

#### Robust routing in station areas with reducing capacity utilisation (PPT)

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#### The 13th Conference on Advanced Systems in Public Transport

#### **CASPT 2015**

# Robust train routing in station areas with reducing capacity utilization

Nikola Bešinović, Rob M.P. Goverde



#### Outline

- Introduction
- Motivation
- Solution approach
  - Preprocessing
  - Original Train Routing Problem (TRP)
  - Extension to Robust Train Routing Problem (RTRP)
  - RTRP heuristics
- Case study



#### Introduction

- High capacity consumption (sometimes over recommended norms)
- Growing demand (e.g., NL a train every 5')
- Stations as bottlenecks
- New planning methods and algorithms that should provide:
  - High-quality and reliable service,
  - Improved experience for planners and dispatchers
  - Satisfied customers

Train routing problem:

- 1. platform assignment
- 2. route selection



## State-of-the-art of Train Routing Problem (TRP)

- TRP is NP-hard
- So far:

Sels et al. (2014), Cacchiani et al. (2014)

- Aggregated routes
- Only platforming
- Node/set packing
- Conflict graph
- Multi-commodity flow
- Fixed/flexible event times
- Still missing:
  - Not proven operational feasibility
  - Infrastructure occupation and maintenance not considered



## Robust train routing problem (RTRP)

#### Problem:

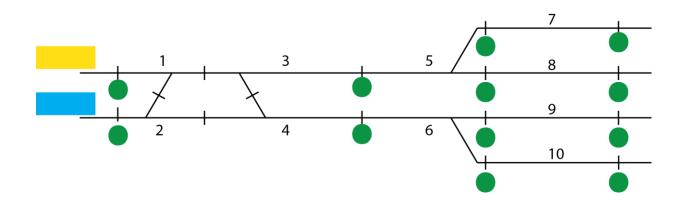
Find the feasible, stable and robust route plan (RP), i.e., platform allocation and routing, that uses the infrastructure more evenly within a station area

#### Input:

- Station topology
- Train lines
- Set of alternative routes
- Fixed event times (arrivals and departures) output from a macroscopic timetabling model
- Preferred platforms for train lines
- Passenger connections



#### Some definitions



- Station topology detailed infrastructure
- Resource subset of infrastructure elements
  - Track section, switch, crossing
- A train route set of resources
- Blocking time a time that a resource is reserved exclusively for a single train

Blocking time > running time over a resource



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  - RTRP model
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Resource trees
Blocking times
Conflict constraints

Building a graph...

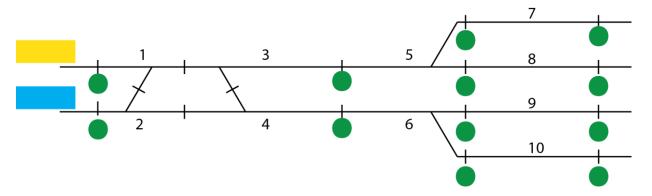


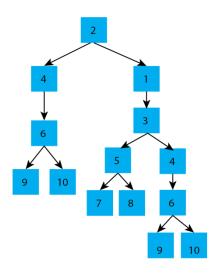
## Preprocessing (1)

#### Resource trees

Blocking times

Conflict constraints





 Resource tree – acyclic graph that includes all alternative routes

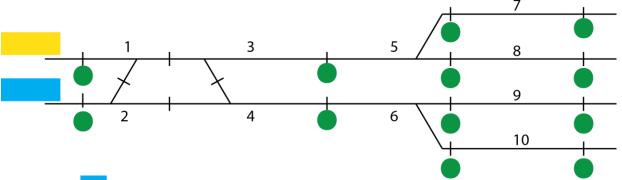


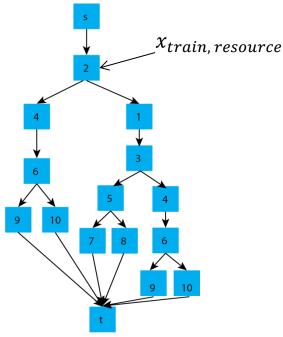
## Preprocessing (1)

