

# Railway Crew Pairing with Weekend Considerations: Modeling and Algorithm

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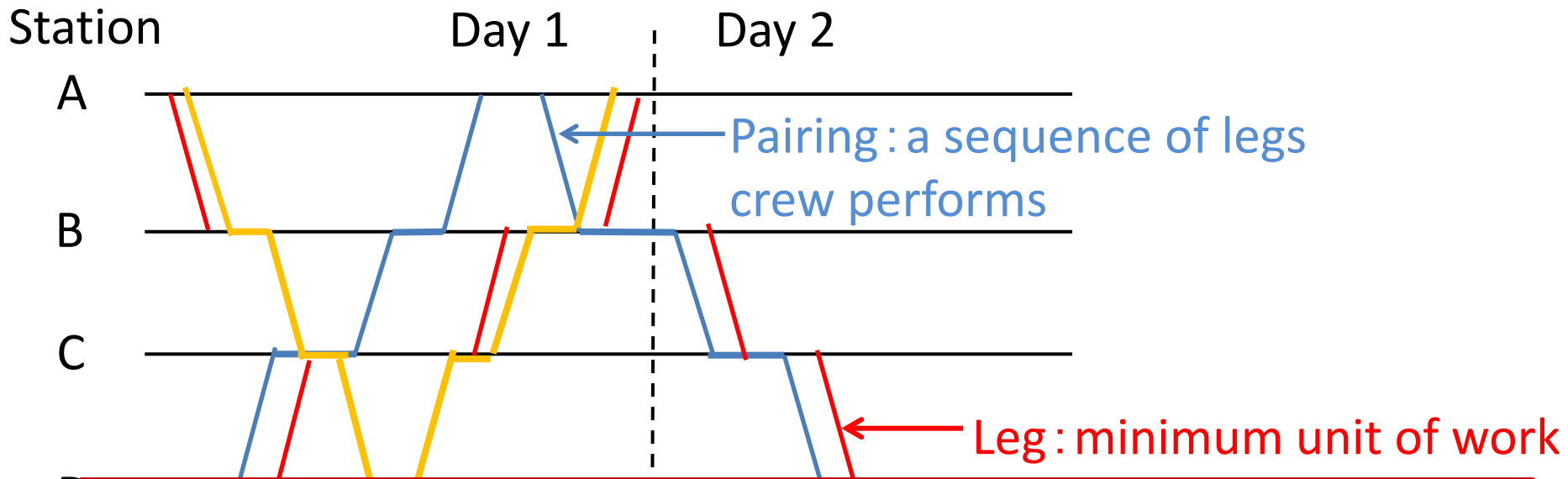
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# Research Background and Objective

- Background :
  - Crew pairing problem studied extensively in railway OR
  - **Column generation** established as a standard approach
- Difficulties with the traditional approach :
  - Existence of weekday as well as **holiday timetables**
  - **Overnight pairings** may not be used unless existence of different timetables is considered
- Objective :
  - Modeling and algorithm development to **generate crew pairings which consider holiday timetable**

