

# Real-time High Speed Train Rescheduling in Case of A Partial Segment Blockage

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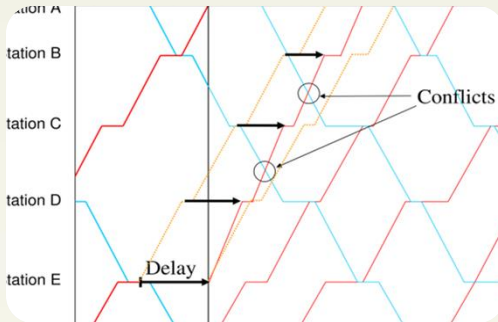
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# Outline

- 1 introduction
- 2 Problem description
- 3 Model formulation
- 4 Rolling horizon approach
- 5 Experimental setting
- 6 Experimental results
- 7 Conclusion

# Introduction

## Research Significance



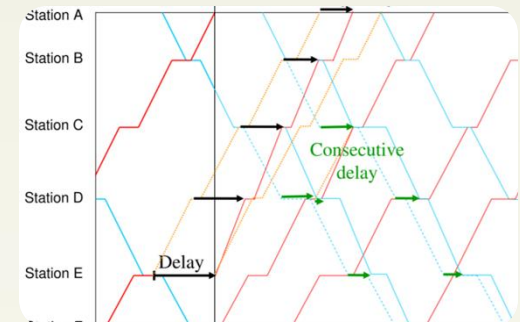
### Factors

- ❑ External and internal factors
- ❑ Few previous research



### Manually

- ❑ Train rescheduling is mainly done by dispatchers



### Practical significance

- ❑ Real-time train rescheduling is very important in helping dispatchers to reschedule trains

# Introduction

## Research content

This paper focuses on high speed train rescheduling on a long high speed line with a dense traffic in a partial segment blockage.

The main contributions are as follow:

- Reschedule trains on a long high speed line with a dense traffic and a non-periodic timetable.
- Various types of trains and trains with different stopping patterns.
- Trains are allowed to arrive earlier than scheduled.
- No anticipation on the occurrence and the duration of the disruption is priori unknown.

