



# Meeting functional requirements for real-time railway traffic management with mathematical models

Ambra Toletti – Marco Laumanns – Peter Grossenbacher – Ulrich Weidmann

Conference on Advanced Systems in Public Transport **CASPT 2015**

# Literature reviews

- **Cordeau JF, Toth P, Vigo D (1998)** A survey of optimization models for train routing and scheduling. *Transportation Science* 32(4):380–404
- **Törnquist J (2006)** Computer-based decision support for railway traffic scheduling and dispatching: A review of models and algorithms. In: Kroon LG, Möhring RH (eds) 5th Workshop on Algorithmic Methods and Models for Optimization of Railways (ATMOS'05), Schloss Dagstuhl–Leibniz-Zentrum fuer Informatik, Dagstuhl, Germany, OpenAccess Series in Informatics (OASlcs), vol 2, DOI 10.4230/OASlcs.ATMOS.2005.659
- **Lusby RM, Larsen J, Ehrgott M, Ryan D (2011)** Railway track allocation: models and methods. *OR Spectrum* 33(4):843–883, DOI 10.1007/s00291-009-0189-0
- **Corman F, Meng L (2013)** A review of online dynamic models and algorithms for railway traffic control. In: *Intelligent Rail Transportation (ICIRT)*, 2013 IEEE International Conference on, pp 128–133, DOI 10.1109/ICIRT.2013.6696281
- **Cacchiani V, Huisman D, Kidd M, Kroon L, Toth P, Veelenturf L, Wagenaar J (2014)** An overview of recovery models and algorithms for real-time railway rescheduling. *Transportation Research Part B: Methodological* 63(0):15 – 37, DOI 10.1016/j.trb.2014.01.009

# Modelling needs assumptions...

A farmer has some chickens who don't lay any eggs. The farmer calls a physicist to help. The physicist does some calculation and says "I have a solution but it only works for spherical chickens in a vacuum!".



# Contents

- Introduction and motivation
- Functional requirements
- Mathematical models
- Meeting functional requirements with mathematical models
- Conclusion and outlook

# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

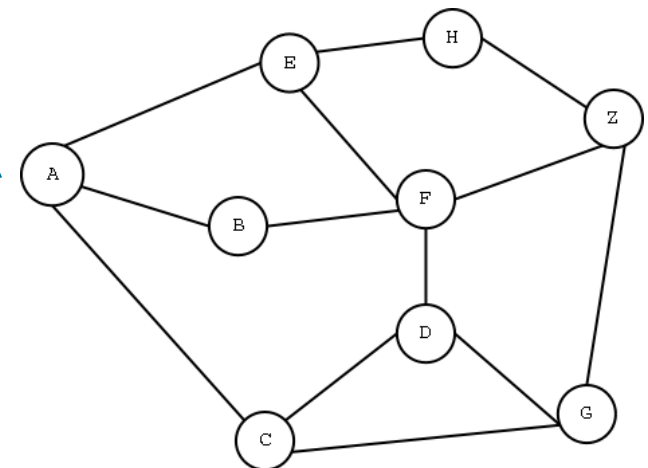
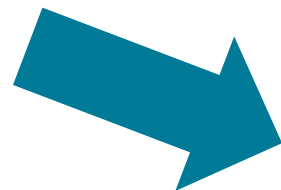
# Functional requirements from real-time traffic management

Infrastructure



Rolling Stock

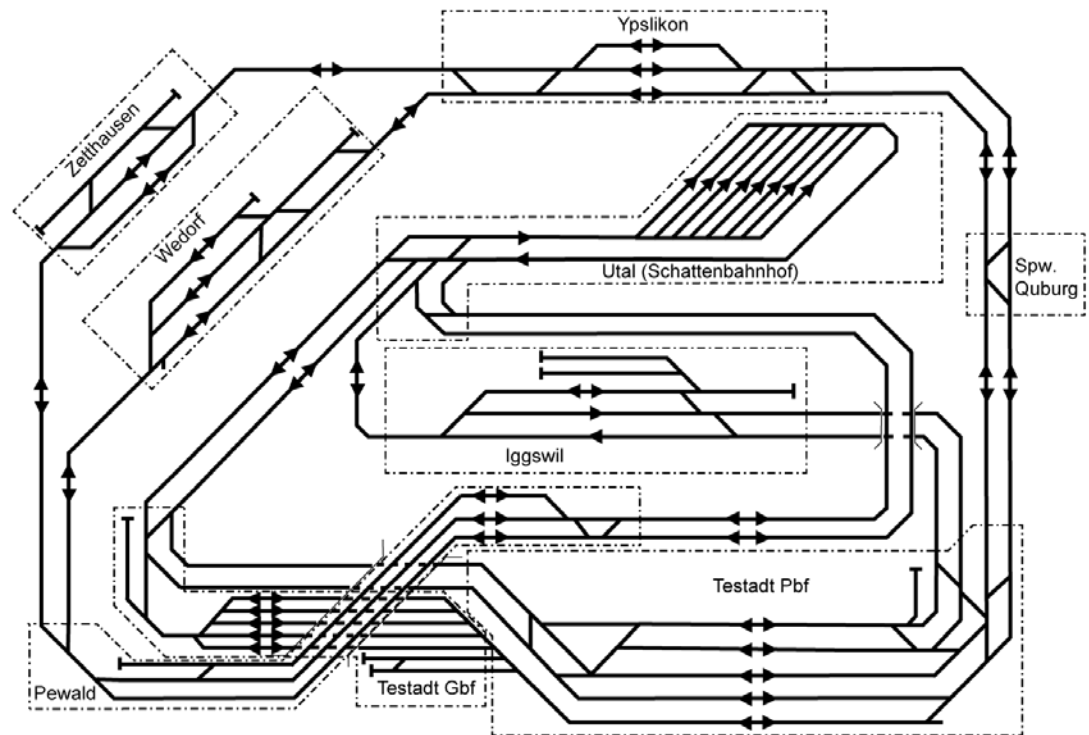
Operations



# Example: Railway network of the Railway operations laboratory (EBL) at the ETH Zurich



Source: archive of the institute for transport planning and systems (IVT)

