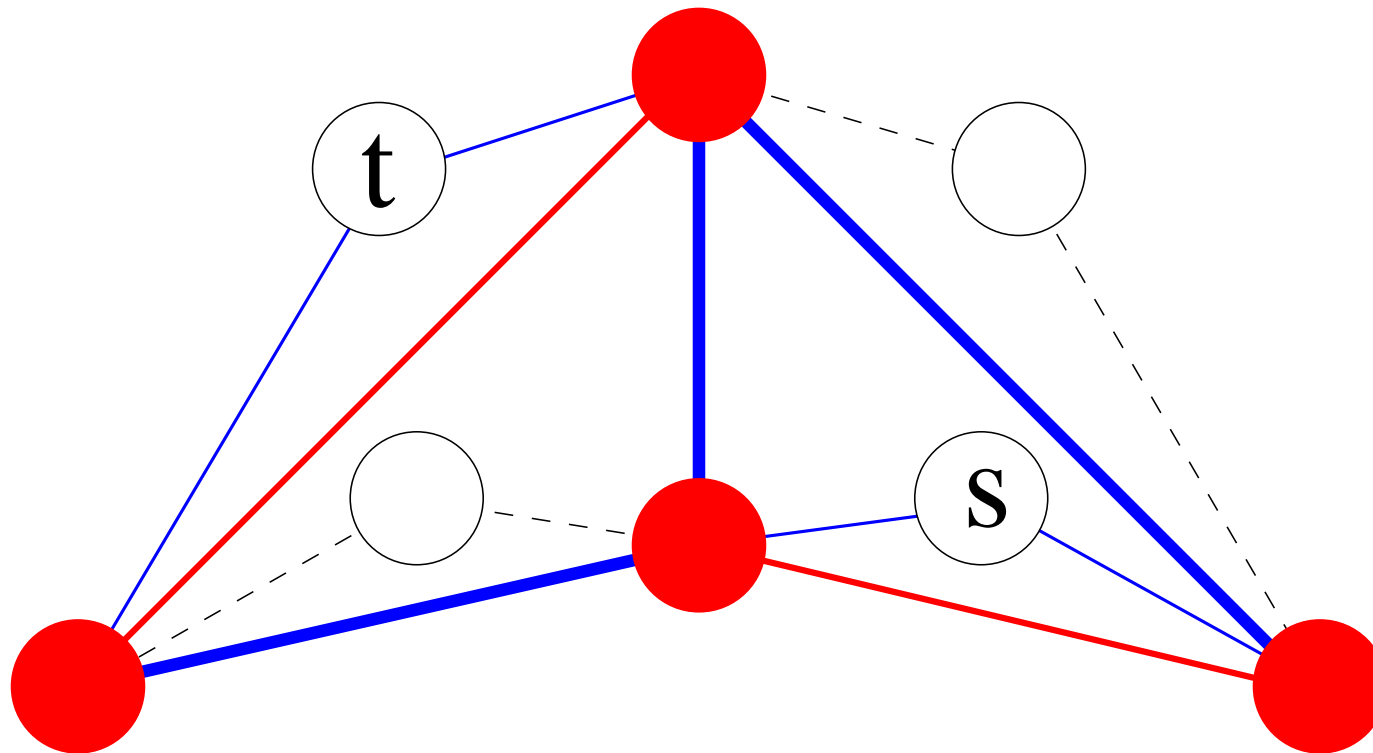
- bidirectional
- perform search in  $G$  till search trees are covered by nodes in  $S$





# Query: Intuition

- bidirectional
- perform search in  $G$  till search trees are covered by nodes in  $S$
- continue search only in  $G'$

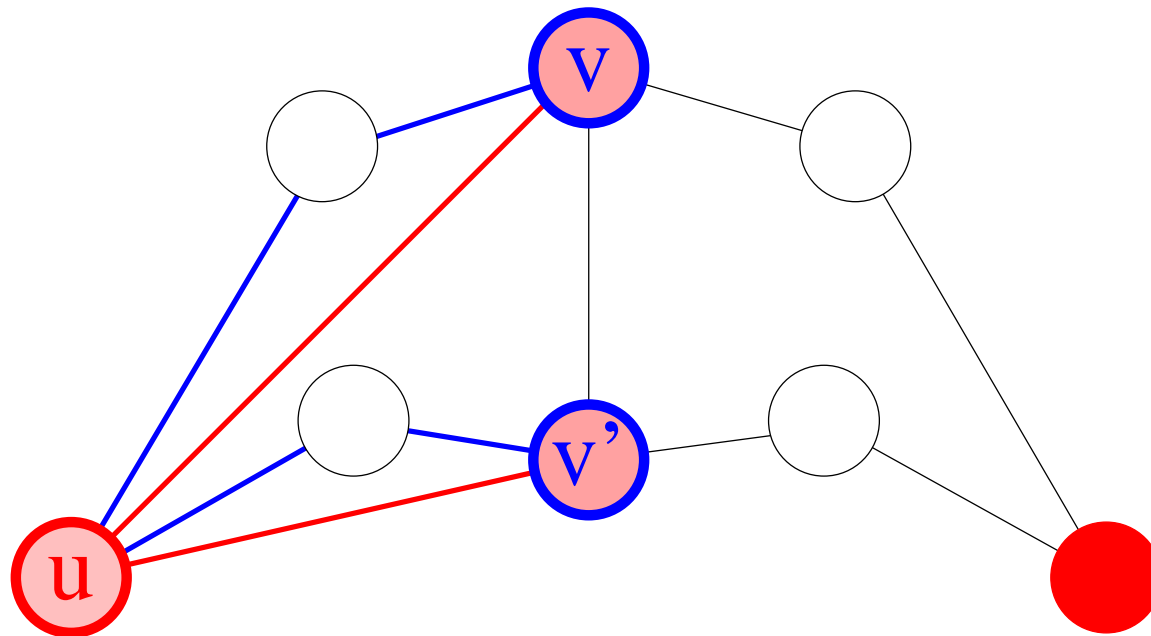




# Overlay Graph: Construction

for each node  $u \in S$

- perform a local search from  $u$  in  $G$
- determine the covering nodes
- add an edge  $(u, v)$  to  $E'$  for each covering node  $v$