# Problem description

## track layout and train types

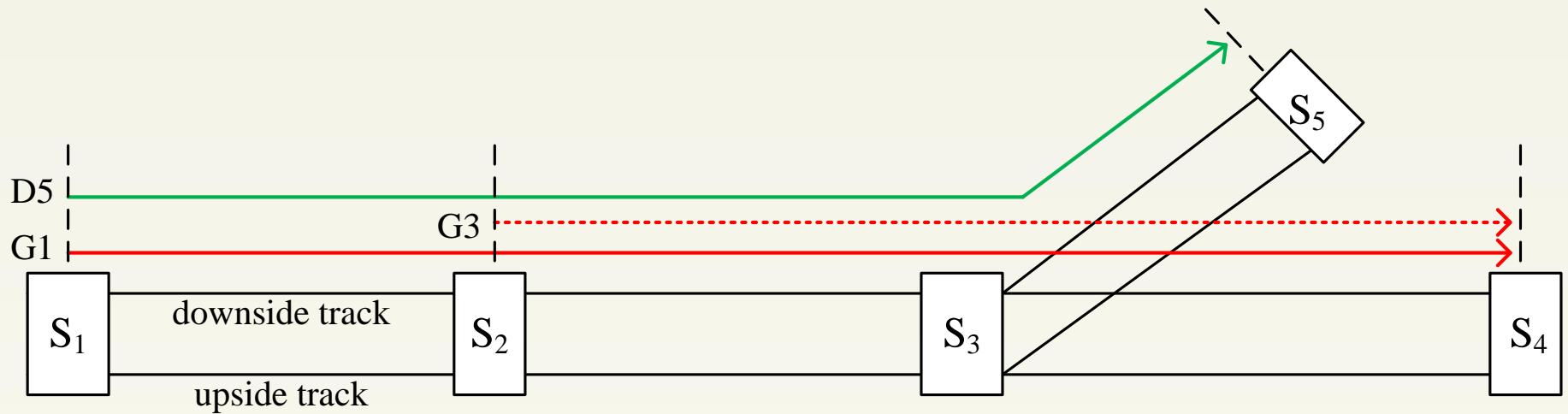


Fig.1 Track layout and various types of trains

# Problem description

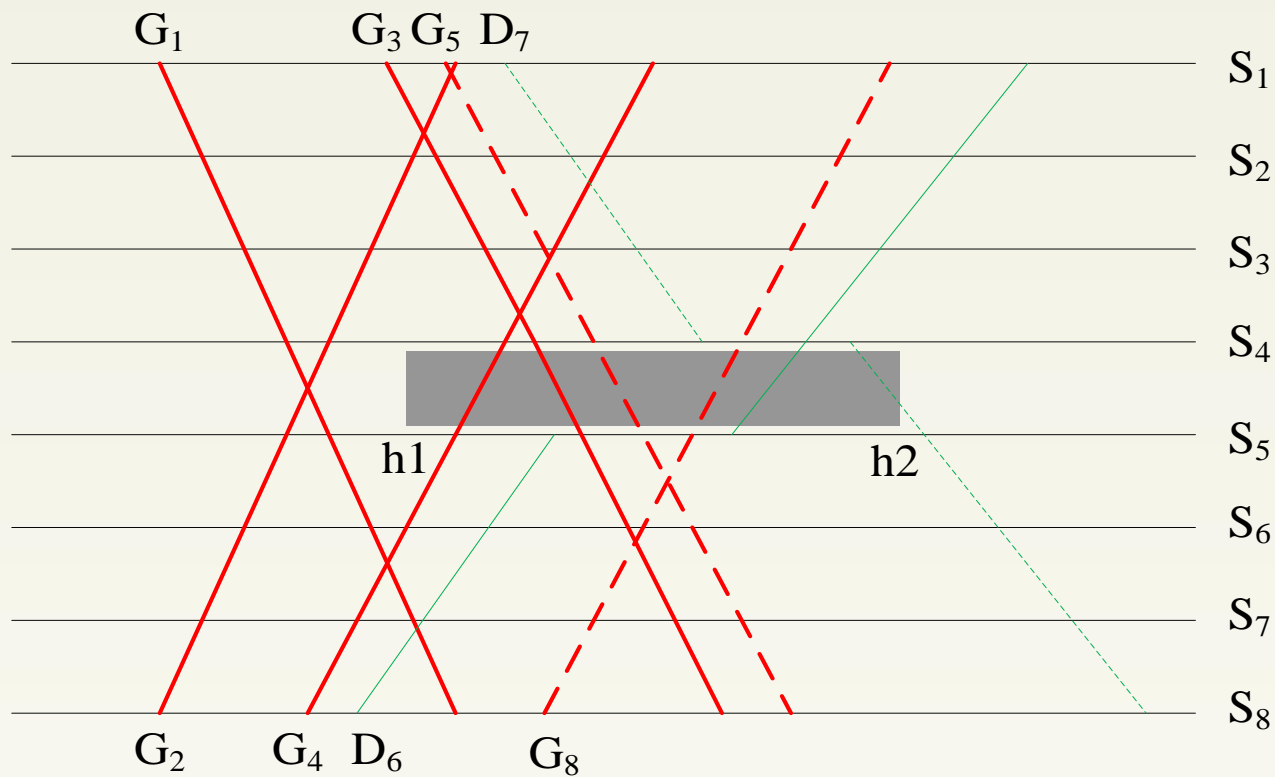


Fig. 2 A disposition timetable in a partial blockage for small instance

# Model formulation

## Assumptions:

- Each track of the double-track lines is a bidirectional line in the perspective of technology.
- Both tracks of the main line is connected with each siding in each station
- Upside (downside) trains are only allowed to use upside (downside) sidings.
- Trains run as scheduled before the disruption.
- Trains can continue their journeys if they have already entered the disrupted segment at the start of the disruption.

# Model formulation

## Basic model

### Objective:

min: train cancelation penalty +  
total weighted train **deviation**  
(*earliness and tardiness*)

$$\text{Min: } \sum_{t \in T} \gamma_t y_t + \sum_{e \in E} \mu_e^+ d_e^+ + \sum_{e \in E^{arr}} \mu_e^- d_e^-$$

### Subject to:

(1) The domain of events (move canceled trains)

$$2M_1 y_{t_e} - M_1 \leq x_e - q_e \leq M_1 \quad \forall e \in E, t_e \in T$$



# Model formulation

## Basic model

Subject to:

(2) trains cannot depart earlier

$$x_e \geq q_e \quad \forall e \in E^{dep}$$

(3) deviation of train events

$$d_e^+ \geq x_e - q_e - M_1 y_{t_e} \quad \forall e \in E, t_e \in T$$

$$d_e^- \geq q_e - x_e \quad \forall e \in E^{arr}$$

(4) deviation of train events cannot exceed maximum deviation

$$d_e^- \leq D \quad \forall e \in E^{arr}$$

$$d_e^+ \leq D \quad \forall e \in E$$

# Model formulation

## Basic model

Subject to:

(5) run as scheduled before disruption

$$x_e = q_e \quad \forall e \in E : q_e \leq H_{dis}^{start}$$

(6) running train cannot be canceled

$$y_{t_e} = 0 \quad \forall t_e \in T, e \in E_{s_{t_e}^{dep}}^{dep} : q_e \leq H_{dis}^{start}$$

