



# Efficient Route Planning with Temporary Driving Restrictions

Alexander Kleff · Frank Schulz · Jakob Wagenblatt · Tim Zeitz | June 17th, 2020

INSTITUTE OF THEORETICAL INFORMATICS



## Scenario





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Evaluation

## Scenario





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## Scenario





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# Goals



Achieve practical performance

 Avoid NP-hard problem formulation

② Consider quality of parking locations

Consider trade-offs between earlier arrival and more comfortable routes







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Evaluation

## Given:

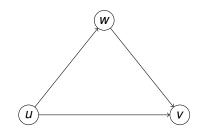
- Graph G = (V, E)
- Travel times  $\delta$
- Temporary driving restrictions
- Parking locations with ratings
- Waiting costs w<sub>i</sub>
- Driving costs d

#### Problem

- Find Pareto-optimal routes between vertices s and z regarding arrival time and abstract costs
- Waiting at a node causes costs depending on the ratio
- Waiting at unrated locations is allowed, driving also has a cost

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Evaluation

## Given:

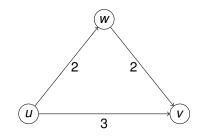
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Evaluation

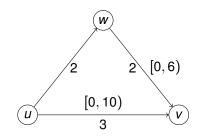
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## Given:

- Graph G = (V, E)
- Travel times  $\delta$
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# Dз w [0, 6)[0, 10)U 3

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## Given:

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# $u = \begin{bmatrix} 0, 10 \\ 0, 10 \end{bmatrix}$

## Problem

- Find Pareto-optimal routes between vertices s and z
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- Waiting at a node causes costs depending on the rating

#### Waiting at unrated locations is allowed, driving also has a cost

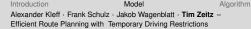


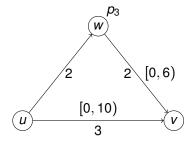
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Evaluatio

aluation

# Complexity





NP-hard by reduction from PARTITION



Possibly exponential number of Pareto-optimal routes



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# Algorithm

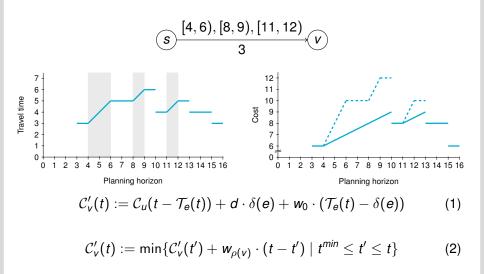


- Label-correcting Dijkstra
- Labels: Cost profiles
  - Tentative minimal costs
  - as function of arrival time
  - Piecewise linear functions
- Queue ordered by update time
- Polynomial running time
  - when  $d = w_0$



# Algorithm: Linking and Merging

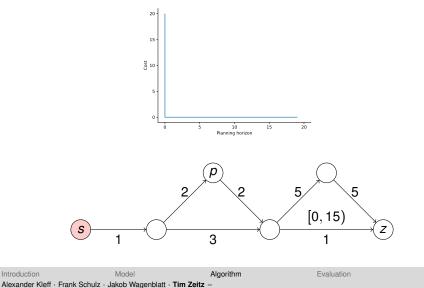




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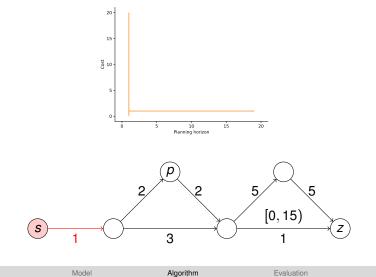
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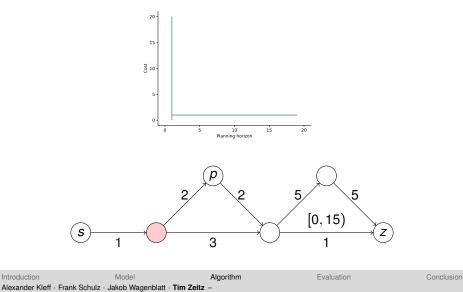
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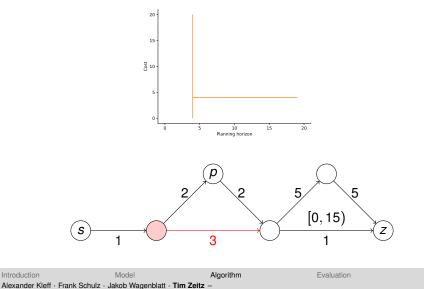