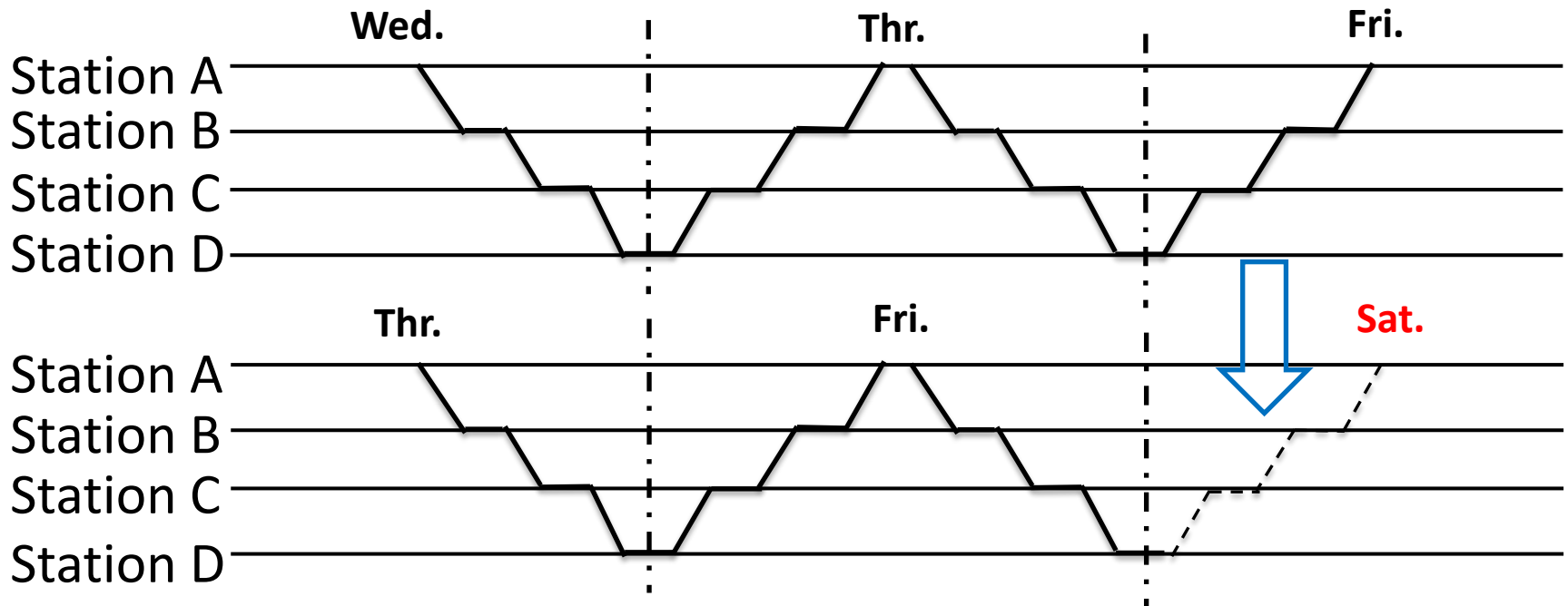
# Crew Pairing Problem



- Starting Station (Crew Base) = Ending Station (same Crew Base)
- Work Hours
- Drive Hours
- Rest Hours
- Sleep Hours of an Overnight Pairing
- Ex Number of Train Legs in a Pairing
- Earliest Work Start Time, Latest Work Completion Time, Etc.

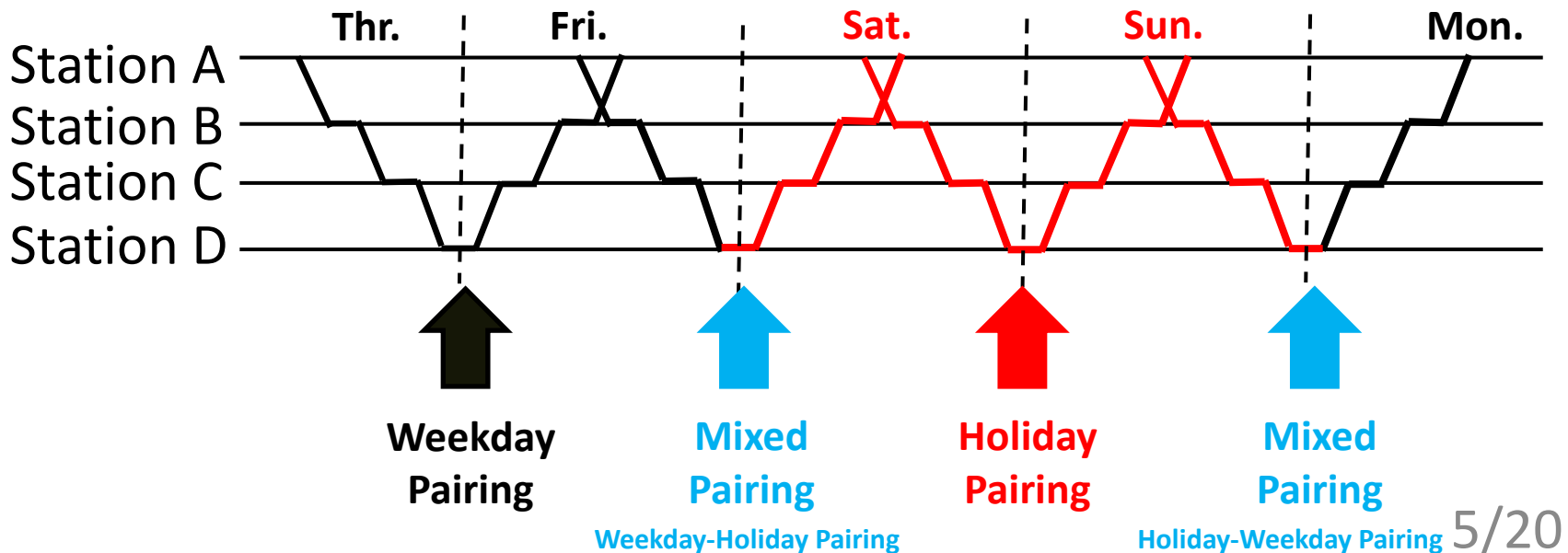
# Necessity to Consider Holiday Timetable