(7) the domain of variables

$$y_t \in \{0,1\} \quad \forall t \in T$$

$$x_e, d_e^+, d_e^- \geq 0 \quad \forall e \in E$$

# Additional constraints

## ➤ Single train precedence constraints

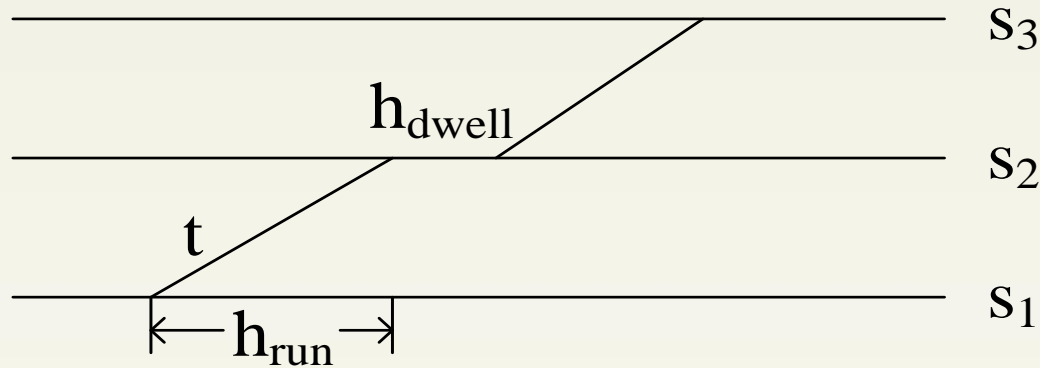


Fig. 3 Single train running graph

$$x_f - x_e \geq L_a \quad \forall a = (e, f) \in A_{train}$$

# Additional constraints

## ➤ Headway constraints between trains

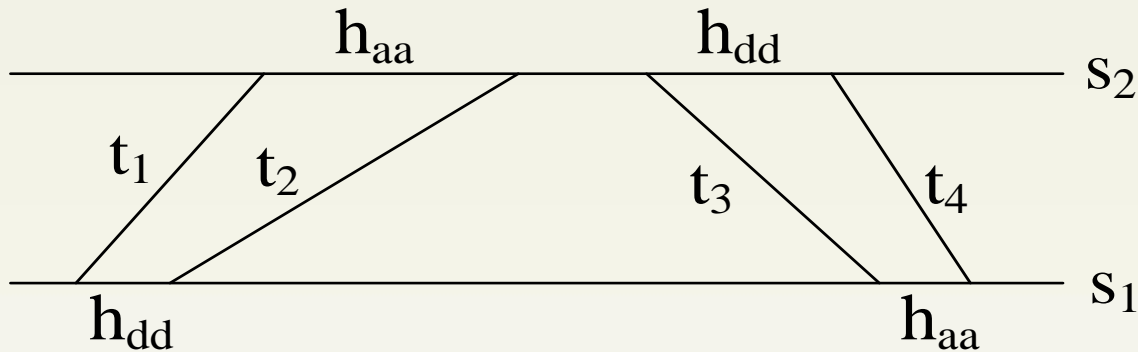


Fig. 4 Headway between trains in the same direction

$$\lambda_a + \lambda_{a'} = 1 \quad \forall a = (e, f) \in A_{\text{head}}^{\text{track},1} \wedge a' = (f, e) \in A_{\text{head}}^{\text{track},1}$$

$$x_f - x_e + M_2(1 - \lambda_a) \geq L_a \quad \forall a = (e, f) \in A_{\text{head}}^{\text{track},1}$$

# Additional constraints

## ➤ Overtaking constraints

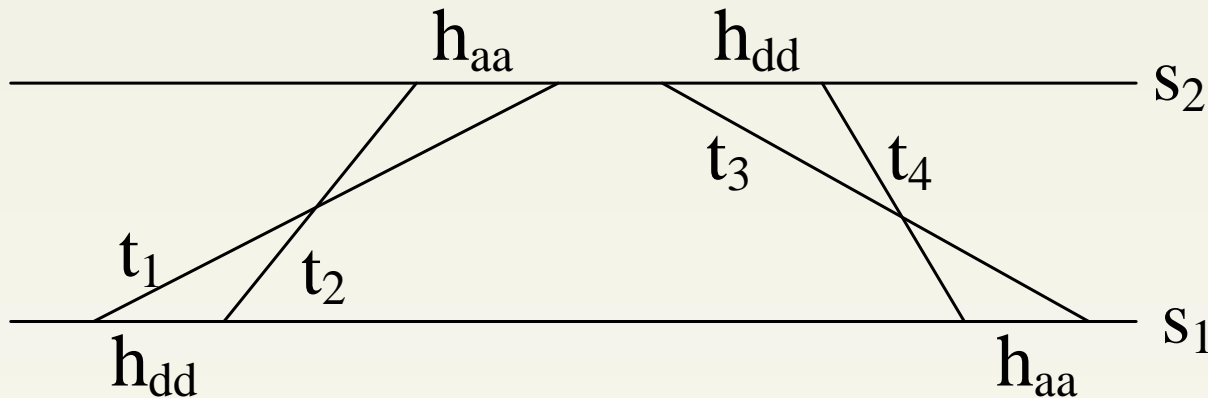


Fig. 5 Overtaking between trains

**Note:** Only trains in the same direction may overtake each other

$$\lambda_a = \lambda_{a'}, \quad \forall (a, a') \in B$$

# Additional constraints

- Headway constraints between trains (opposite direction)