#### Resource trees

Blocking times

Conflict constraints





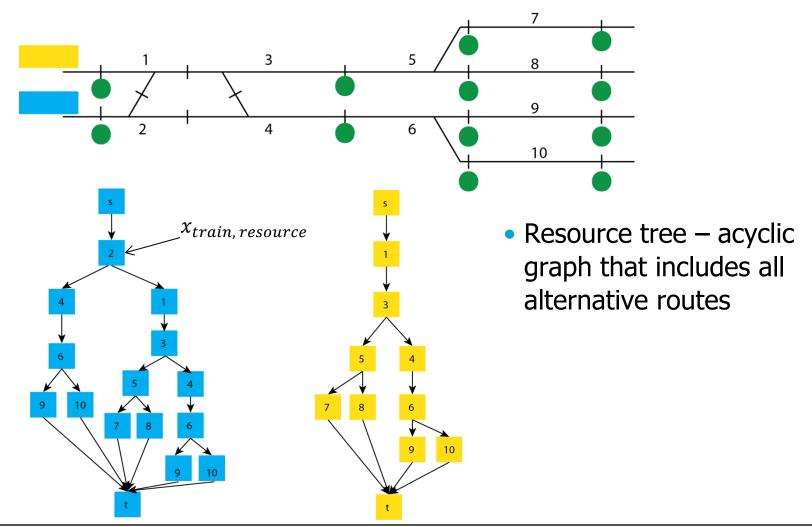
 Resource tree – acyclic graph that includes all alternative routes



## Preprocessing (1)

#### Resource trees

Blocking times

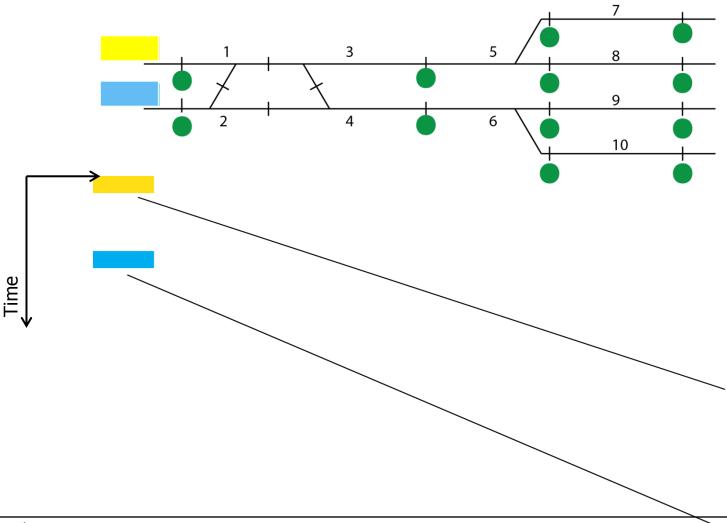




Preprocessing (2)