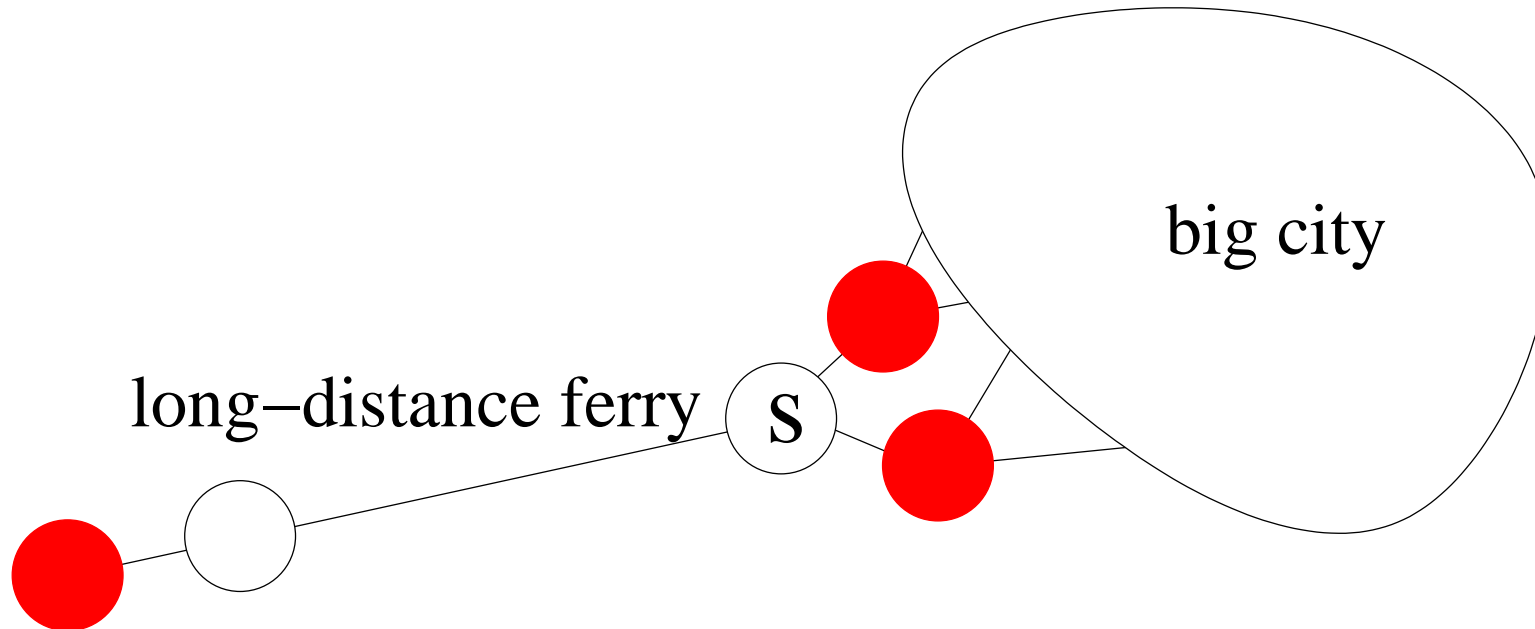




# Covering Nodes

## Conservative Approach:

- stop searching in  $G$  when **all branches** are covered



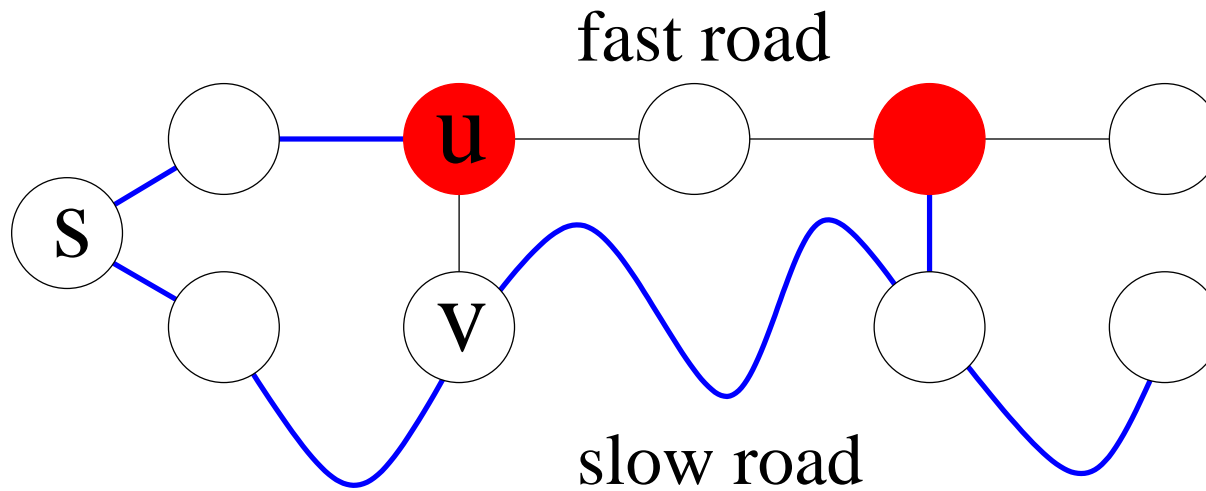
- can be very **inefficient**



# Covering Nodes

## Aggressive Approach:

- do not continue the search in  $G$  on covered branches



- can be very inefficient



## Covering Nodes

### Compromise:

- introduce **parameter**  $p$
- do not continue the search in  $G$  on branches that **already contain  $p$  nodes from  $S$**
- in addition: stop when all branches are covered
- $p = 1 \rightarrow$  aggressive
- $p = \infty \rightarrow$  conservative
  
- works very **well** in practice

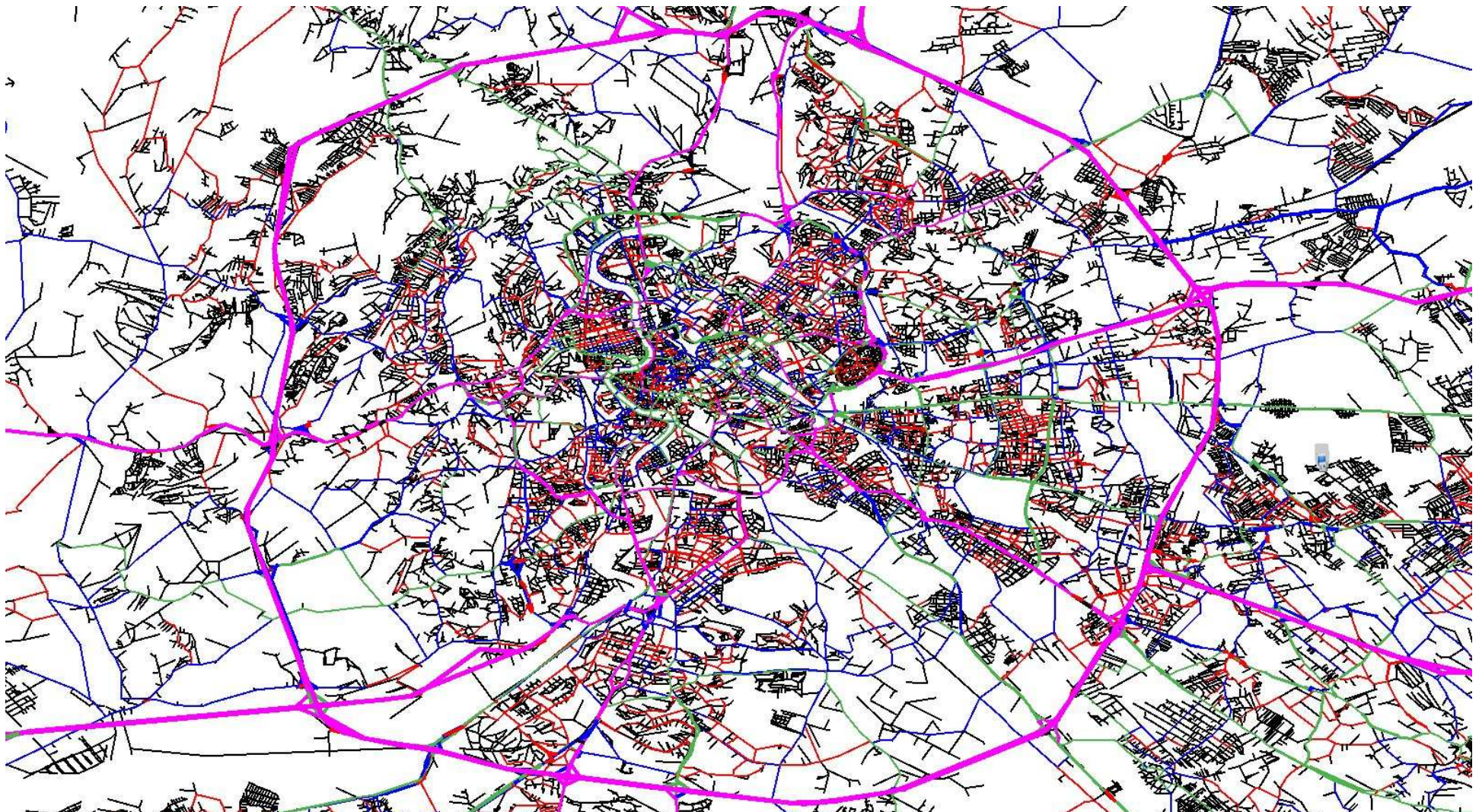




# Highway Hierarchies

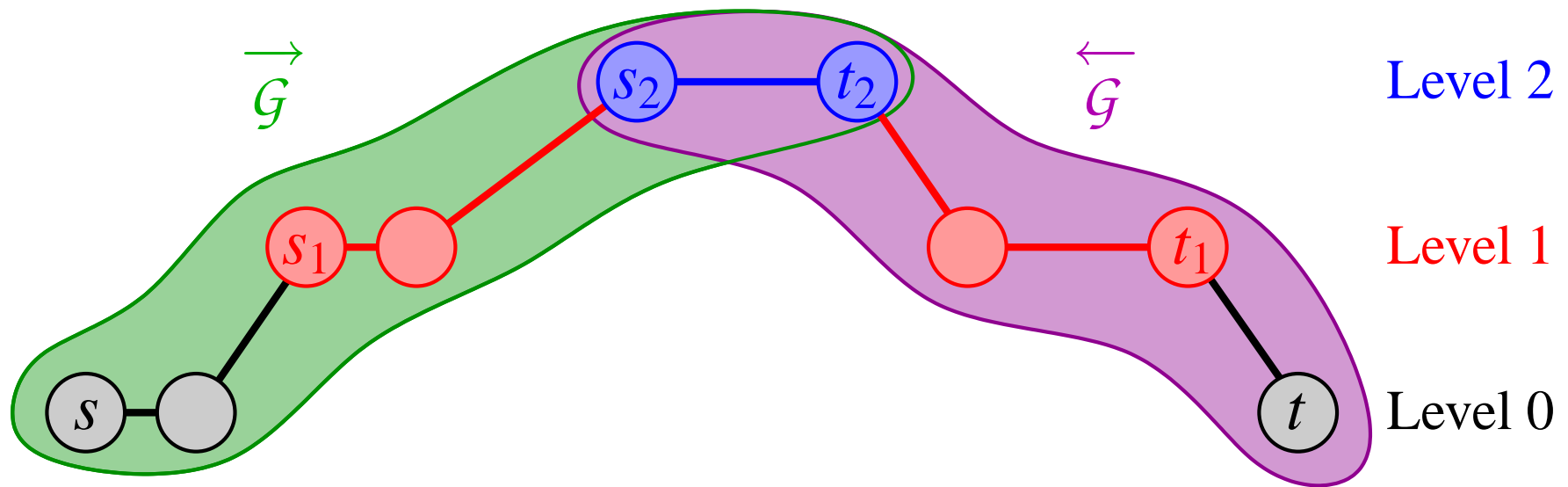
- previous static route-planning approach
- determines a **hierarchical representation** of nodes and edges