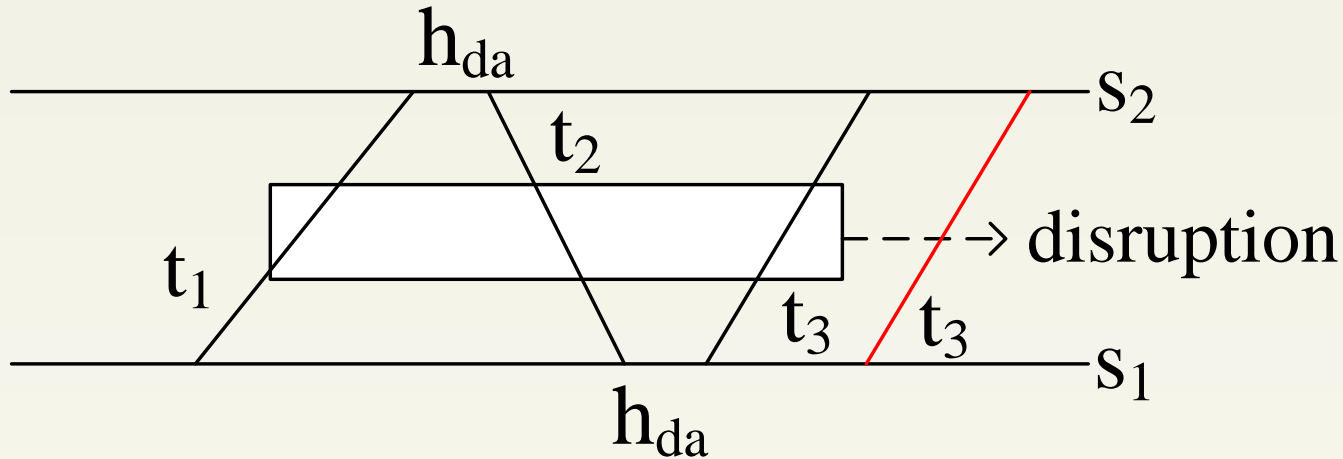


Fig. 6 Headway between trains in opposite directions

Which disrupted train needs to run on the reverse track in the blocked segment is related to the train rescheduling results. (Fig.6: upside track is blocked)

# Additional constraints

- Headway constraints between trains (opposite direction)

Define binary variable:

$$\chi_e^d = \begin{cases} 1 & \text{if train } t_e \text{ departs from station } s_e \text{ before the disruption ends} \\ 0 & \text{otherwise} \end{cases}$$

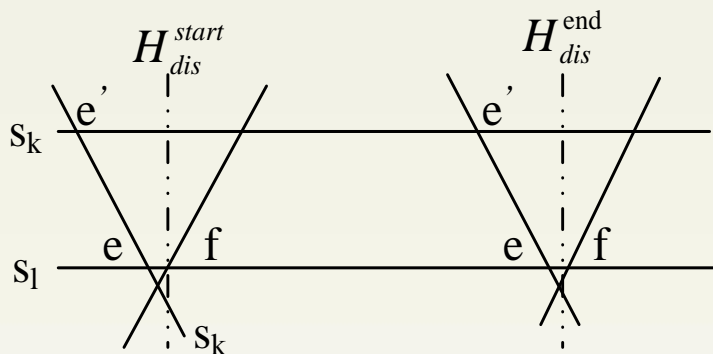
$$H_{dis}^{end} \times (1 - \chi_e^d) < x_e \leq H_{dis}^{end} + (1 - \chi_e^d) \times M_2$$

$$x_f - x_e + M_2(1 - \lambda_a) + M_2(1 - \chi_{e_1}^d) \geq L_a \quad \forall a = (e, f) \in A_{head}^{track,2}$$

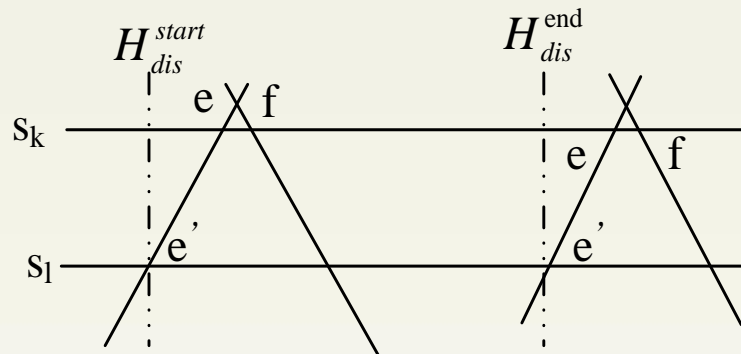
The domains of events differ due to different disruption scenarios and types of trains, show as follow:

# Additional constraints

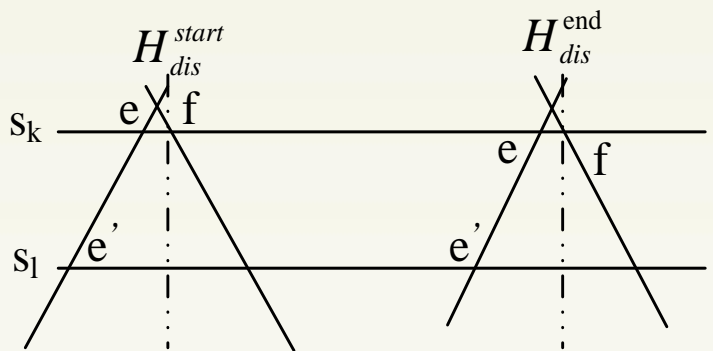
## ➤ Headway constraints between trains (opposite direction)