Resource trees

#### Blocking times

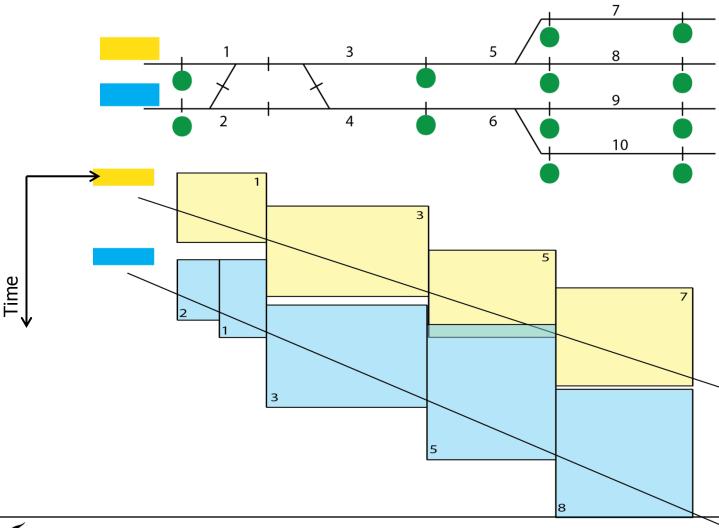




## Preprocessing (2)

#### Resource trees

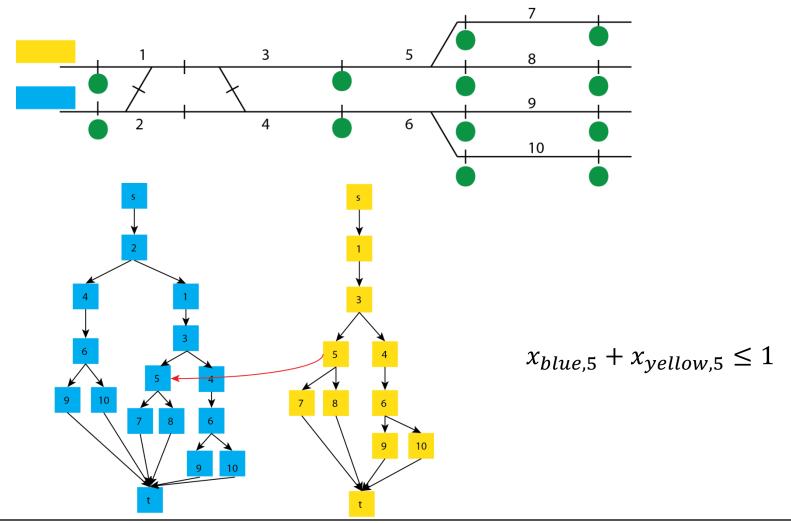
#### Blocking times





## Preprocessing (3)

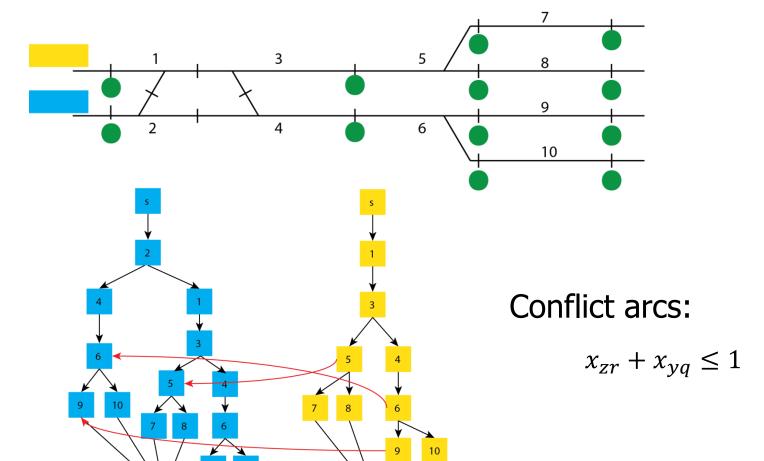
Resource trees Blocking times





## Preprocessing (3)

Resource trees Blocking times





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- Multi-commodity flow problem
- Train = commodity

- Objective
  - Max quality of chosen routes (short running times)

$$Maximize \sum \sum w_{zr} x_{zr}$$

- Constraints
  - Capacity constraints
  - Flow conservation
  - Conflict constraints

$$\sum_{x_{zr} \in s_z} x_{zr} = -1 \qquad \sum_{x_{zr} \in t_z} x_{zr} = 1$$

Caimi (2009)



#### Introduction | Motivation | Methodology | Case study | Discussion

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- Extension of TRP model 1. robustness
  - 2. capacity occupation

- Robustness = increase buffers between train routes (Caprara et al. 2011)
- For two train routes

$$Buffer\ cost = \begin{cases} big\ M, & \text{independent routes,} \\ minimum\ headway, & \text{otherwise.} \end{cases}$$

Buffer costs are assigned between leaves of resource trees

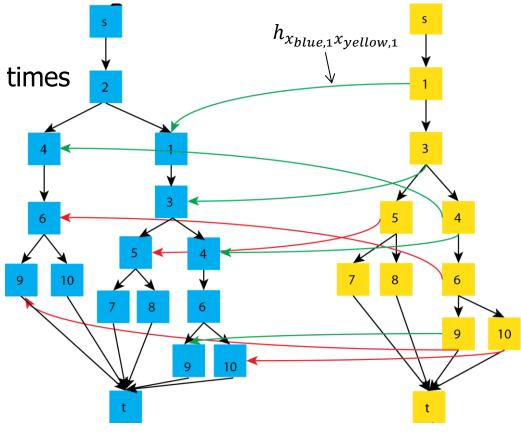


- Capacity occupation is a summation of critical processes as minimum headways, scheduled running or dwell times
- Capacity occupation = critical (longest) path over *chosen* routes
- Lower capacity occupation provides more time allowances (i.e., better stability)
- To evaluate capacity occupation minimum headways are needed
- Add arcs with weights that correspond to minimum headways