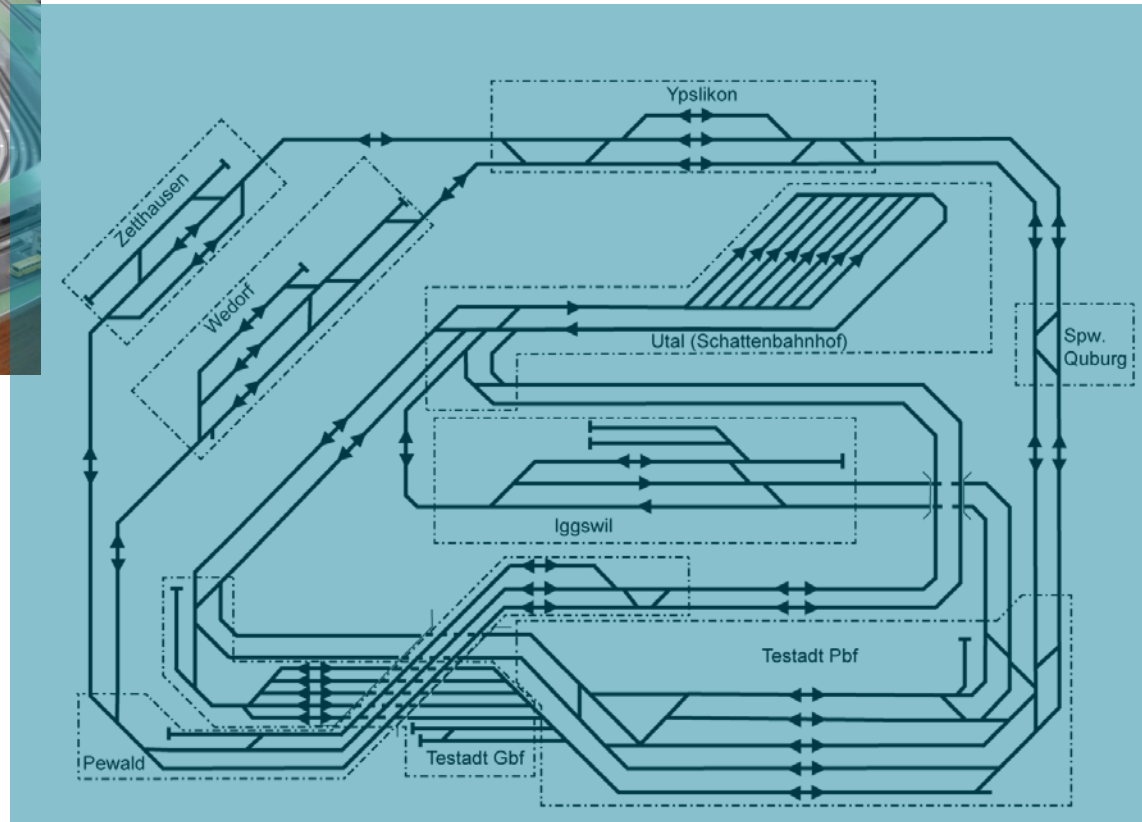




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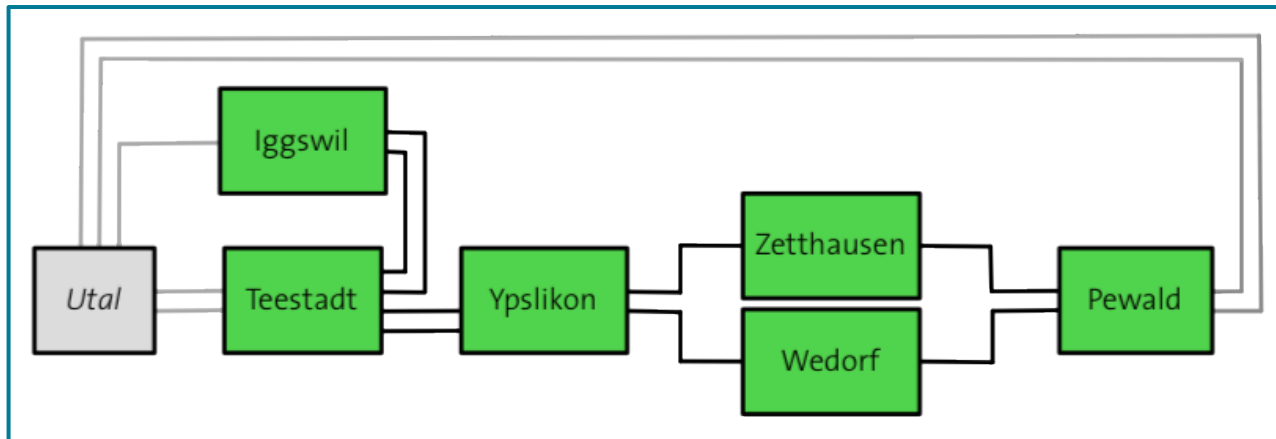


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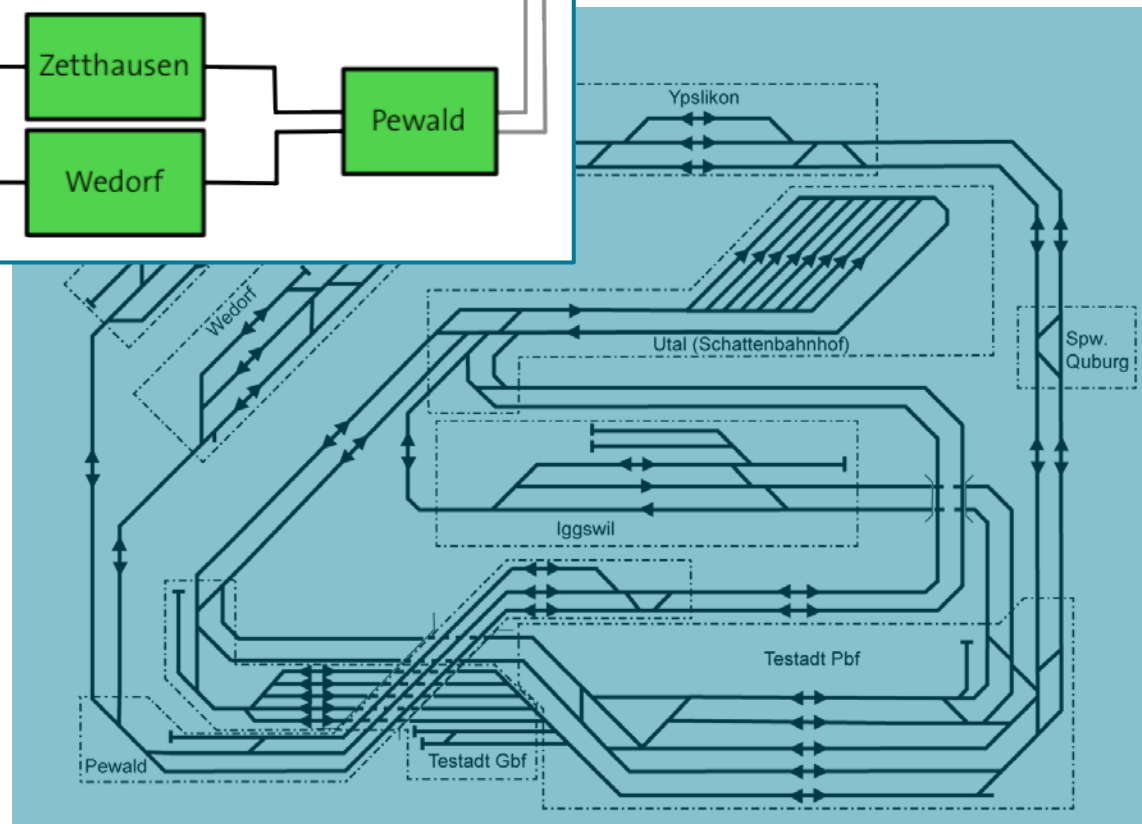