[SS05-06]





# 2. Static Highway-Node Routing





## Static Highway-Node Routing

- extend ideas from
  - multi-level **overlay graphs** [HolzerSchulzWagnerWeiheZaroliagis00–07]
  - highway hierarchies [SS05–06]
  - transit node routing [BastFunkeMatijevicSS06–07]
  
- use highway hierarchies to **classify** nodes by ‘**importance**’  
i.e., select node sets  $S_1 \supseteq S_2 \supseteq S_3 \dots \supseteq S_L$   
(crucial **distinction** from previous **separator-based** approach)
  
- construct **multi-level overlay graph**  
 $G_0 = G = (V, E), G_1 = (S_1, E_1), G_2 = (S_2, E_2), \dots, G_L = (S_L, E_L)$   
(just iteratively construct overlay graphs)



## Static Highway-Node Routing

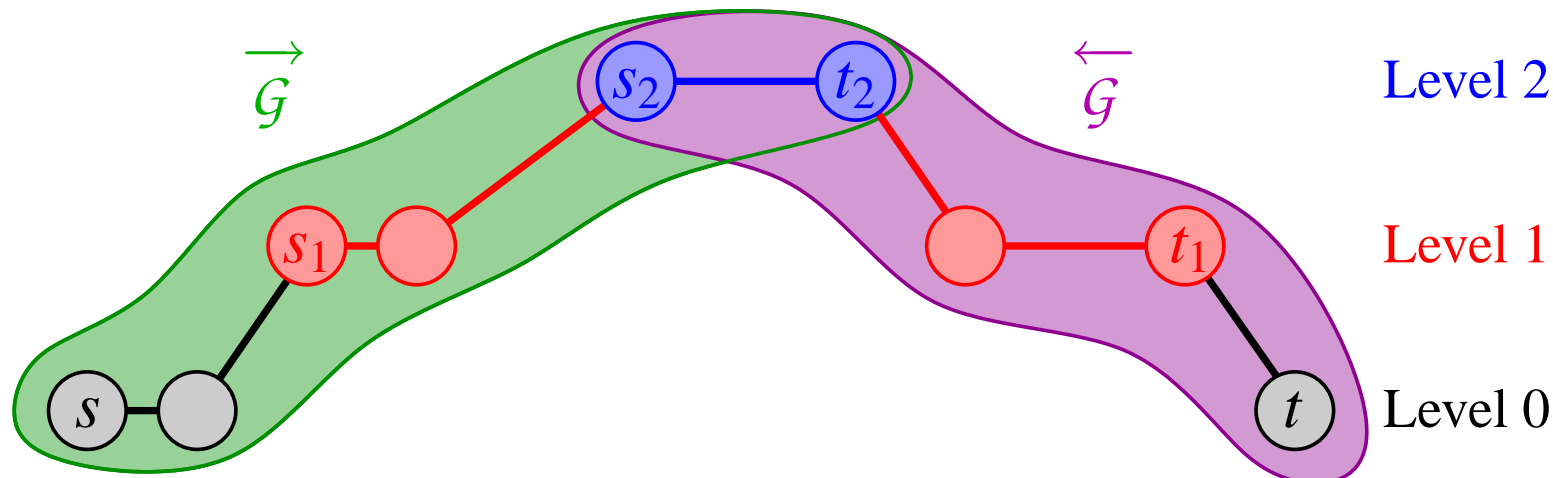
- extend ideas from
  - multi-level **overlay graphs** [HolzerSchulzWagnerWeiheZaroliagis00–07]
  - highway hierarchies [SS05–06]
  - transit node routing [BastFunkeMatijevicSS06–07]
  
- use highway hierarchies to **classify** nodes by ‘**importance**’  
i.e., select node sets  $S_1 \supseteq S_2 \supseteq S_3 \dots \supseteq S_L$  13 min  
(crucial **distinction** from previous **separator-based** approach)
  
- construct **multi-level overlay graph** 2 min  
 $G_0 = G = (V, E), G_1 = (S_1, E_1), G_2 = (S_2, E_2), \dots, G_L = (S_L, E_L)$   
(just iteratively construct overlay graphs)

(experiments with a European road network with  $\approx$  18 million nodes)



## Query: Aggressive Variant

- node **level**  $\ell(u) := \max \{ \ell \mid u \in S_\ell \}$
- **forward** search graph  $\vec{\mathcal{G}} := \left( V, \left\{ (u, v) \mid (u, v) \in \bigcup_{i=\ell(u)}^L E_i \right\} \right)$
- **backward** search graph  $\overleftarrow{\mathcal{G}} := \left( V, \left\{ (u, v) \mid (v, u) \in \bigcup_{i=\ell(u)}^L E_i \right\} \right)$
- perform one **plain Dijkstra search** in  $\vec{\mathcal{G}}$  and one in  $\overleftarrow{\mathcal{G}}$