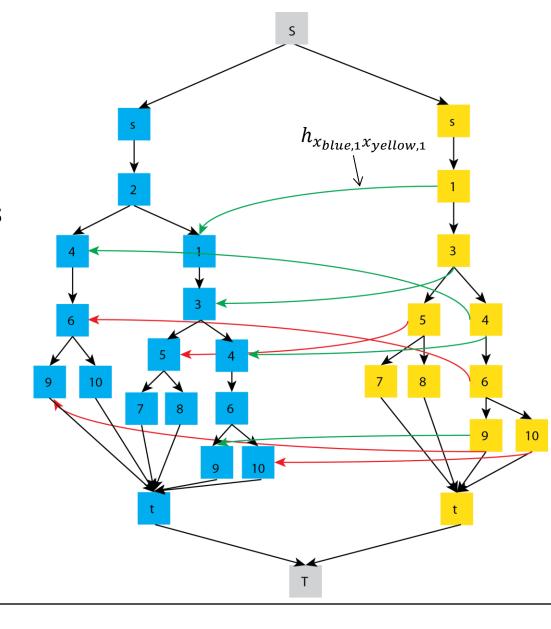
• Headway arcs  $h_{x_{ir}x_{jr}}$ 

Computed based on blocking times





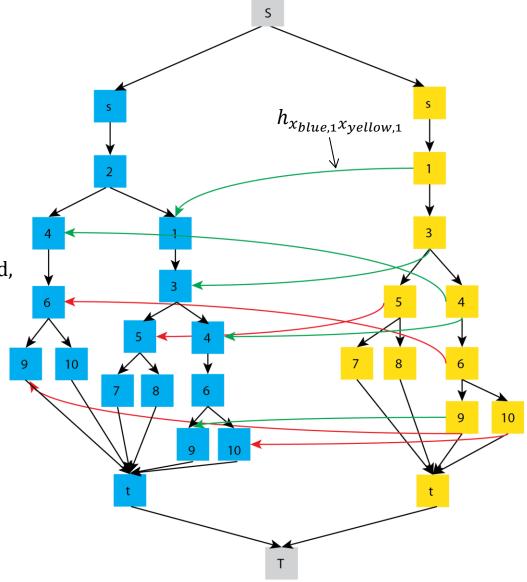
- Headway arcs  $h_{x_{ir}x_{jr}}$
- Add source and sink nodes





- Active headways depend on selected routes
- Active headway arcs

Active  $hw = \begin{cases} 1, & \text{both resources selected,} \\ 0, & \text{otherwise.} \end{cases}$ 

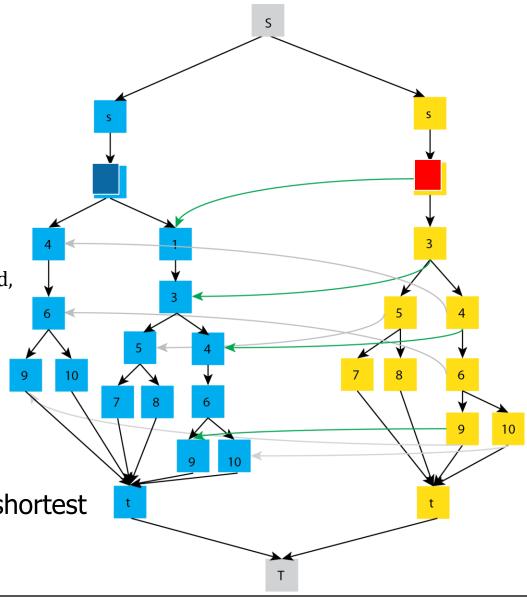




- Active headways depend on selected routes
- Active headway arcs

Active 
$$hw = \begin{cases} 1, & \text{both resources selected,} \\ 0, & \text{otherwise.} \end{cases}$$

- Directed acyclic graph
- Find the critical path
- Adjusted LP formulation for shortest path problem





- Objectives
  - Max quality of chosen routes
  - Max robustness
  - Min capacity occupation (critical path)
- Constraints
  - Capacity constraints
  - Flow conversation
  - Conflict constraints
  - Active headways
  - Shortest path constraints
  - Maximum permitted capacity occupation
- Developed heuristics for solving RTRP



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#### RTRP heuristics

- Local search algorithm
- Main components
  - Capacity assessment (CA)
  - Robustness evaluation (RE)
  - Improvement rules (IR)
- Algorithm of the RTRP heuristics