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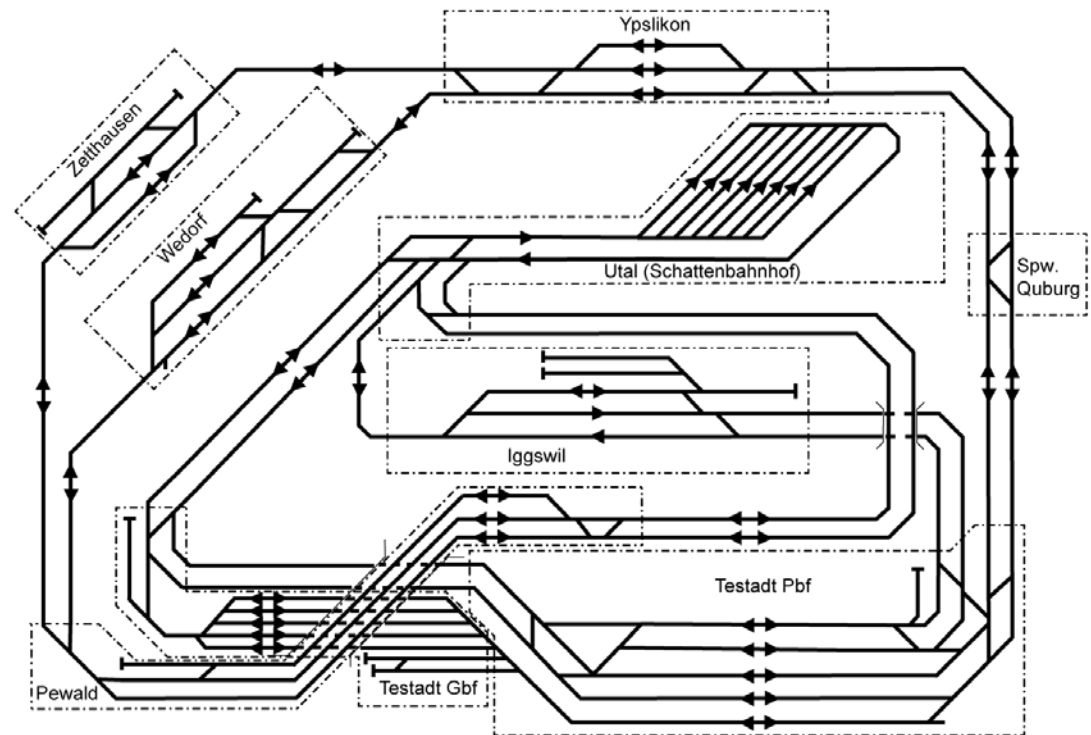
- Macroscopic representation of the entire network

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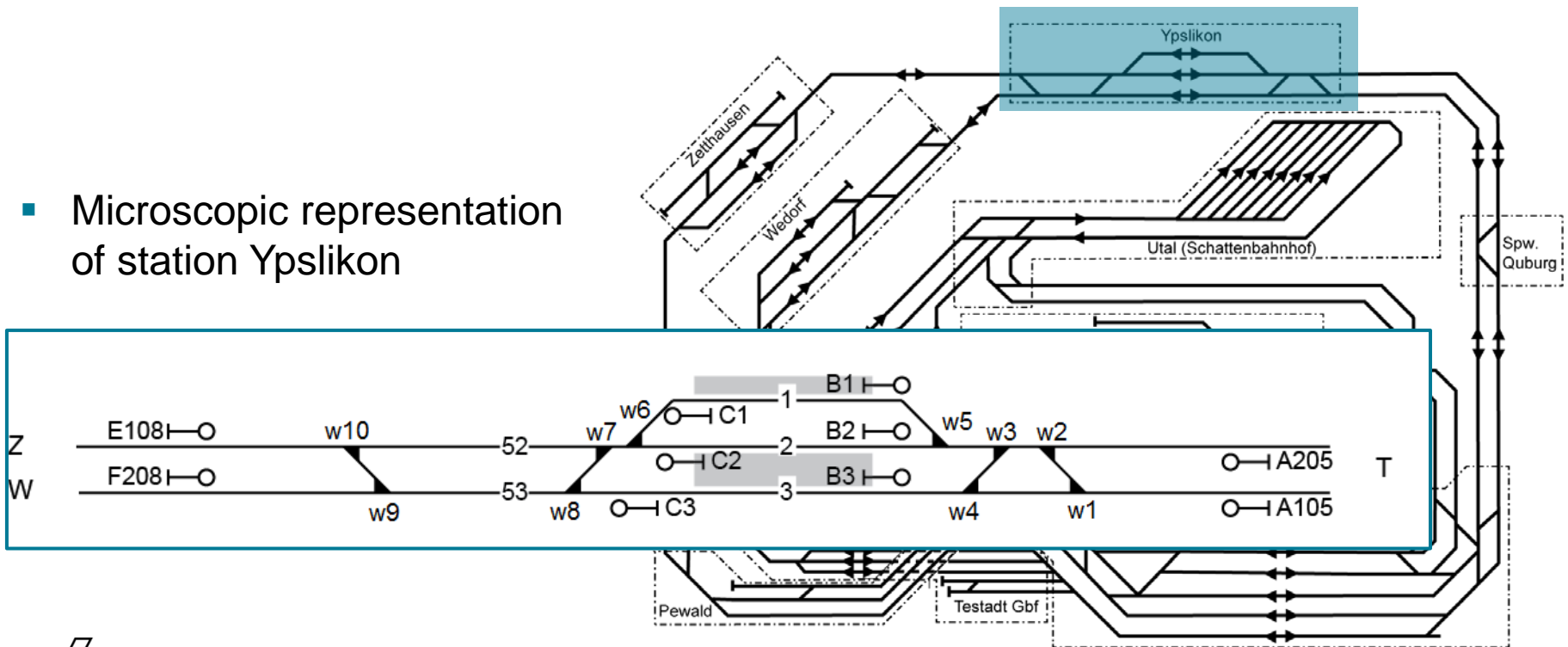
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# Example: Railway network of the Railway operations laboratory (EBL) at the ETH Zurich

Source: archive of the institute for transport planning and systems (IVT)

- Microscopic representation of station Ypslikon



# Functional requirements from real-time traffic management

## Infrastructure

- Macroscopic
- Microscopic

## Rolling Stock

## Operations

# Functional requirements from real-time traffic management

## Infrastructure

- Macroscopic
- Mesoscopic
- Microscopic

## Rolling Stock

## Operations

# Functional requirements from real-time traffic management

## Infrastructure

- Macroscopic
- Mesoscopic
- Microscopic

## Rolling Stock

## Operations

### **Functional requirement** (Radtke 2014)

”the microscopic infrastructure is not only suitable but even mandatory for exact running time calculation, timetable construction, possession planning and railway operational simulation, conflict detection and resolution.”

Radtke A (2014) Infrastructure modelling. In: Hansen IA, Pachl J (eds) Railway Timetabling and Operations, 2nd edn, Eurail press, Hamburg, Germany, chap 3, pp 47–63.