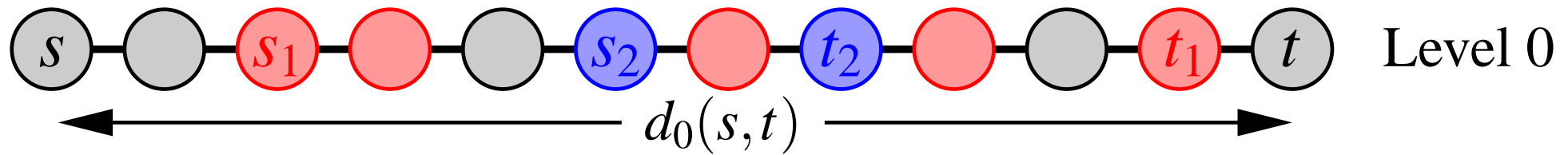




# Proof of Correctness

Level 2

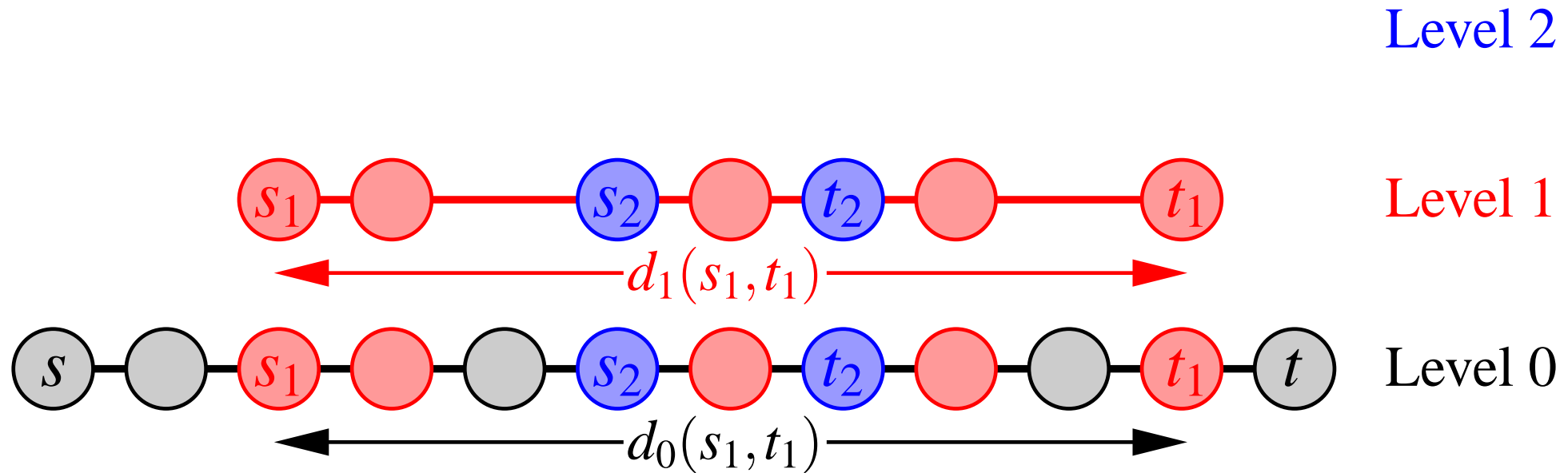
Level 1



shortest path from  $s$  to  $t$  in  $G = G_0$



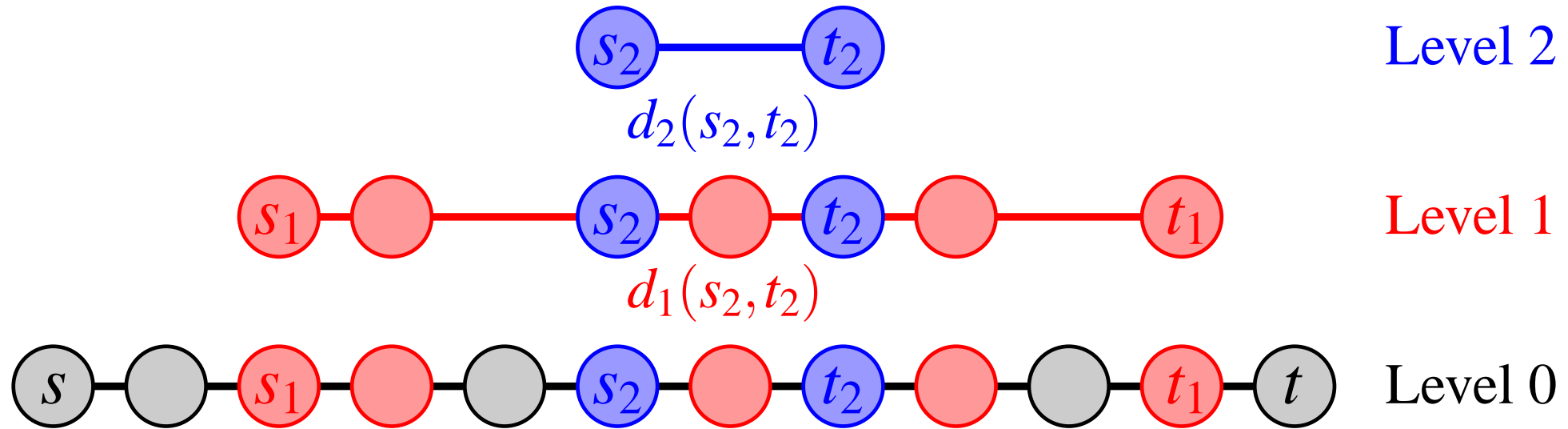
# Proof of Correctness



overlay graph  $G_1$  preserves distance from  $s_1 \in S_1$  to  $t_1 \in S_1$



# Proof of Correctness

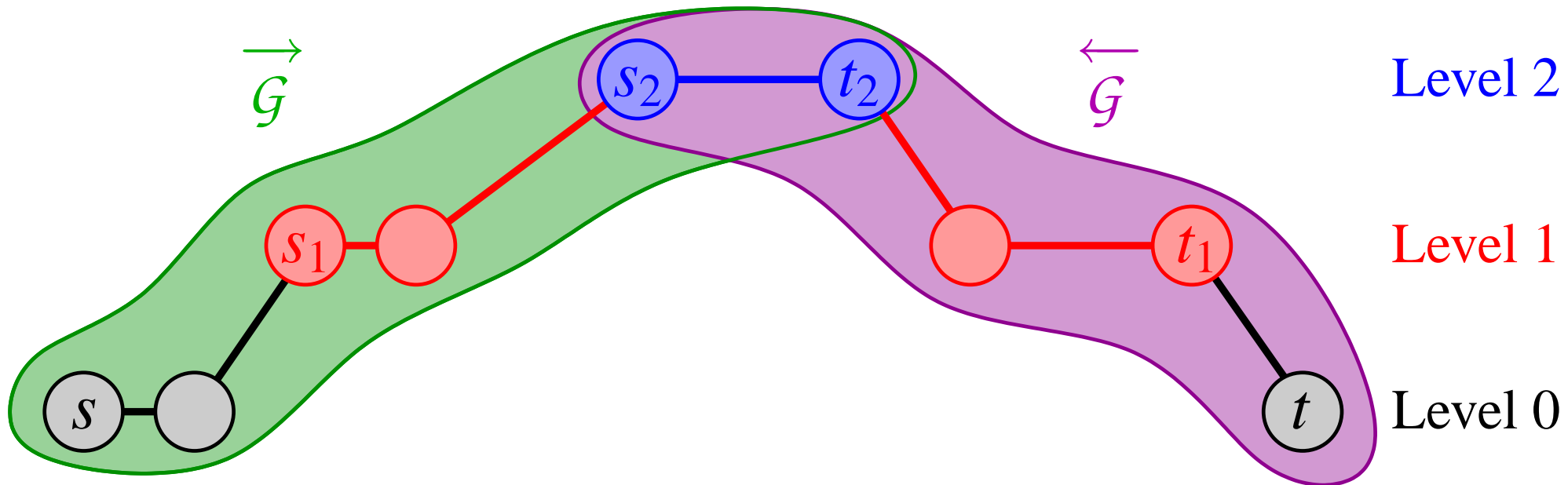


overlay graph  $G_2$  preserves distance from  $s_2 \in S_2$  to  $t_2 \in S_2$





# Proof of Correctness



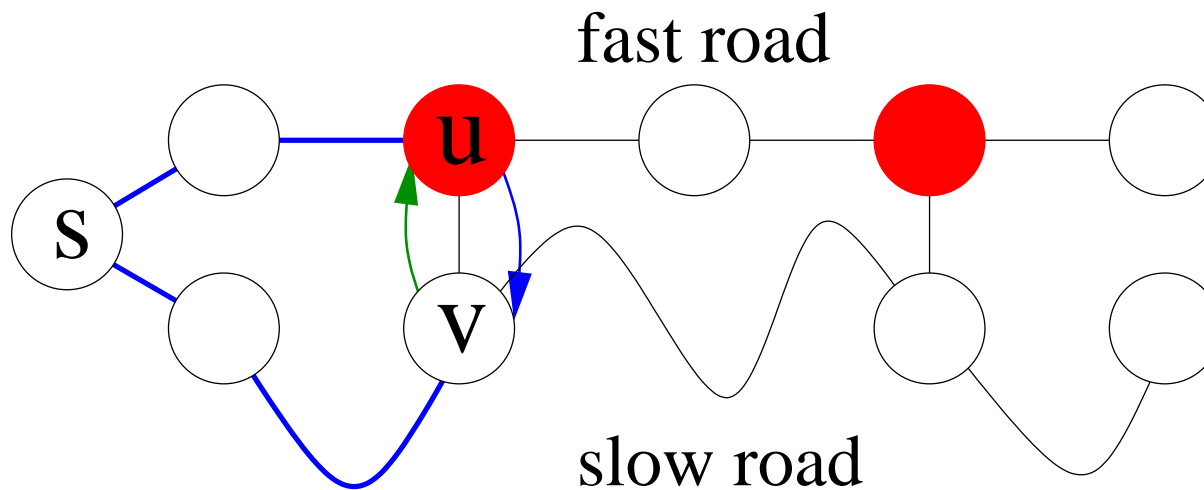
$$\vec{G} := \left( V, \left\{ (u, v) \mid (u, v) \in \bigcup_{i=\ell(u)}^L E_i \right\} \right)$$

$$\overleftarrow{G} := \left( V, \left\{ (u, v) \mid (v, u) \in \bigcup_{i=\ell(u)}^L E_i \right\} \right)$$