- Certain train legs may not exist on holiday



# Different Types of Overnight Pairings

- Majority of pairings are overnight in practice
- 3 (or 4) different types of overnight pairings
  - Which timetables are used on 1<sup>st</sup> and 2<sup>nd</sup> day?
  - Weekday pairing, **Holiday pairing**, **Mixed pairing**



# Only a few studies refer to existence of different timetables

[1] Abbink,E., Van` t Wout,J., Huisman,D.(2008): `` Solving large scale crew scheduling problems by using iterative partitioning, " Econometric Institute Report EI2008-03, Erasmus University, Rotterdam.

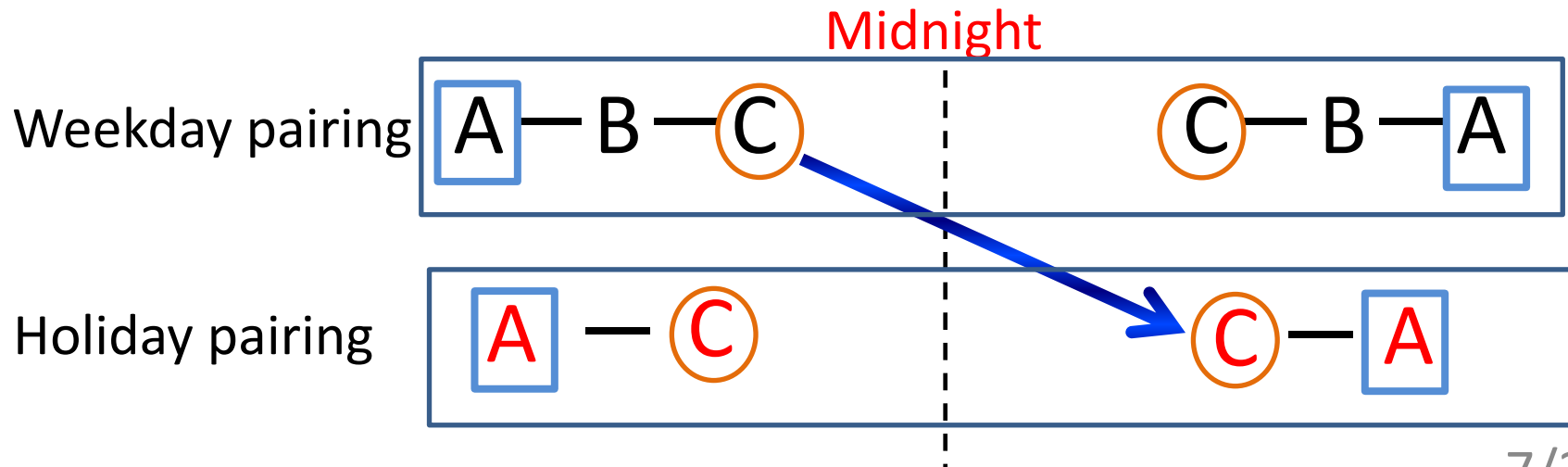
- Weekly railway crew pairing generation
- Difference of timetables depending on day
- Use of software called TUNRI

[2] Bazargan,M.(2010): Airline Operations and Scheduling, 2nd edition, Ashgate, Surrey, England.