# Functional requirements from real-time traffic management

## Infrastructure

- Macroscopic
- Mesoscopic
- Microscopic

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## Operations

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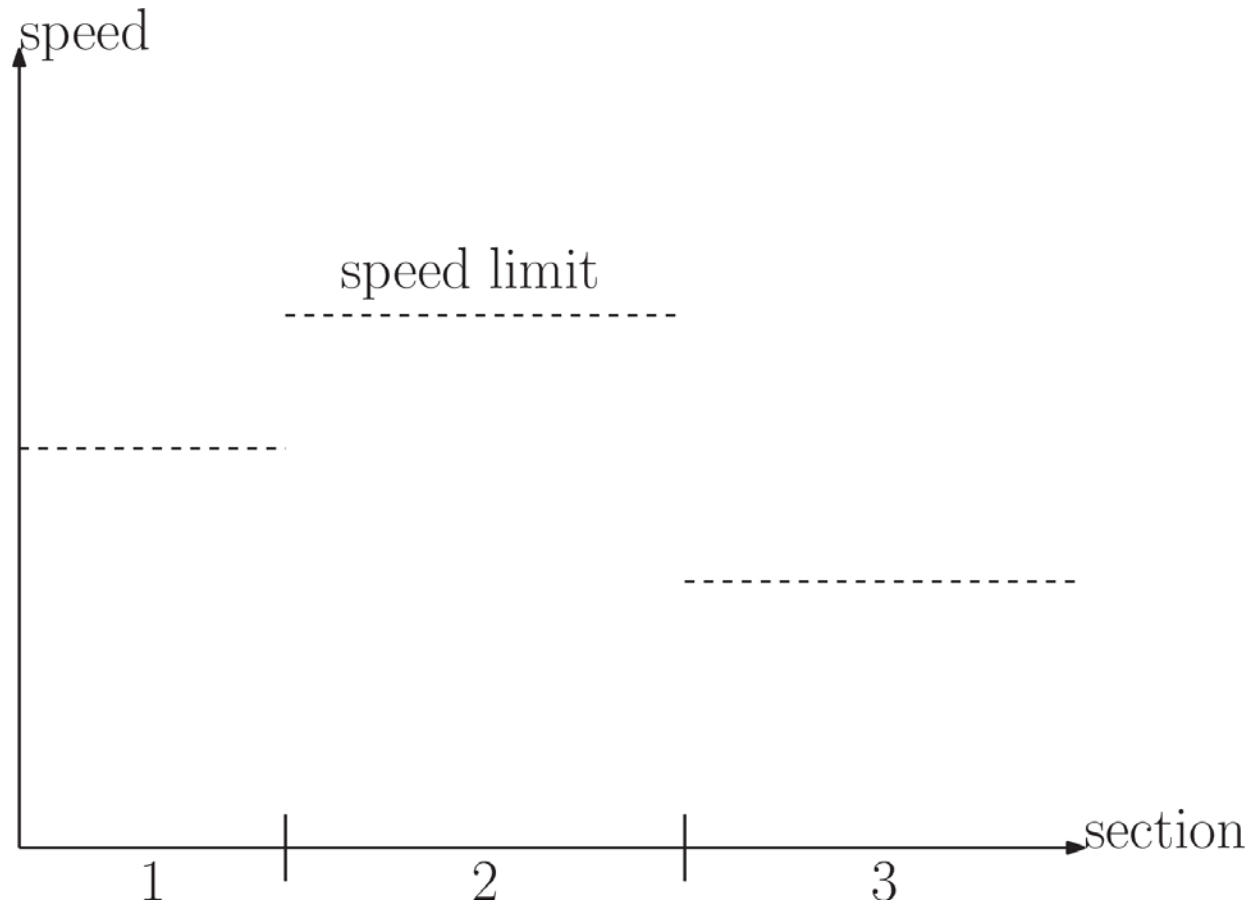
Infrastructure