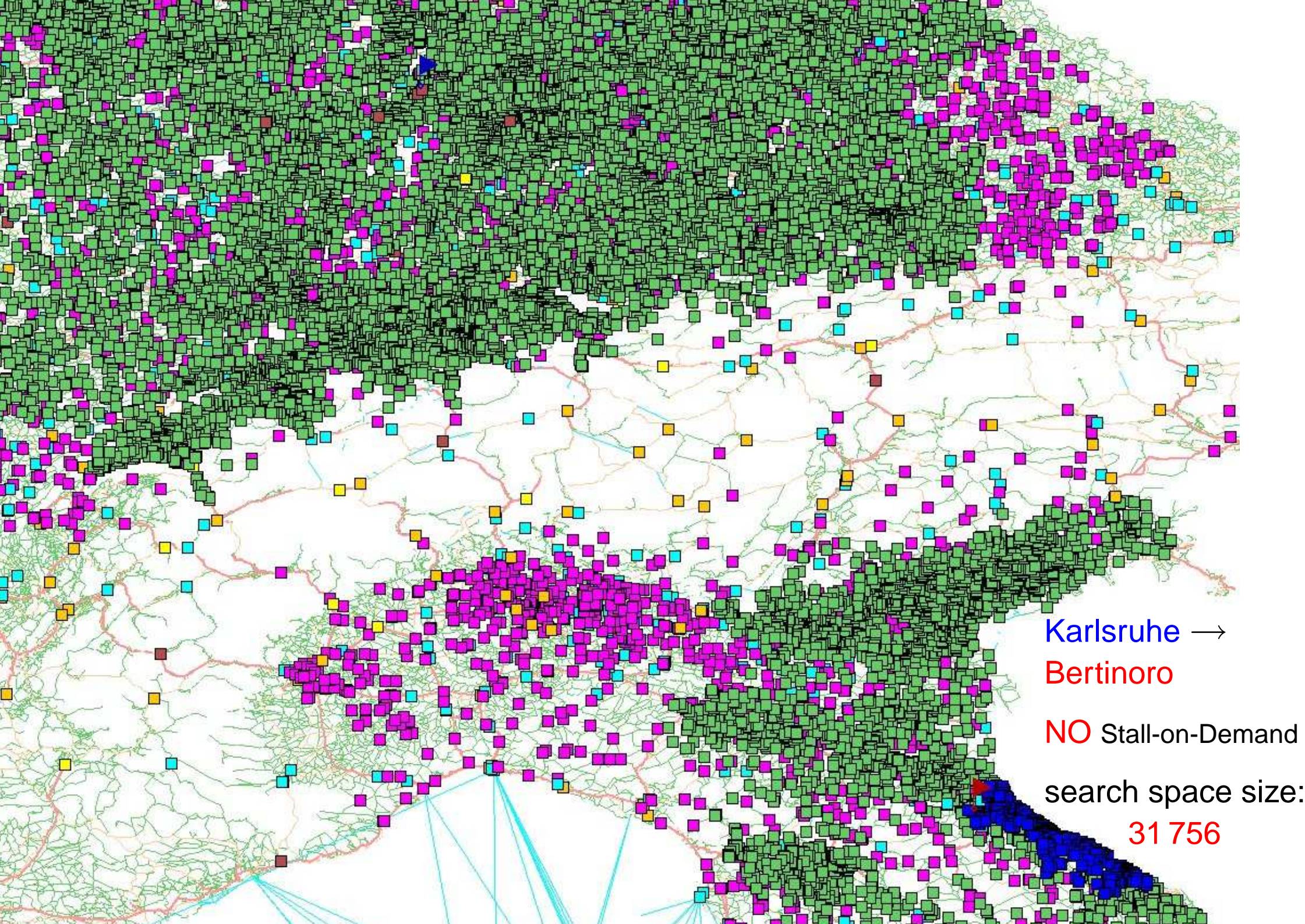


## Stall-on-Demand

- a node  $v$  can 'wake' a node  $u$  if  $\ell(u) > \ell(v)$
- $u$  can 'stall'  $v$  (if  $\delta(u) + w(u, v) < \delta(v)$ )  
i.e., search is not continued from  $v$



- stalling can propagate to adjacent nodes
- does not invalidate correctness (only suboptimal paths are stalled)



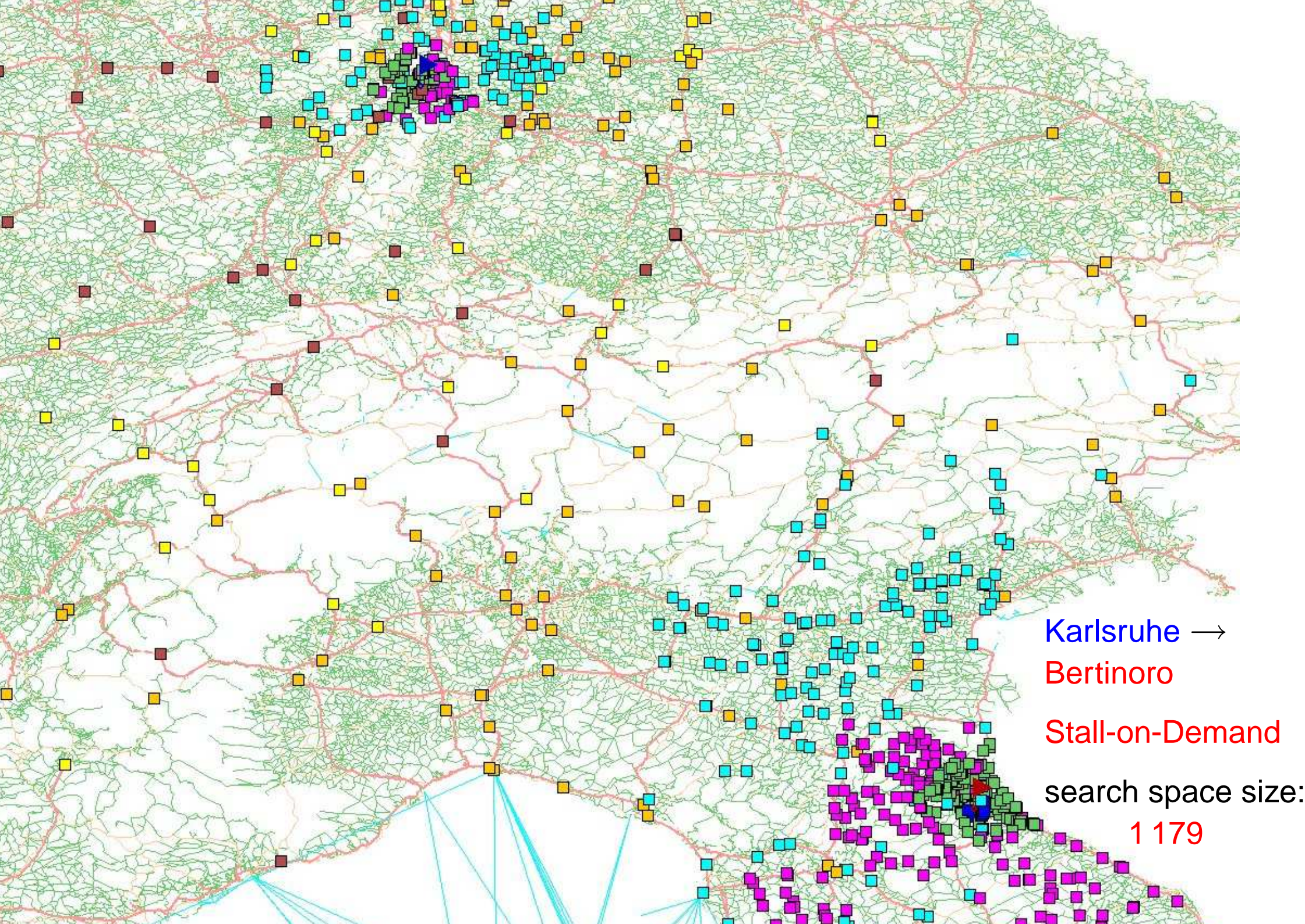
Karlsruhe →

Bertinoro

NO Stall-on-Demand

search space size:

31 756





## Memory Consumption / Query Time

different **trade-offs** between memory consumption and query time

**for example:**

□ 9 bytes per node overhead → 0.88 ms

store **complete multi-level overlay graph**

□ 0.7 bytes per node overhead → 1.44 ms

store only forward and backward **search graph**  $\overrightarrow{\mathcal{G}}$  and  $\overleftarrow{\mathcal{G}}$

( $\overrightarrow{\mathcal{G}}$  and  $\overleftarrow{\mathcal{G}}$  are independent of  $s$  and  $t$ )

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numbers refer to the Western European road network with **18 million nodes**



# 3. Dynamic Highway-Node Routing





## Dynamic Highway-Node Routing

change entire **cost function**



**keep** the node sets  $S_1 \supseteq S_2 \supseteq S_3 \dots$

**recompute** the overlay graphs

speed profile	default	<b>fast car</b>	slow car	<b>slow truck</b>	distance
constr. [min]	1:40	<b>1:41</b>	1:39	<b>1:36</b>	3:56
query [ms]	1.17	<b>1.20</b>	1.28	<b>1.50</b>	35.62
#settled nodes	1 414	<b>1 444</b>	1 507	<b>1 667</b>	7 057



# Dynamic Highway-Node Routing

change a **few edge weights**



- server scenario:** if something changes,
  - **update** the preprocessed data structures
  - answer **many** subsequent queries very **fast**
  
- mobile scenario:** if something changes,
  - it **does not pay** to update the data structures
  - perform **single** ‘prudent’ query that **takes changed situation into account**