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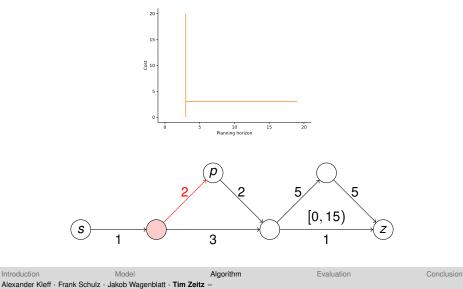


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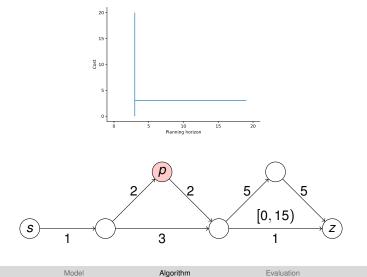




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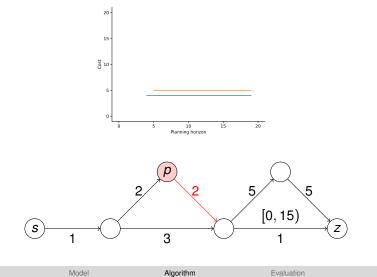




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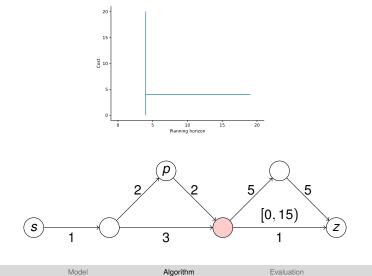
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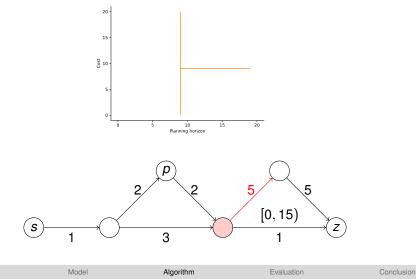
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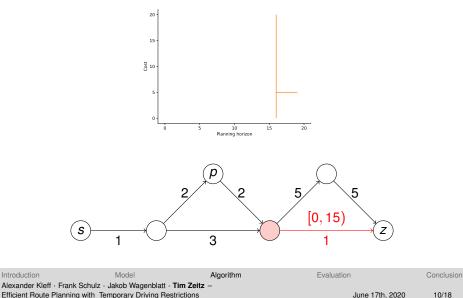
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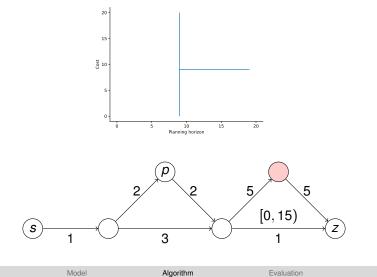
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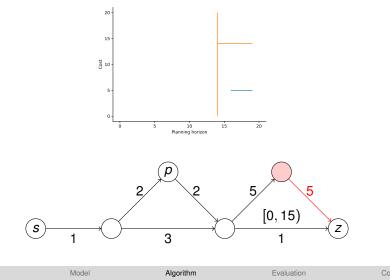
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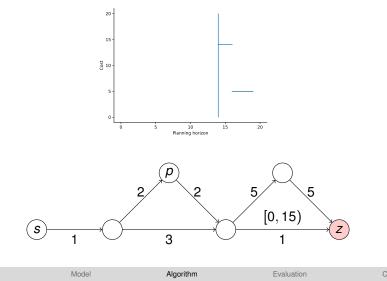