Rolling Stock

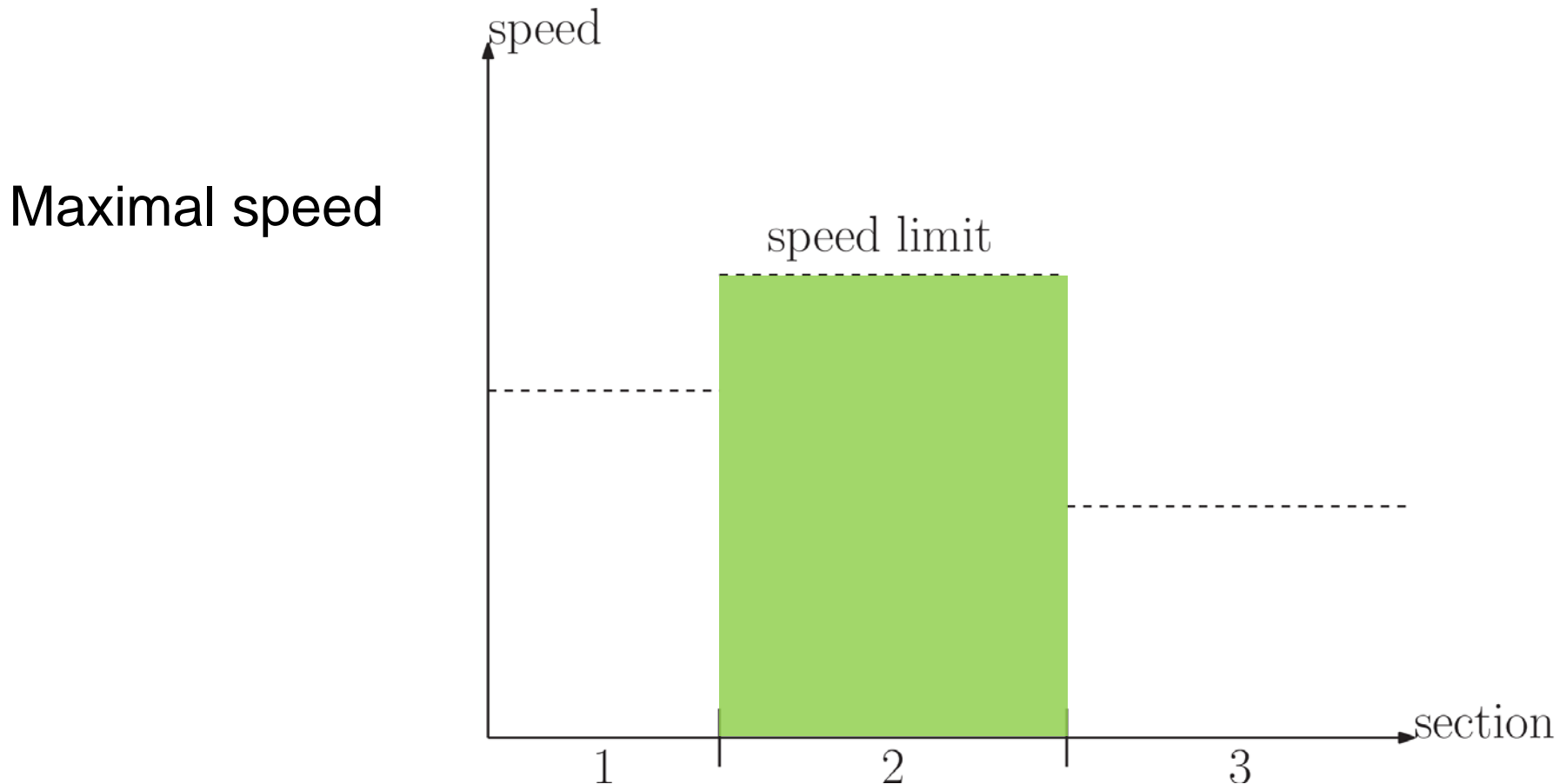
Operations



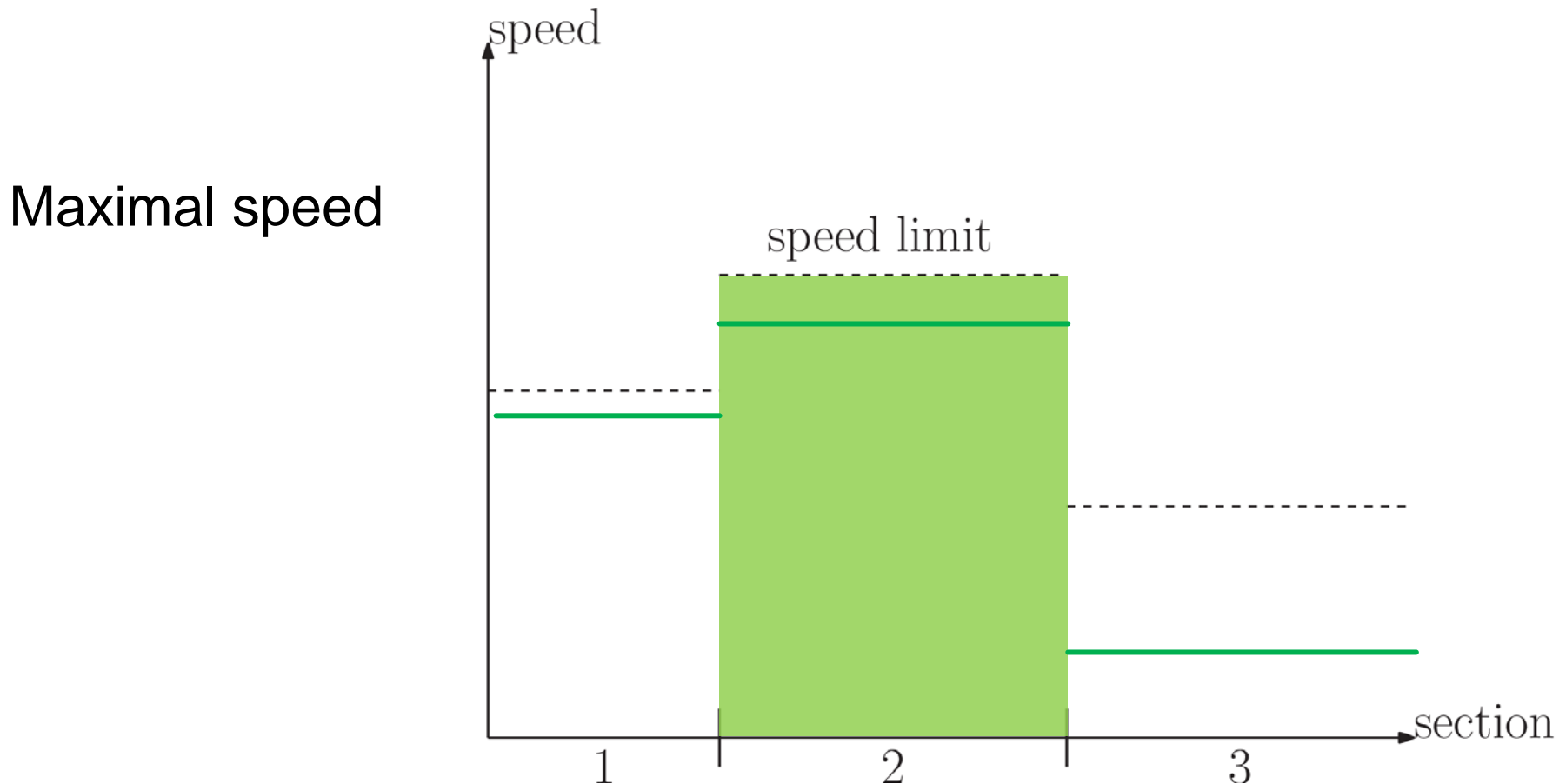
# Example: Speed limits on consecutive sections



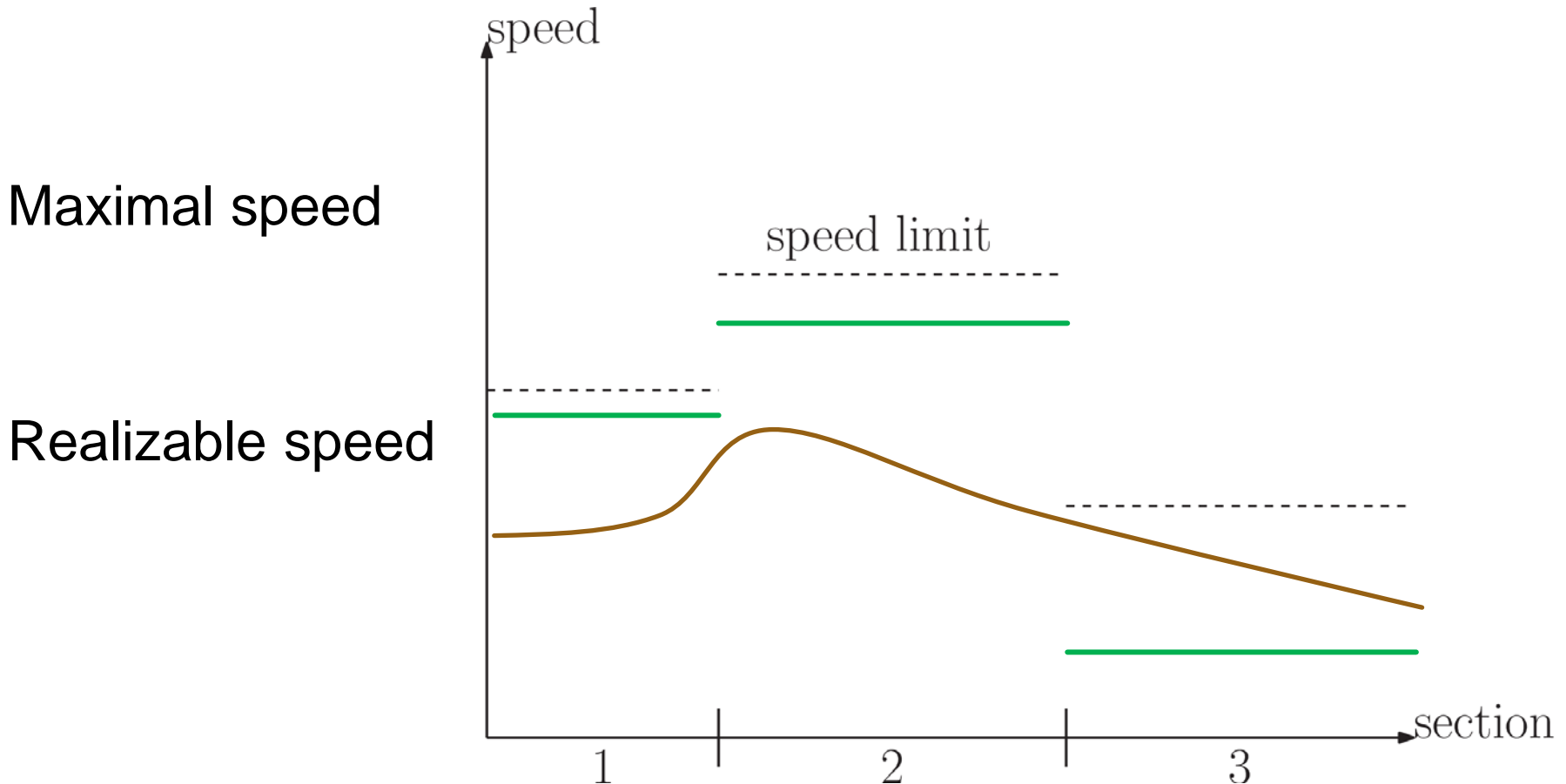
# Example: Speed limits on consecutive sections