## Dynamic Highway-Node Routing

change a **few edge weights**, server scenario

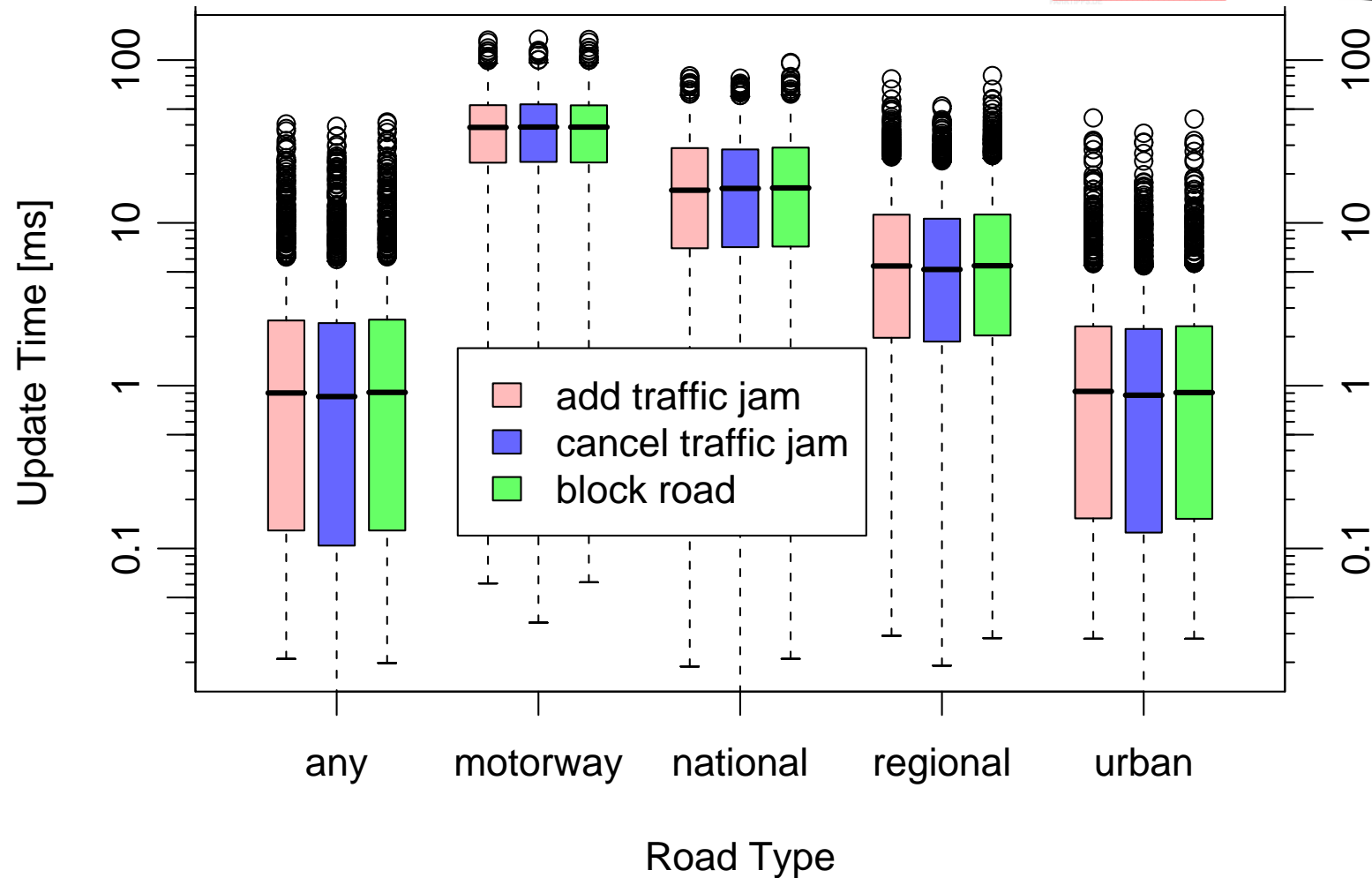


- **keep** the node sets  $S_1 \supseteq S_2 \supseteq S_3 \dots$
- **recompute** only **possibly affected parts** of the overlay graphs
  - the computation of the level- $\ell$  overlay graph consists of  $|S_\ell|$  **local searches** to determine the respective covering nodes
  - if the initial local search from  $v \in S_\ell$  has **not touched** a now modified edge  $(u, x)$ , that local search need **not be repeated**
  - we **manage sets**  $A_u^\ell = \{v \in S_\ell \mid v\text{'s level-}\ell \text{ preprocessing might be affected when an edge } (u, x) \text{ changes}\}$



# Dynamic Highway-Node Routing

change a **few edge weights**, server scenario



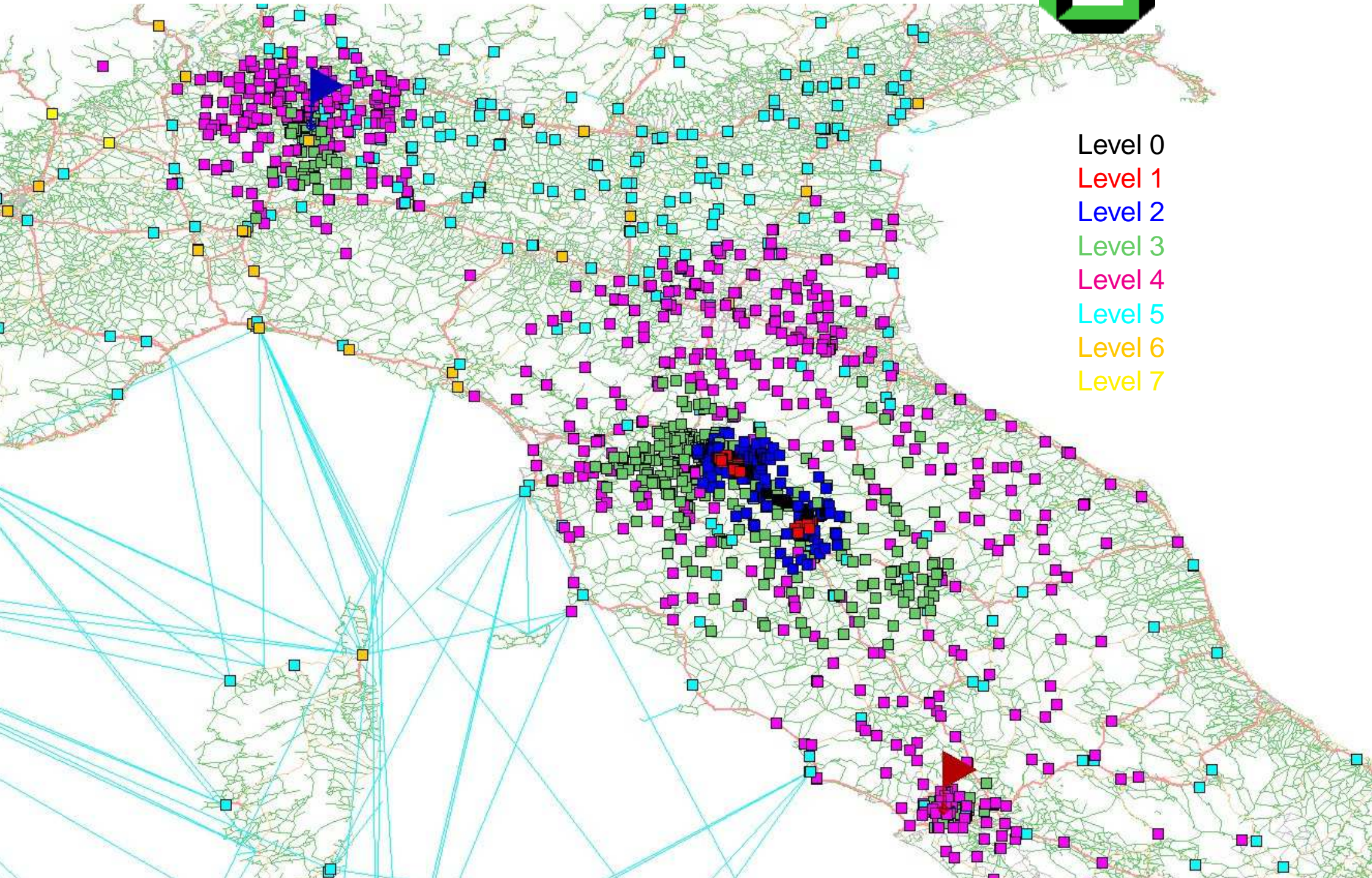
# Dynamic Highway-Node Routing



change a **few edge weights**, mobile scenario



1. **keep** the node sets  $S_1 \supseteq S_2 \supseteq S_3 \dots$
2. **keep** the overlay graphs
3.  $C :=$  **all** changed edges
4. use the sets  $A_u^\ell$  (considering edges in  $C$ ) to determine for each node  $v$  a **reliable level**  $r(v)$
5. during a query, at node  $v$ 
  - do not use** edges that have been created in some **level**  $> r(v)$
  - instead, **downgrade** the search to **level**  $r(v)$



- Level 0
- Level 1
- Level 2
- Level 3
- Level 4
- Level 5
- Level 6
- Level 7



## Dynamic Highway-Node Routing

change a **few edge weights**, mobile scenario



**iterative variant** (provided that only edge weight **increases** allowed)

1. **keep** everything (as before)
2.  $C := \emptyset$
3. use the sets  $A_u^\ell$  (considering edges in  $C$ ) to determine for each node  $v$  a **reliable level**  $r(v)$  (as before)
4. **'prudent'** query (as before)
5. if shortest path  $P$  does **not contain** a **changed edge**, we are done
6. otherwise: **add** changed edges on  $P$  to  $C$ , **repeat** from 3.