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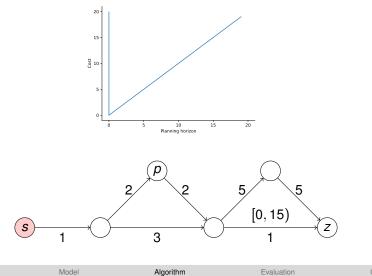




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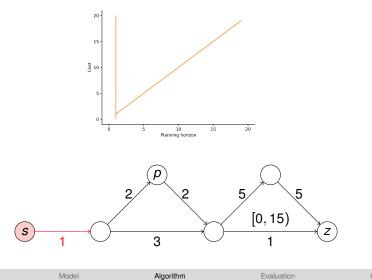




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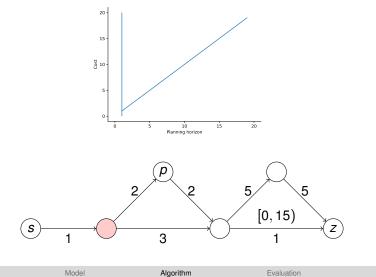




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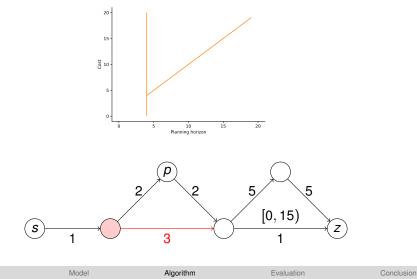


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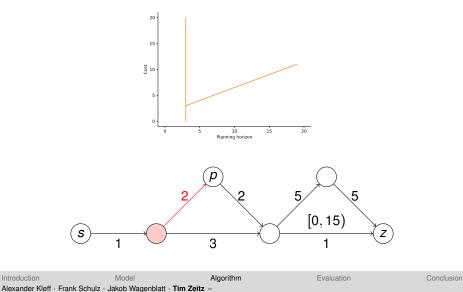


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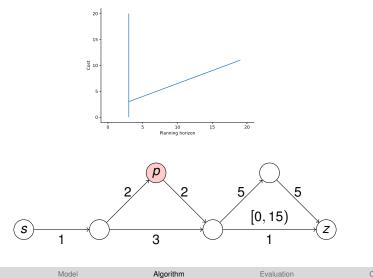




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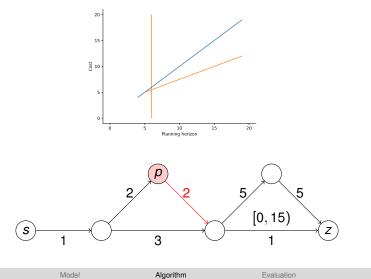




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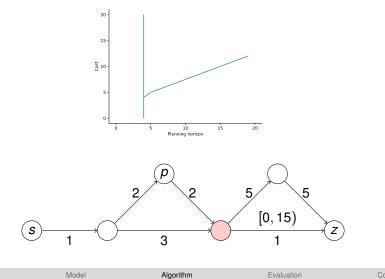




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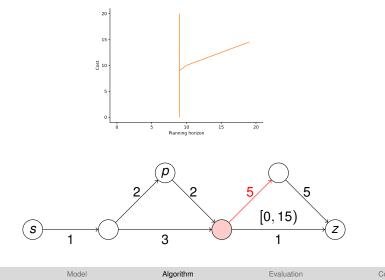
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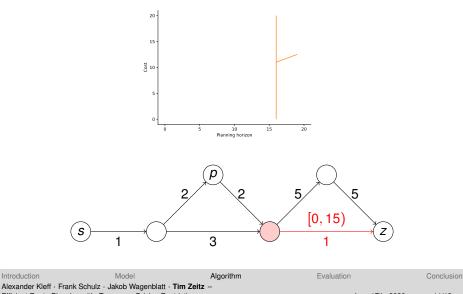