# Example: Speed limits on consecutive sections



# Example: Speed limits on consecutive sections





# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

- Maximal speed
- Realizable speed

# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

- Maximal speed
- Realizable speed
- Length



# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

- Maximal speed
- Realizable speed
- Length



# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

- Monitoring

# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

Travel with	Dep.	Prognosis	To	Platform/Station	Occupancy
IC 982	17:32	ca. +7 min	Basel SBB Olten 17:32 - Liestal 17:47 - Basel SBB 17:59	7	1.  2.
ICN 1532	17:40	ca. +3 min	Lausanne Olten 17:40 - Solothurn 17:56 - Biel/Bienne 18:13 - Neuchâtel 18:32 - Yverdon-les-Bains 18:51 - Lausanne 19:15	8	1.  2.
S 29 6673	17:42		Turgi Olten 17:42 - Dulliken 17:45 - Däniken 17:48 - Schönenwerd SO 17:50 • Aarau 17:56 - Rupperswil 18:01 - Wildegg 18:06 - Holderbank AG 18:09 - Brugg AG 18:17 - Turgi 18:26	9	1.  2.
S 3 17366	17:48		Porrentruy Olten 17:48 - Tecknau 17:54 - Gelterkinden 17:59 - Sissach 18:02 • Liestal 18:10 - Basel SBB 18:26 - Aesch 18:48 - Laufen 19:02 - Delémont 19:17 - Porrentruy 19:52	11	1.  2.
IR 2475	17:49		Luzern Olten 17:49 - Zofingen 17:56 - Sursee 18:10 - Luzern 18:30	12	1.  2.
(Olten - Luzern) Construction work: Brittnau-Wikon - Dagmersellen (SBB CFF FFS) IR Olten - Luzern Between Brittnau-Wikon and Dagmersellen on the Olten - Luzern line, only limited train services are operating. IR Olten - Luzern					
More					

- Monitoring
  - Punctuality





# Functional requirements from real-time traffic management

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Rolling Stock

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IC 982	17:32	ca. +7 min	Basel SBB Olten 17:32 - Liestal 17:47 - Basel SBB 17:59	7	1. ■■■ 2. ■■■
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S 29 6673	17:42		Turgi Olten 17:42 Schönenwe Rapperswil AG 18:09 - E		
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IR 2475	17:49		Luzern Olten 17:49 Luzern 18:3		
					
 (Olten - Luzern) Construction work: Brittnau-Wi Brittnau-Wikon and Dagmersellen on the Olten - L <a href="#">More</a>					

- Monitoring
  - Punctuality
  - Infrastructure

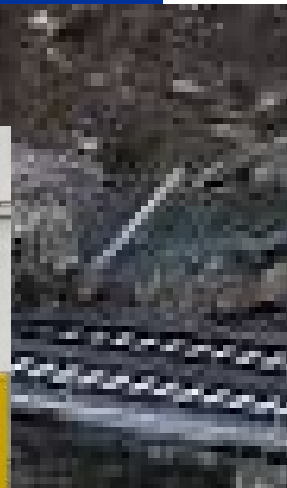
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S 29 6673	17:42		Turgi Olten 17:42 Schönenwe		
S 3 173					
IR 2475					



- Monitoring
  - Punctuality
  - Infrastructure
  - Rolling Stock

# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

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S 29 6673	17:42		Turgi Olten 17:42 Schönenwe		
S 3 173					
IR 2475					



- Monitoring
  - Punctuality
  - Infrastructure
  - Rolling Stock
  - Staff

# Functional requirements from real-time traffic management

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Rolling Stock

Operations

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- Monitoring
  - Punctuality
  - Infrastructure
  - Rolling Stock
  - Staff

# Functional requirements from real-time traffic management

Infrastructure

Rolling Stock

Operations

## Functional requirement (Corman and Meng 2013)

Actions considered by rescheduling:

- re-timing an event (e.g. the arrival at or the departure from a station);
- re-ordering trains on a shared infrastructure;
- local re-routing (e.g. platform change);
- global re-routing;
- re-servicing. ← Breaking connections, cancelling trains, skipping or adding stops

- Monitoring
  - Punctuality
  - Infrastructure
  - Rolling Stock
  - Staff
- Intervention

Corman F, Meng L (2013) A review of online dynamic models and algorithms for railway traffic control. In: Intelligent Rail Transportation (ICIRT), 2013 IEEE International Conference on, pp 128–133, DOI 10.1109/ICIRT.2013.6696281

# Mathematical models

## Continuous time

- Event Scheduling Problem (ESP);
- Alternative Graph (AG);
- Flexible Path (FP).

## Discrete time

- Arc Packing Problem (APP) and its weak version (APP');
- Path Packing Problem (PPP);
- Arc Configuration Problem (ACP);
- Path Configuration Problem (PCP);
- Resource Tree Conflict Graph (RTCG) and Tree Conflict Graph (TCG);
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- REFormulated Simultaneous train Rerouting and Rescheduling (REF-SRR).

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# Mathematical models

## Continuous time

- Discrete events:  $v_S^z$
- Times:  $t_S^z \geq 0$
- Fixed routes
  - Train run:

$$cType : t_{S_2}^z - t_{S_1}^z \geq f_{(S_1, S_2)}^z$$

## Discrete time



# Mathematical models

## Continuous time

- Discrete events:  $v_S^z$
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## Discrete time

- $\underline{cRun}$ : minimum running time
- $\overline{cRun}$ : maximum running time
- $\underline{cDwell}$ : minimum dwell time
- $\overline{cDwell}$ : maximum dwell time
- $\underline{cPass}$ : earliest time\*
- $\overline{cPass}$ : latest time
- $\underline{cOverall}/\overline{cOverall}$  :  
minimum/maximum running time  
from the departure from the first  
station v to the arrival at destination

\* Sometimes referred to as passing constraints

# Mathematical models

## Continuous time

- Discrete events:  $v_S^z$
- Times:  $t_S^z \geq 0$
- Fixed routes
  - Train run:

$$cType : t_{S_2}^z - t_{S_1}^z \geq f_{(S_1, S_2)}^z$$

- Interactions

$$cType : t_{S_2}^w - t_{S_1}^z \geq f_{(S_1, S_2)}^{z,w}$$

$$cHead : (t_{S_3}^w - t_{S_2}^z \geq f_{(S_1, S_2, S_3, S_4)}^{z,w}) \vee (t_{S_1}^z - t_{S_4}^w \geq f_{(S_1, S_2, S_3, S_4)}^{w,z})$$