# Dynamic Highway-Node Routing

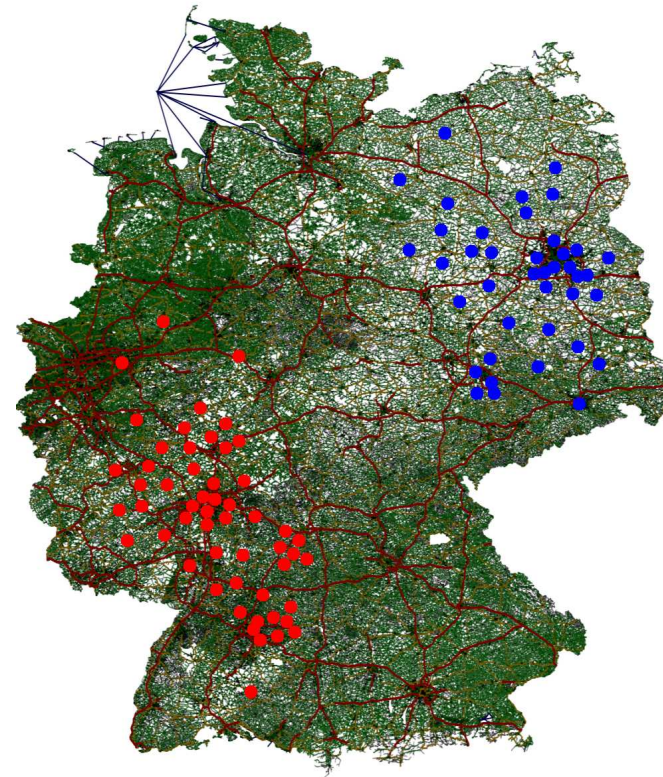
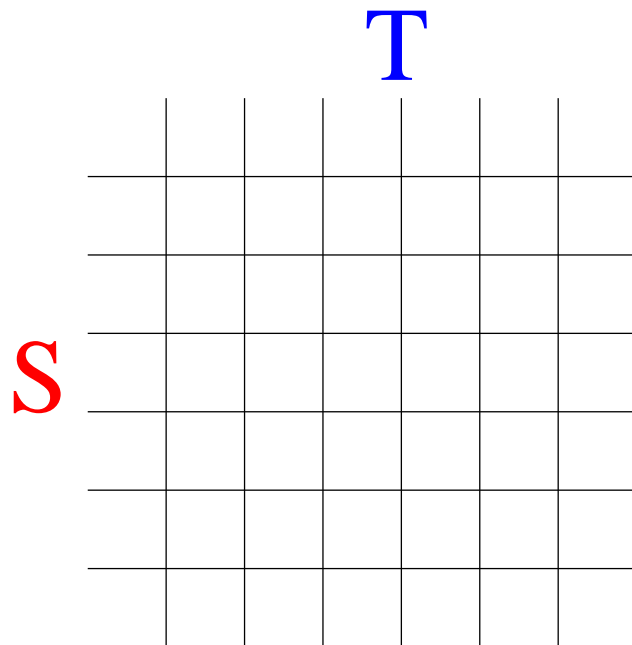
change a **few edge weights**, mobile scenario



change set  (motorway edges)	affected queries	single pass	iterative	
		query time [ms]	query time [ms]	#iterations avg    max
1	0.4 %	2.3	1.5	1.0    2
10	5.8 %	8.5	1.7	1.1    3
<b>100</b>	<b>40.0 %</b>	<b>47.1</b>	<b>3.6</b>	<b>1.4    5</b>
1 000	83.7 %	246.3	25.3	2.7    9



# 4. Many-to-Many Extension



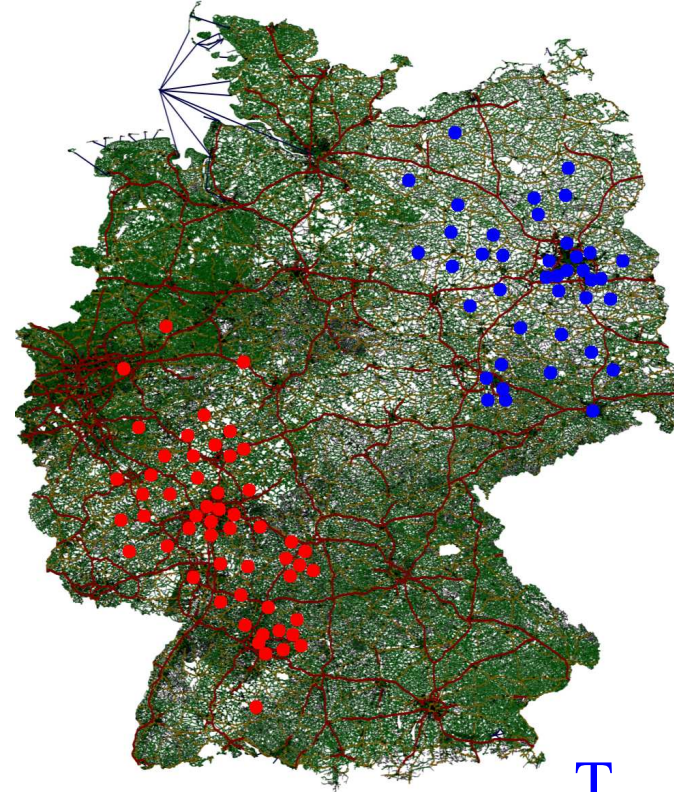


# Many-to-Many Routing

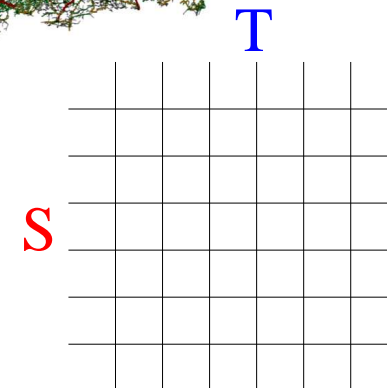
[with S. Knopp, F. Schulz (PTV AG), D. Wagner]

## Given:

- graph  $G = (V, E)$
- set of **source nodes**  $S \subseteq V$
- set of **target nodes**  $T \subseteq V$



**Task:** compute  $|S| \times |T|$  **distance table**  
containing the **shortest path** distances

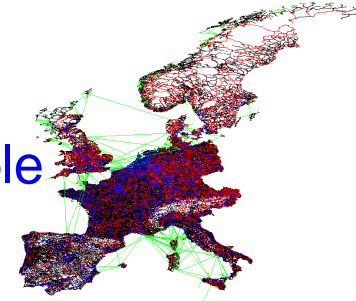






# Simple Solutions

Example: 10 000 × 10 000 table  
in Western Europe



□ apply SSSP algorithm  $|S|$  times  
(e.g. **DIJKSTRA**)  $\approx 10\,000 \times 10\text{ s} \approx$  one day

□ apply P2P algorithm  $|S| \times |T|$  times  
(e.g. **highway-node routing**<sup>1</sup>)  $\approx 10\,000^2 \times 1\text{ ms} \approx$  one day

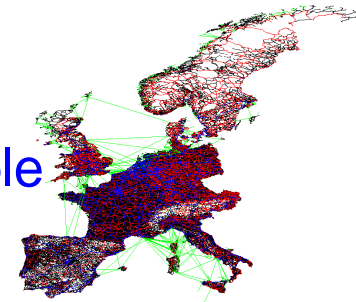
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<sup>1</sup>requires about 15 minutes preprocessing time



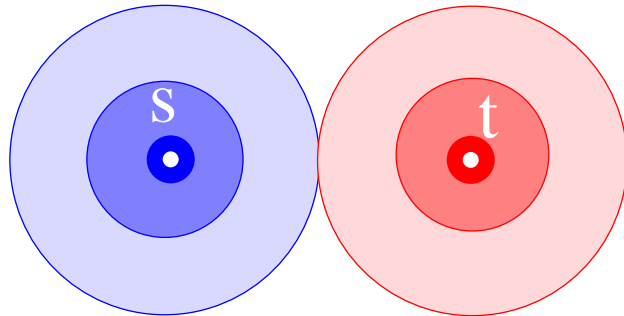
# Our Solution

Example: 10 000 × 10 000 table  
in Western Europe



- many-to-many algorithm  
based on highway-node routing<sup>1</sup>

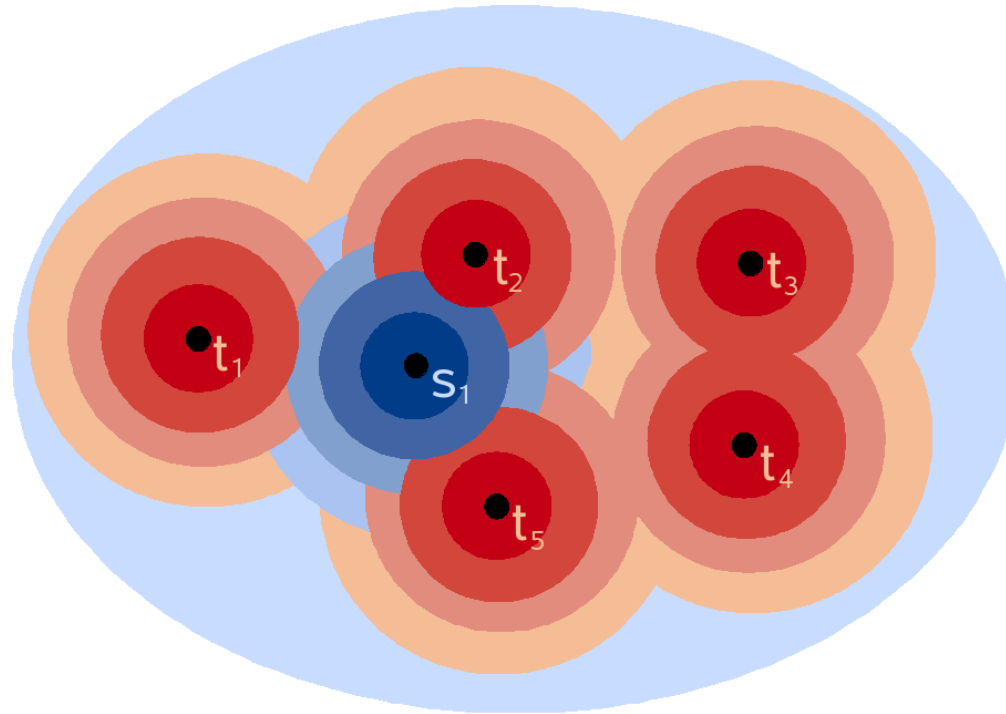
**23 seconds**



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<sup>1</sup>requires about 15 minutes preprocessing time