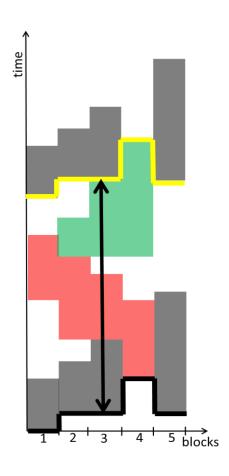
```
Input: route plan RP
Initialize bestRP := RP
While iter < maxIter OR not converged
     Compute capacity occupation CA
     Compute delay propagation RE
     totalCost(RP) := cost(CA) + cost(RE)
     if totalCost(RP) < totalCost(bestRP)
               bestRP := RP
     end if
     vary routes in RP (IR)
End while
```



#### RTRP heuristics

- Capacity assessment
  - Compression method (UIC 406)
  - Microscopic model
  - Algebraic approach = Max-plus automaton
  - All train dependencies naturally considered
  - Output: capacity occupation, resources at the critical path, occupation of each resource

- Robustness evaluation
  - Delay propagation model
  - Input: set of delay realisations R
  - Output: average delay D





## Methodology

#### Route permutations

- Substitute bad train routes
- Exclusion (E) and inclusion (I) rules for alternating routes in the route plan
- E-rules. Choose a route that:
  - has a resource is on the critical path
  - uses a platform with the highest occupation
  - generates the most delays
- *I-rules*. Choose a route that:
  - Does not use a resource on a critical path
  - Does not use the highest utilised platform
  - Is not conflicting with existing routes in the route plan



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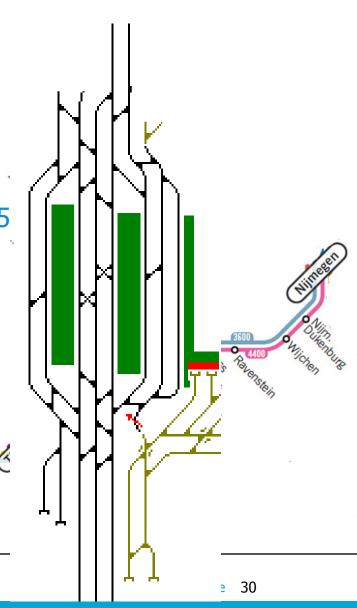


- Station Den Bosch
- 14 trains lines with periodicity of 2 trains/h
- Input: computed timetable

Besinovic et al. 2015

Table 1. Input parameters

Period (s)	1800
# of platforms	6
# of routes	91
maxIter	500
convIter (iterations without improvement)	100





#### Initial results

- Heuristics performance
- 30 repeated runs of RTRP heuristics
- Weights for CA and RE are equal

Table 1. Heuristics convergence

Parameters	Mean (s)	Standard deviation (%)
Total cost (s)	1135	0.73
# of iterations	165	34.57



#### Initial results

- Test single submodels CA and RE vs CA+RE
- CA = original TRP

Table 2 Results of individual submodels

	Capacity occupation (s)	Average delay (s)	Total cost (s)	Number of resources used	
Only CA	801	796	1597	72	
Only RE	956	301	1257	58	
CA & RE	821	314	1135	70	



#### Conclusion

- New multiobjective MILP formulation for robust train routing problem
- Promising heuristics for solving RTRP
- Optimized route plan fulfils
  - Proven feasibility (at microscopic level)
  - Capacity consumption reduced
  - Improved robustness
  - More even resource usage => less frequent maintenance

- Future work
  - Compare results with the optimal solution
  - Flexible event times
  - Evaluate the effect of different weights for CA and RE





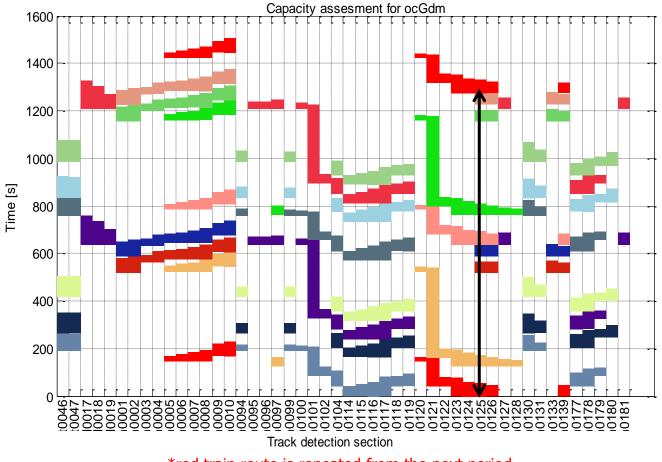


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#### Optimized route plan



\*red train route is repeated from the next period