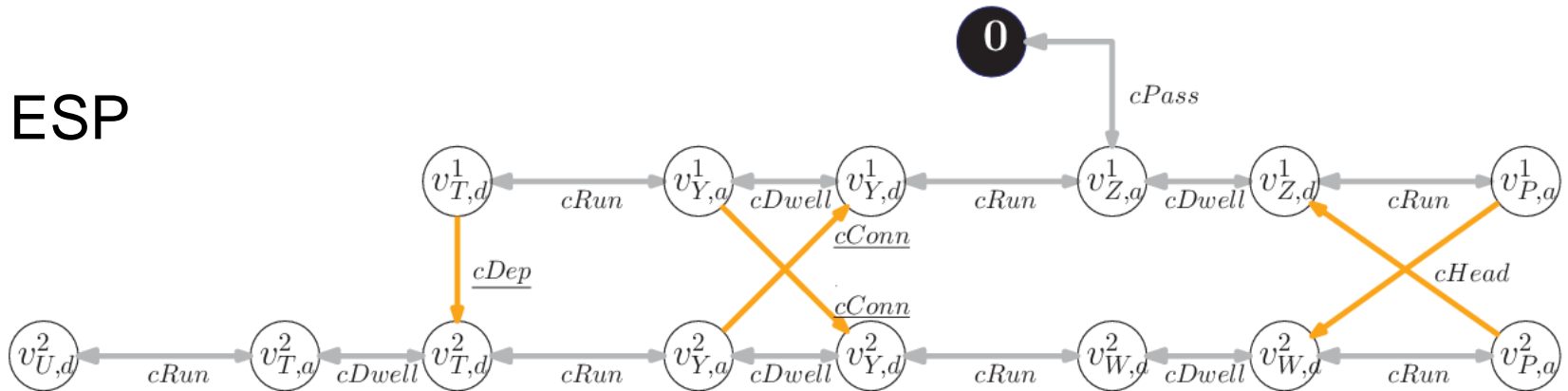
## Discrete time

- $\underline{cConn}$ : minimum connection time
- $\overline{cConn}$ : maximum connection time
- $cDep/\overline{cDep}$  : minimum/maximum

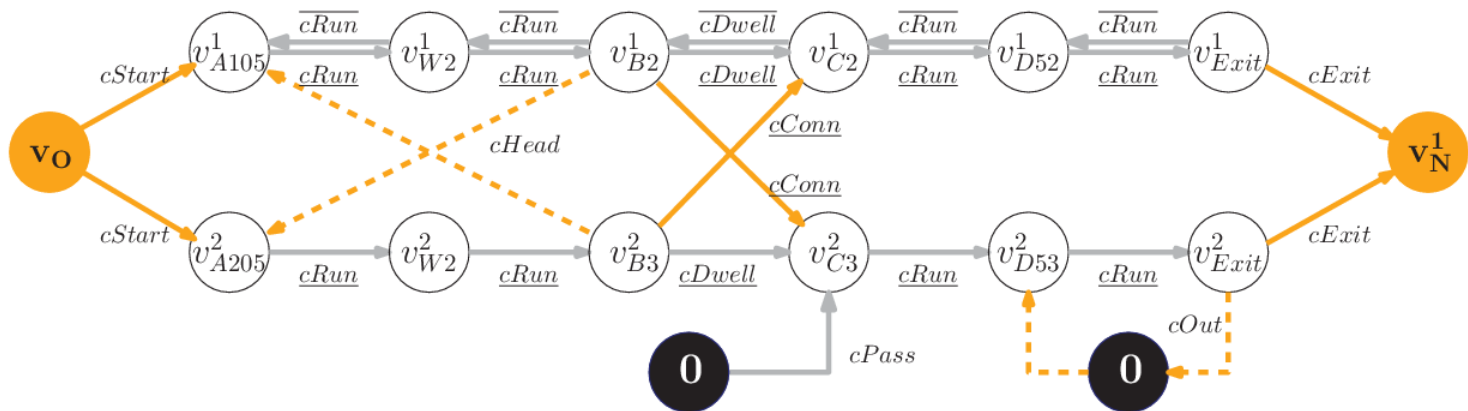
\*\* usually defined for ESP only

# Mathematical models

## ■ ESP



## ■ AG



# Mathematical models

## Continuous time

- Discrete events:  $v_S^Z$
- Times:  $t_S^Z \geq 0$
- With routing:  $x_S^Z \in \{0,1\}$

$$\begin{cases} x_{O_z}^z = 1 \\ x_{D_z}^z = 1 \end{cases} \quad \forall z$$

$$\sum_{i \in \delta_-(J)} x_i^z = \sum_{v \in \delta_+(J)} x_i^z \quad \forall J, \forall z$$

## Discrete time

# Mathematical models

## Continuous time

- Discrete events:  $v_S^z$
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## Discrete time

-Train run:

$$cType : t_{S_2}^z - t_{S_1}^z + M(1 - x_i^z) \geq f_{(S_1, S_2)}^z$$

-Interactions

$$cType : t_{S_2}^w - t_{S_1}^z + M(1 - x_i^z) + M(1 - x_j^w) \geq f_{(S_1, S_2)}^{z,w}$$

$$cHead : t_{S_3}^w - t_{S_2}^z + Mh_i^{z,w} + M(1 - x_j^z) + M(1 - x_k^w) \geq f_{(S_1, S_2, S_3, S_4)}^{z,w}$$

$$t_{S_1}^z - t_{S_4}^w + M(1 - h_i^{z,w}) + M(1 - x_j^z) + M(1 - x_k^w) \geq f_{(S_1, S_2, S_3, S_4)}^{w,z}$$

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# Mathematical models

## Continuous time

- Action:  $a$
- Decision:  $x_a^z \in \{0,1\}$ 
  - Train run: Uniqueness and continuity

$$\sum_{a \in \delta_+(s_z)} x_a^z \leq 1 \quad \forall z$$

$$\sum_{a \in \delta_+(v)} x_a^z - \sum_{a \in \delta_-(v)} x_a^z = 0 \quad \forall v \notin \{s_z, t_z\}, \forall z$$

- Decision for a sequence of actions:  $x_p^z \in \{0,1\}$ 
  - Train run: uniqueness:

$$\sum_p x_p^z \leq 1 \quad \forall z$$

## Discrete time



# Mathematical models

## Continuous time

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  - Train run: uniqueness:

$$\sum_p x_p^z \leq 1 \quad \forall z$$

## Discrete time

- $aStart$ : departures from the first node;
- $aEnd$ : arrivals at the last station;
- $aRun$ : runs;
- $aDwell$ : dwells in stations;
- $aInfeasibility$ : infeasibility