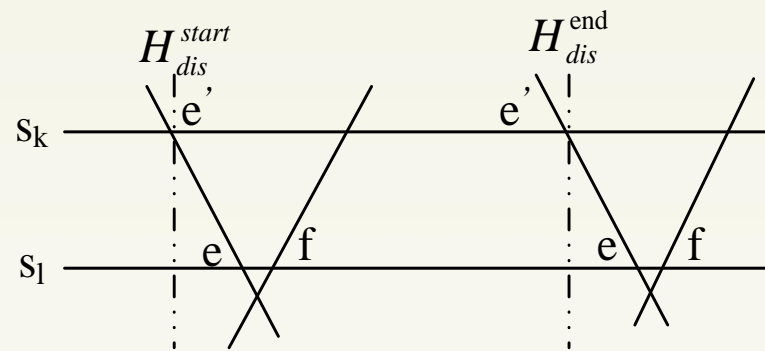
(1) Headway between upside departure-downside arrival



(2) Headway between downside departure-upside arrival



(3) Headway between downside departure-upside arrival



(4) Headway between upside departure-downside arrival

Fig. 7 Headway between trains in opposite directions



# Additional constraints

## ➤ Station capacity constraints

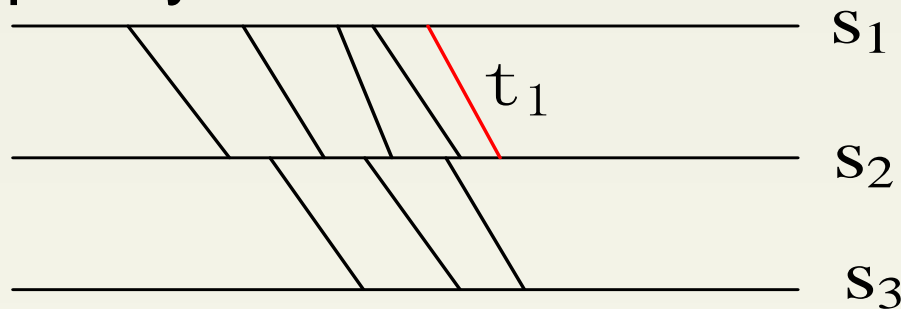


Fig. 8 Graph for trains running in a station

Define binary variable:

$$\varphi_a = \begin{cases} 1 & \text{if train } t_e \text{ departs from station } s \text{ before train } t_f \text{ arrives there} \\ 0 & \text{otherwise} \end{cases}$$

$$\sum_{a=(e,f) \in A_{s,f}^1} \lambda_a - \sum_{a=(e,f) \in A_{s,f}^2} \varphi_a \leq C_s^{down} - 1 \quad \forall s \in S^m, f \in E_s^{arr} : q_f \geq H_{dis}^{start} \wedge t_f \in T^{down}$$

$$\sum_{a=(e,f) \in A_{s,f}^1} \lambda_a - \sum_{a=(e,f) \in A_{s,f}^2} \varphi_a \leq C_s^{up} - 1 \quad \forall s \in S^m, f \in E_s^{arr} : q_f \geq H_{dis}^{start} \wedge t_f \in T^{up}$$

$$x_f - x_e + M_2 (1 - \varphi_a) \geq L_a \quad \forall a = (e, f) \in A_{station}$$

# Additional constraints

## ➤ Train balance constraints

The number of canceled trains of the same type in each direction should be more or less equal.

$$\sum_{t \in p} y_t - \sum_{t \in p'} y_t \leq \delta \quad \forall t \in T$$

$$\sum_{t \in p'} y_t - \sum_{t \in p} y_t \leq \delta \quad \forall t \in T$$

# Rolling horizon approach

Real-time train rescheduling is complicated:

- Long high speed line
- Large number of trains
- Limited computation time

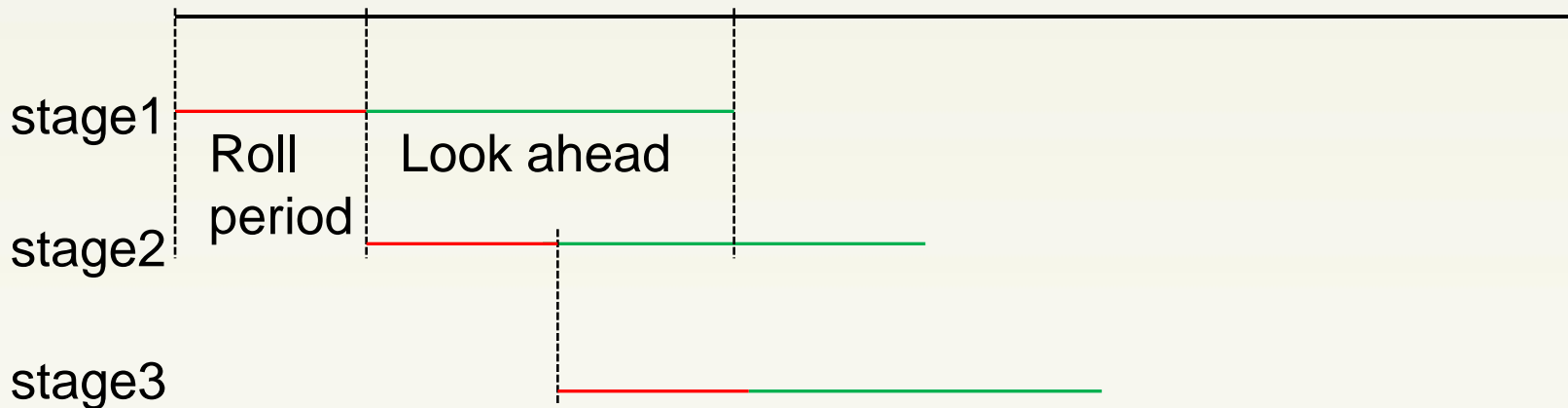
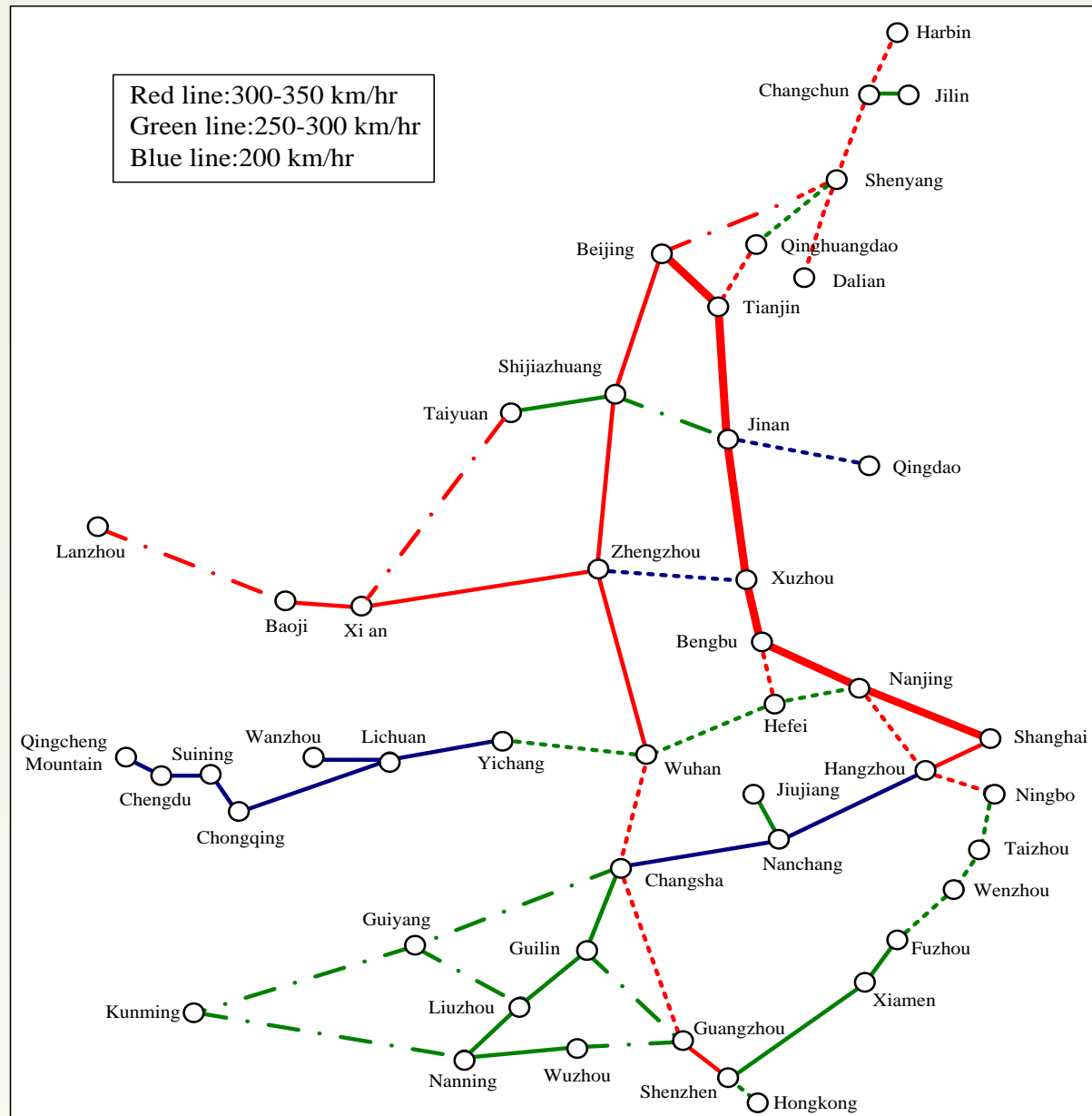


Fig. 9 Rolling horizon framework

# Experiment setting

The Beijing-Shanghai high speed railway and other related high speed railways.