- Airline crew scheduling
- Difference of weekday and holiday timetables
- Modifying weekday pairings on holiday

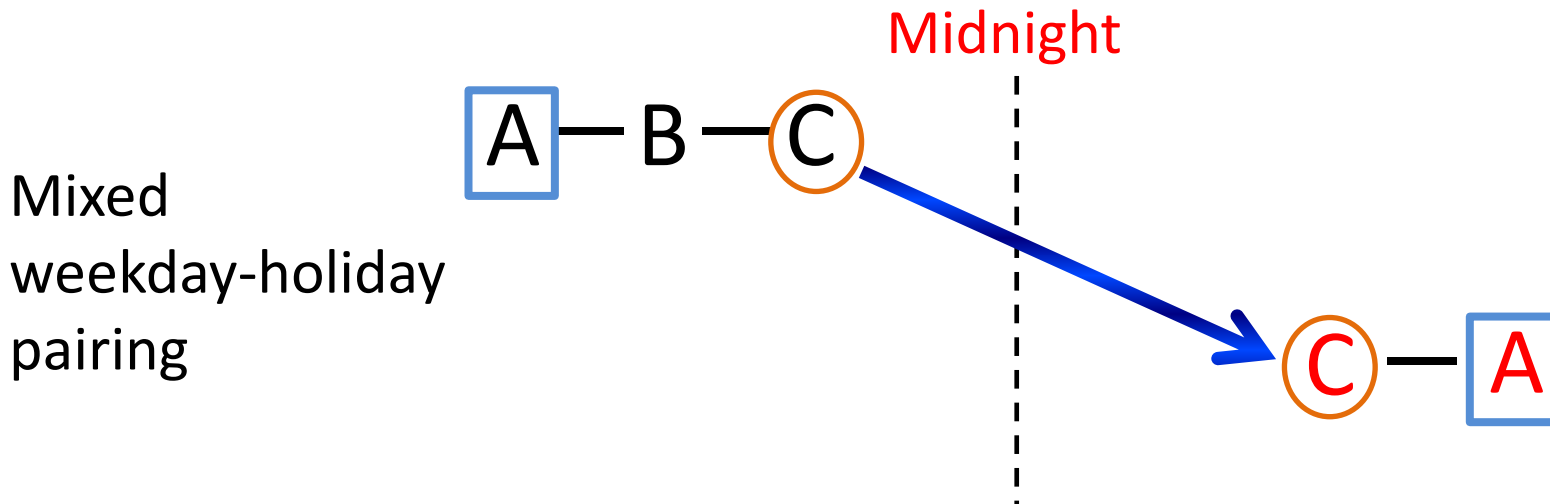
# Two-Stage Approach

1. Construct weekday pairings based on weekday timetable  
Use any standard procedure.
2. Construct holiday pairings based on holiday timetable  
Make 1:1 correspondence between a weekday pairing and a holiday pairing.
  - Must satisfy pairing constraints
  - Hope to generate feasible mixed pairings by “concatenation”