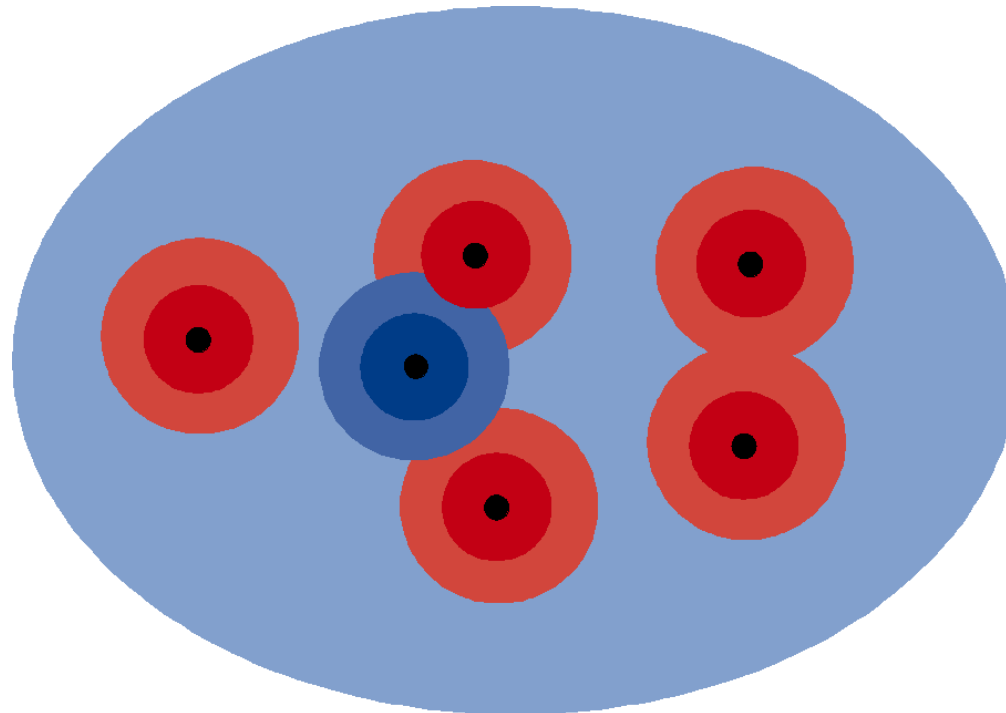
- for each  $t \in T$ , perform **backward search** up to the top level,  
**store search space entries**  $(t, u, d(u, t))$
- arrange search spaces: create a bucket for each  $u$
- for each  $s \in S$ , perform **forward search** up to and **including** the top level,  
at each node  $u$ , **scan all entries**  $(t, u, d(u, t))$  and  
compute  $d(s, u) + d(u, t)$ , update  $D[s, t]$



# Asymmetry

for large distance tables, most time spent on **bucket scanning**

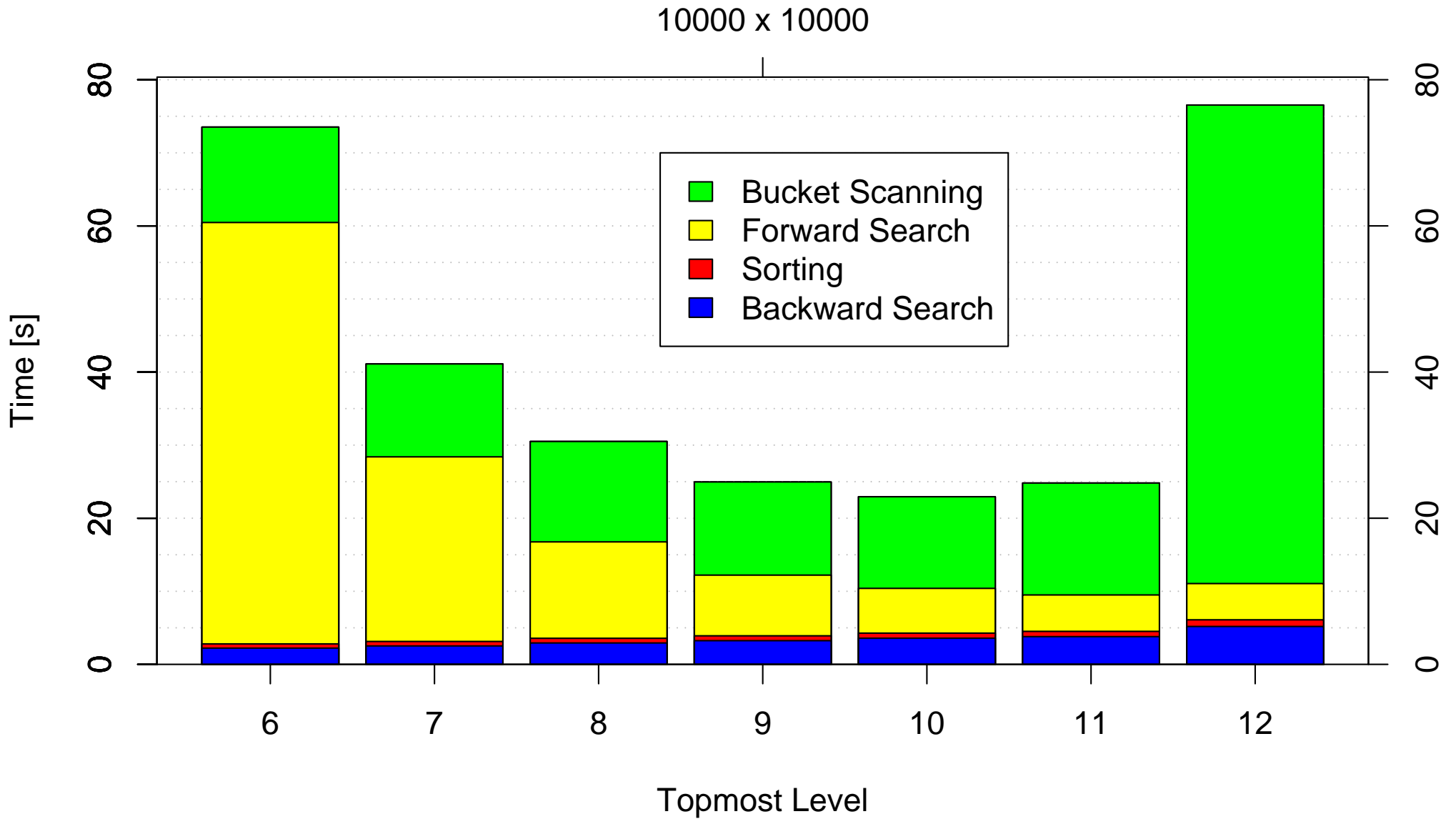
**Solution:** use **less levels**  $\rightsquigarrow$  strengthen the **asymmetry**



- backward search spaces get smaller  $\rightsquigarrow$  **less bucket entries**
- forward search spaces get bigger



# Experiments





## Summary

### □ efficient **static** approach

- fast preprocessing / fast queries 15 min / 0.9 ms
- outstandingly low memory requirements 0.7 bytes/node  $\rightsquigarrow$  1.4 ms

### □ can handle practically relevant **dynamic** scenarios

- change entire **cost function** typically < 2 minutes
- change a **few edge weights**
  - \* **update** data structures 2–40 ms per changed edge
  - OR
  - \* **iteratively bypass** traffic jams e.g., **3.6 ms** in case of 100 traffic jams

### □ extensible to **many-to-many** 23 s for 10 000 × 10 000 table

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numbers refer to the Western European road network with **18 million nodes**



# Future Work

- find **simpler / better** ways to determine the node sets

$$S_1 \supseteq S_2 \supseteq S_3 \dots$$

(work in progress)

- handle a **massive** amount of **updates**

- deal with **time-dependent** scenarios

(where edge weights depend on the time of day)



- allow **multi-criteria** optimisations