90 upside and 90 downside trains



# Experiment setting

Tab. 1 Assumed disruption scenarios

Scenarios	Occurrence time	Location	duration	Disrupted track
1	10:00	5	60/90/120	Downside track
2	13:00	11	60/90/120	Upside track
3	13:00	11	60/90/120	Downside track
4	17:00	16	60/90/120	Upside track

Tab. 2 Disruption instances with updating information

Instances	Scenarios	Duration time updates
1	1	{10:00, $H_{10:00-11:30}$ }, {11:00, $H_{10:00-12:00}$ }
2	2	{13:00, $H_{13:00-14:00}$ }, {13:30, $H_{13:00-15:00}$ }
3	3	{13:00, $H_{13:00-14:30}$ }, {14:00, $H_{13:00-15:00}$ }
4	4	{17:00, $H_{17:00-18:30}$ }, {17:30, $H_{17:00-19:00}$ }

# Experiment results

<i>Instance*</i>	horizon (min)	Obj.	TD (min)	Cancel	Time(s)	Gap(%)	Recover
(10, 5, 60) <sup>2</sup>	180	3562	928	0	70	0	
	690	231	953	0	88	0	13:07
(10, 5, 90) <sup>2</sup>	180	5353	1377	0	245	0	
	690	1081	1540	0	75	0	13:56
(10, 5, 120) <sup>2</sup>	130	5674	1485	0	300	13.99	
	740	7029	2714	0	193	0	14:51
(13, 11, 60) <sup>2</sup>	130	4581	1177	0	80	0	
	560	1789	1364	0	47	0	15:56
(13, 11, 90) <sup>2</sup>	130	8644	2227	0	300	14.43	
	560	8258	3502	0	145	0	18:01
(13, 11, 120) <sup>2</sup>	130	10043	2635	0	300	14.72	
	560	13331	5013	0	95	0	18:30
(13, 11, 60) <sup>2</sup>	130	5044	1410	0	95	0	
	560	2864	2048	0	26	0	19:06
(13, 11, 90) <sup>2</sup>	130	8089	2088	0	300	12.32	
	560	6418	2980	0	50	0	17:55
(13, 11, 120) <sup>2</sup>	130	10117	2655	0	300	18.61	
	560	13573	5086	0	117	0	18:32
(17, 16, 60) <sup>1</sup>	420	1082	294	0	20	0	19:22
(17, 16, 90) <sup>1</sup>	420	1510	403	0	30	0	18:54
(17, 16, 120) <sup>1</sup>	420	2112	560	0	64	0	20:05