# Two-Stage Approach

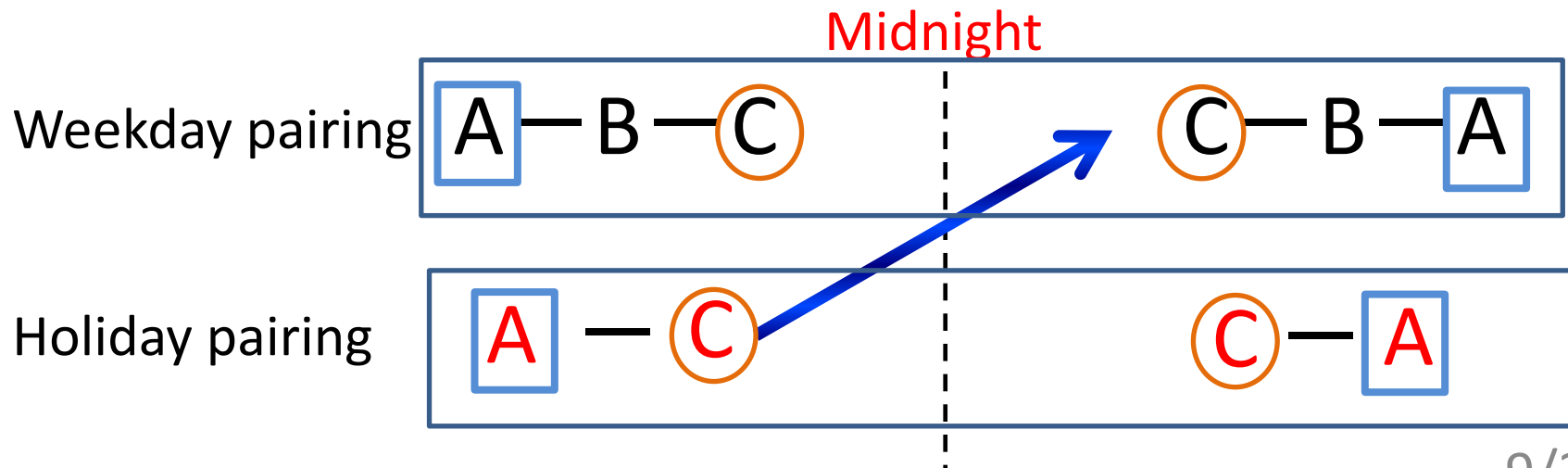
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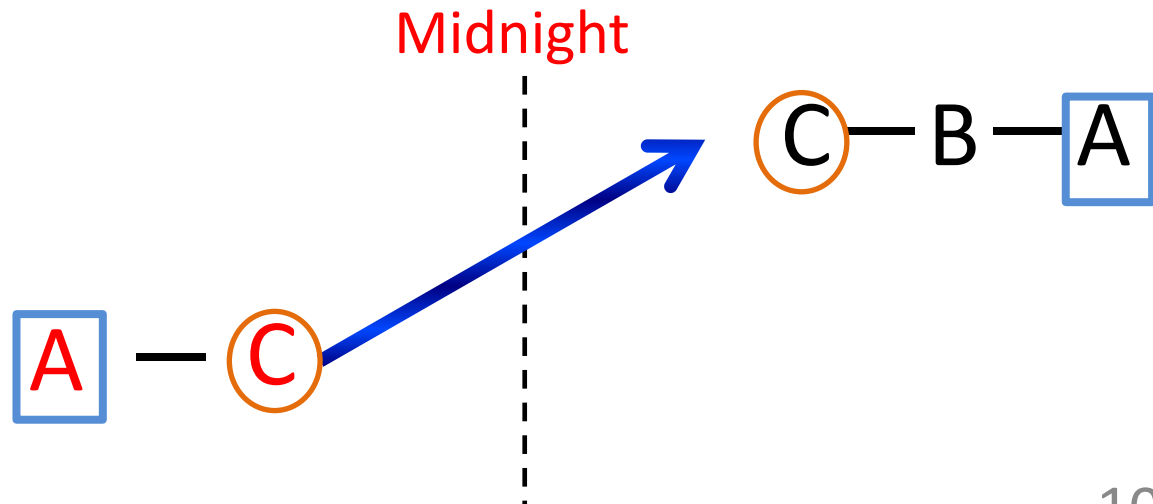
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# Two-Stage Approach

1. Construct weekday pairings based on weekday timetable  
Use any standard procedure.
2. Construct weekend pairings based on holiday timetable  
Make 1:1 correspondence between a weekday pairing and a holiday pairing.
  - Must satisfy pairing constraints
  - Hope to generate feasible mixed pairings by “concatenation”

Mixed  
holiday-weekday  
pairing



# Two-Stage Approach

1. Construct weekday pairings based on weekday timetable

Use any standard procedure.