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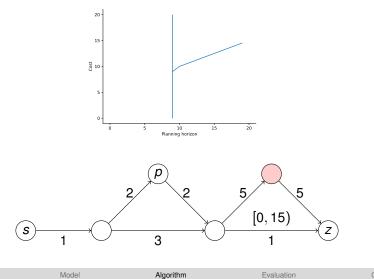




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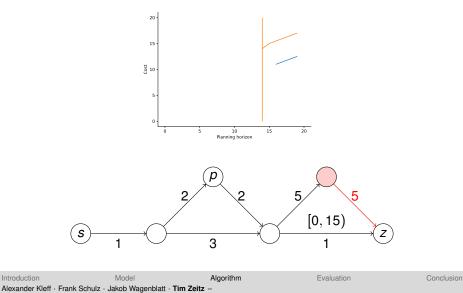


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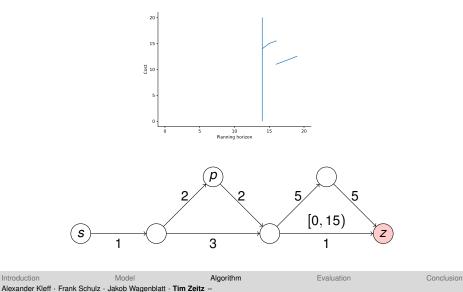




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### Implementation



#### C++14

- Using RoutingKit
- Pruning...
  - with bounds
  - with the target profile
  - loops
- Goal directed search with A\*
  - with CH-Potentials [SZ19]

### **Experiments**

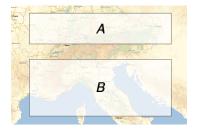


Road network of central Europe

- 21.9M vertices, 47.6M edges
- Sunday and night driving bans and local road closures
- 15317 parking location vertices
- Queries
  - Select random vertices from A and B
  - Make algorithm cope with night driving bans

Machine

- Intel i7-7600 CPU with 3.4 GHz
- 32 GB DDR4 RAM



### **Trade-offs**





# 16 h driving time,2.5 min waiting time (rating 3)

13 h driving time, 4 h waiting time (rating 5)

10 h driving time, 8 h waiting time (rating 4)

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## Waiting



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- Most of waiting scheduled at s
- At most one additional stop per route
  - Average 0.2
- Waiting at unrated locations
  - Happens
  - Always the quickest route
  - Alternative routes exist



- Results stable against different cost parameterizations
  - Availability + costs influences where most waiting happens

### Performance



	Optimal	Arrival time	Runnir	Running time	
Planning horizon	Routes	deviation	Avg.	Median	
	[#]	[h:mm]	[ms]	[ms]	
Mon. 18:00, 1 day	2.86	2:17	529.4	266.3	
Mon. 18:00, 2 days	3.54	3:19	648.1	405.6	
Fri. 06:00, 1 day	1.04	0:10	10.0	0.6	
Fri. 06:00, 2 days	1.08	0:16	79.5	0.7	
Fri. 18:00, 1 day	1.13	0:08	205.8	0.6	
Fri. 18:00, 2 days	1.32	0:20	1028.1	0.7	

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### Conclusion



- Achieve practical performance
- 2 Consider quality of parking locations
- Consider trade-offs between earlier arrival and more comfortable routes
- Introduced problem formulation achieving these goals
  - Solvable in polynomial time for certain parametrizations
- Implementation
  - Reasonable routes on realistic instances
  - Average running times below 1 s
- Future work
  - Bidirectional search







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## Thank you!

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Ben Strasser and Tim Zeitz. A\* with Perfect Potentials. 2019. arXiv: 1910.12526 [cs.DS].