# Experiment results

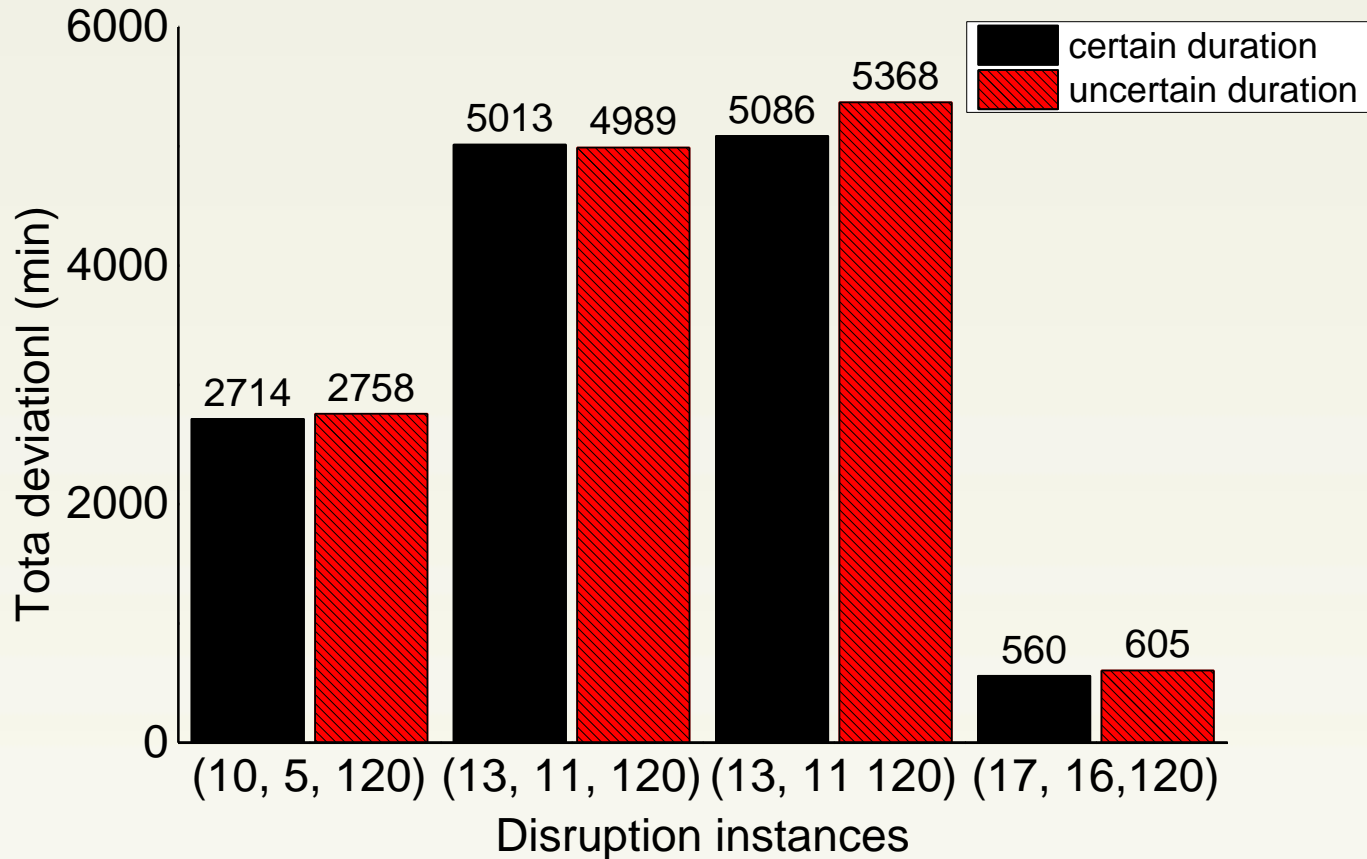


Fig. 10 Total deviation for disruption instances under certain and uncertain duration of disruptions

# Experiment results

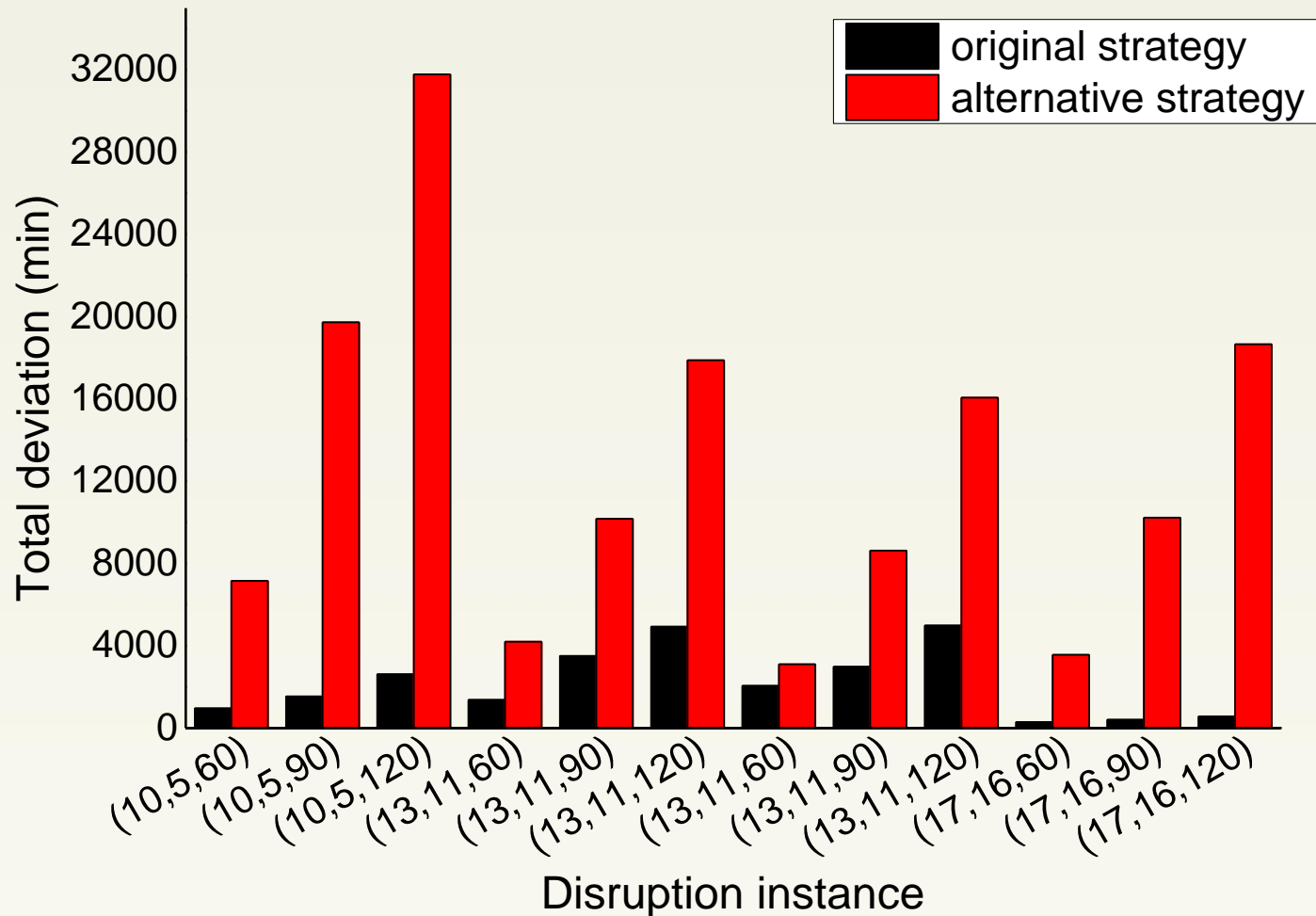


Fig. 11 Total deviations for two train rescheduling strategies



# Conclusion

- ❑ A mixed integer programming model is formulated to reschedule trains in a partial segment blockage.
- ❑ Various types of trains and trains with different stopping patterns are investigated.
- ❑ Uncertain duration of the disruption is handled by updating the information.
- ❑ Two important train rescheduling strategies are explicitly compared.
- ❑ A large real-world high speed railway case in China is tested.

**THANK YOU**

**for your attention!**

**Any questions**