# Mathematical models

## Continuous time

- Action:  $a$
- Decision:  $x_a^z \in \{0,1\}$ 
  - Conflicts

$$\sum_{(z,a) \in C} x_a^z \leq 1 \quad \forall C \in \mathcal{C}_r, r$$

$$x_a^z + x_b^w \leq 1$$

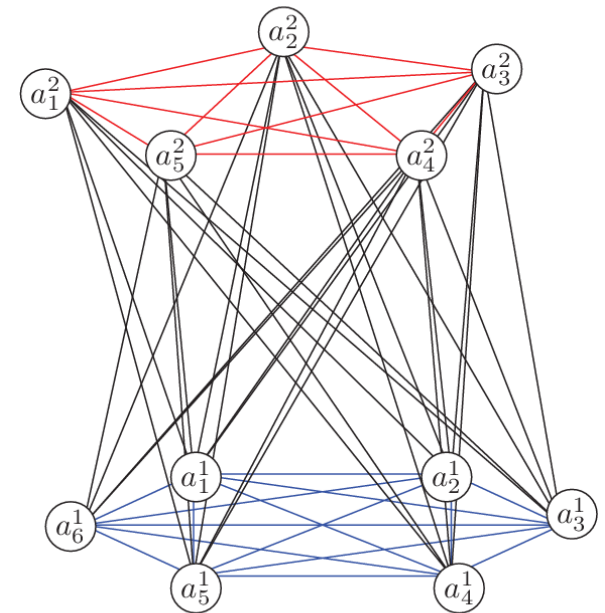
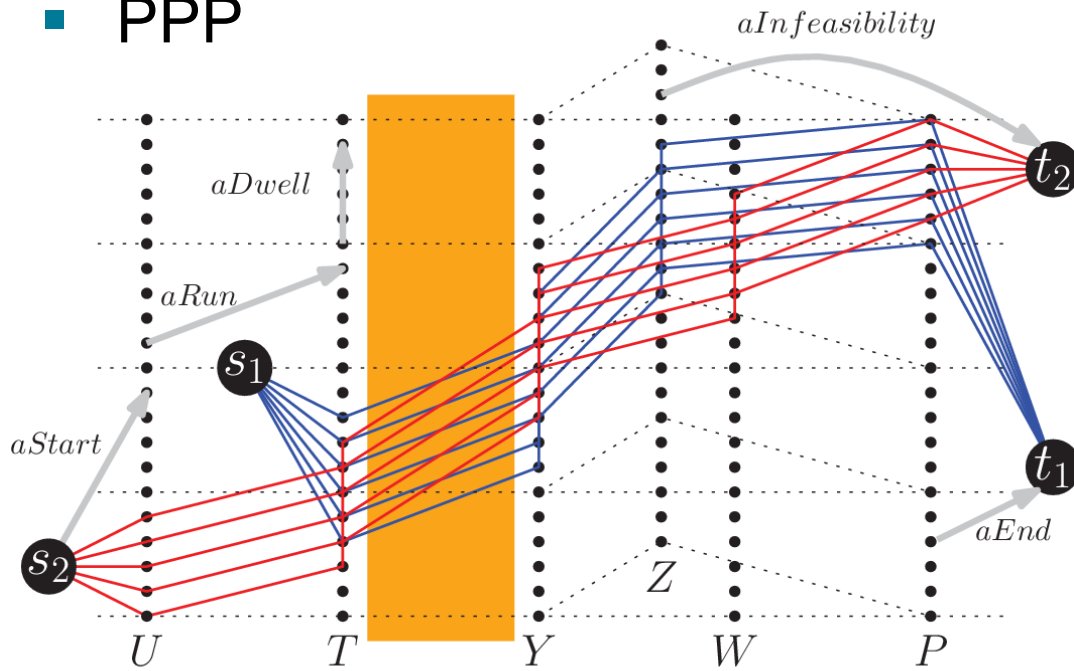
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  - Conflicts:

$$\sum_{(z,p) \cap C \neq \emptyset} x_p^z \leq 1 \quad \forall C \in \mathcal{C}_r, r$$

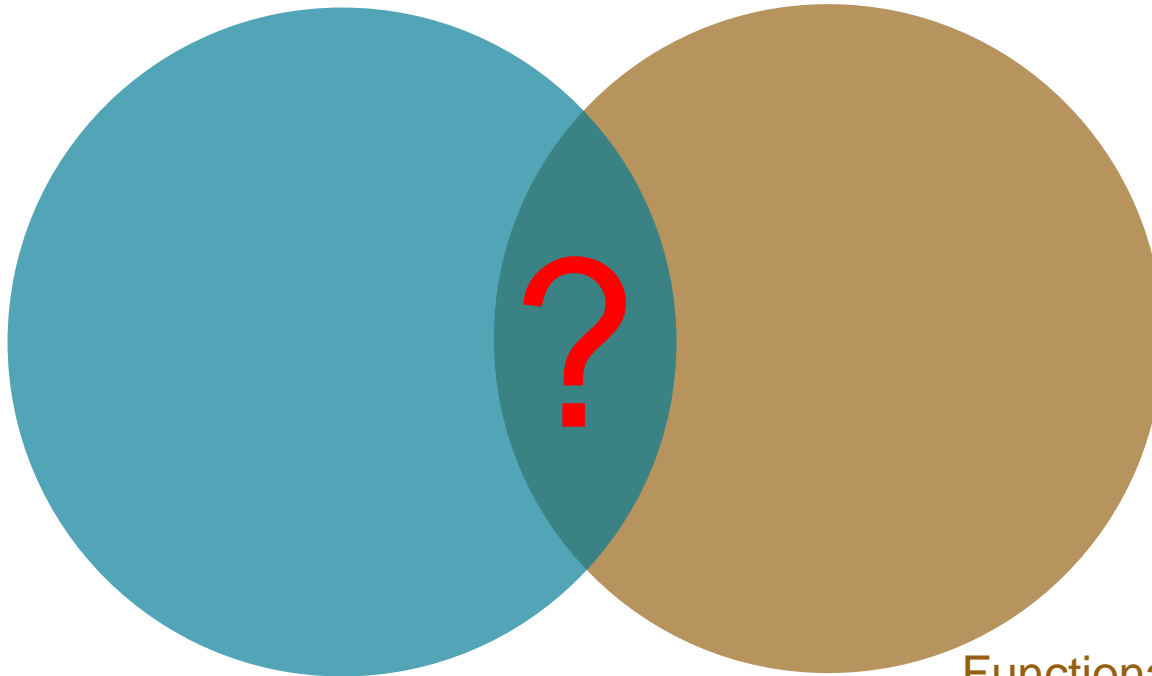
## Discrete time

# Mathematical models

## ■ PPP



Mathematical Models



Functional requirements

# Meeting functional requirements with mathematical models

**Table 1** Models and functional requirements: × means that the model satisfies the functional requirement; (×) means that the requirement is satisfied off-line (i.e. for timetabling); ○ means that there is a model extension which satisfies the requirement

		continuous time			discrete time						
		ESP	AG	FP	APP'	TCG	APP/ ACP	RTCG	REF- SRR	PPP/ PCP	RCG
infrastructure	macroscopic	×	×	×	×	×	×	×	×	×	×
	microscopic	×	×	×	×	×	×	×	×	×	×
rolling stock	max. speed	×	×	×	×	×	×	×	×	×	×
	real. speed	×	○	×	×	×	○	×	×	×	×
operations	timetable		×	×					×		×
	closed tracks		×	×					×		×
	re-timing	(×)	×	×	(×)	(×)	(×)	(×)	×	(×)	×
	re-ordering	(×)	×	×	(×)	(×)	(×)	(×)	×	(×)	×
	re-routing		○	×	(×)	(×)	(×)	(×)	×	(×)	×
	connections		○	×							×
cancel train		○	×	(×)	(×)	(×)	(×)	×	(×)	×	
		pairwise conflicts					on tracks		on paths		
							conflict cliques				

## Conclusion and outlook

- Models that satisfy all the functional requirements identified exist.
- Some models are very similar to each others.
- Future work:
  - Develop a model for rescheduling starting from the current existing models, which already satisfy the functional requirements.
  - Take advantage of the similarity with scheduling models that have fast solving techniques.

# Thank you for your kind attention!

Questions?