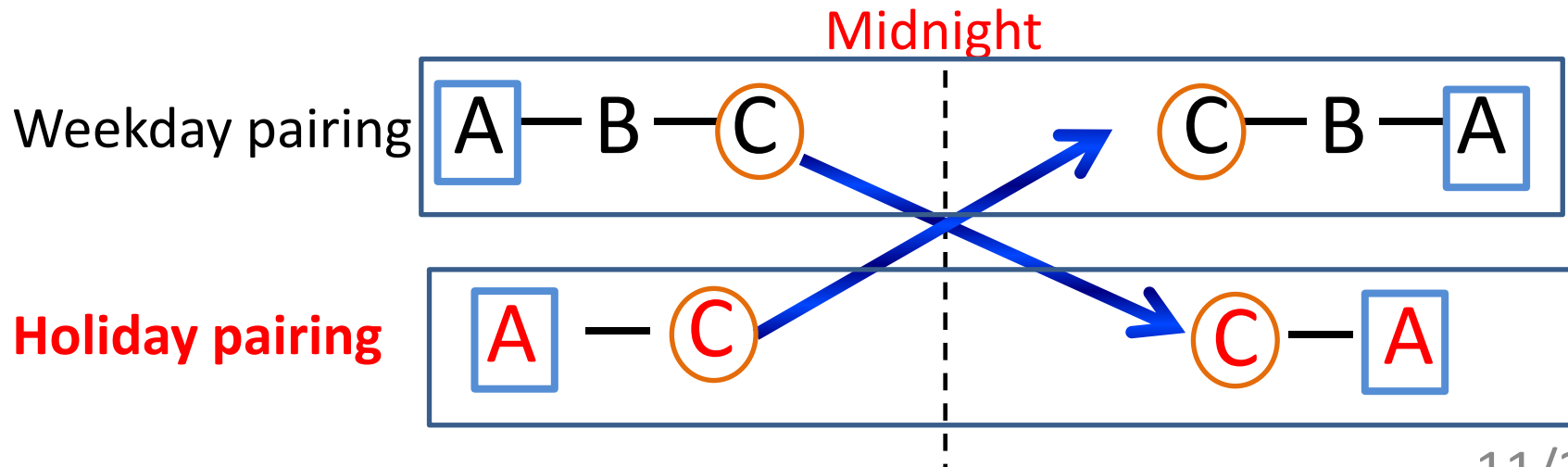
2. Construct holiday pairings based on holiday timetable

Make 1:1 correspondence between a weekday pairing and a holiday pairing.

## Holiday Pairing Problem

– Satisfy pairing constraints

– Also generate feasible mixed pairings by “concatenation”



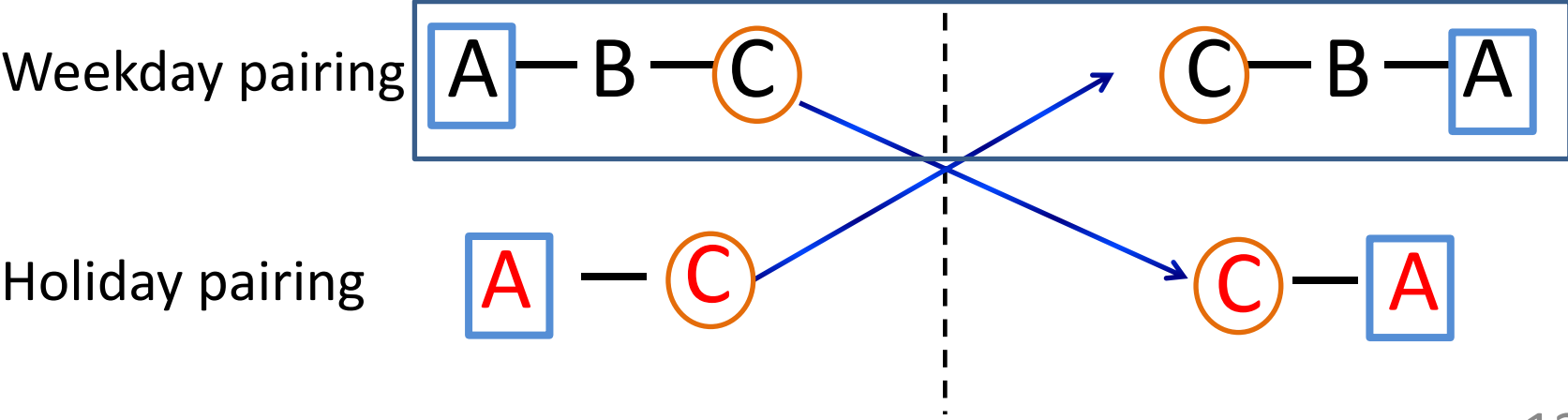
# Crew Base and Sleep Station Must Coincide

- Crew base and sleep station of a holiday pairing must coincide with those of the corresponding weekday pairing.

A、B、C: station      —: train leg

Base (Starting and Ending Station)

Sleep Station



# Conditions to Be Satisfied by Holiday Pairing Problem

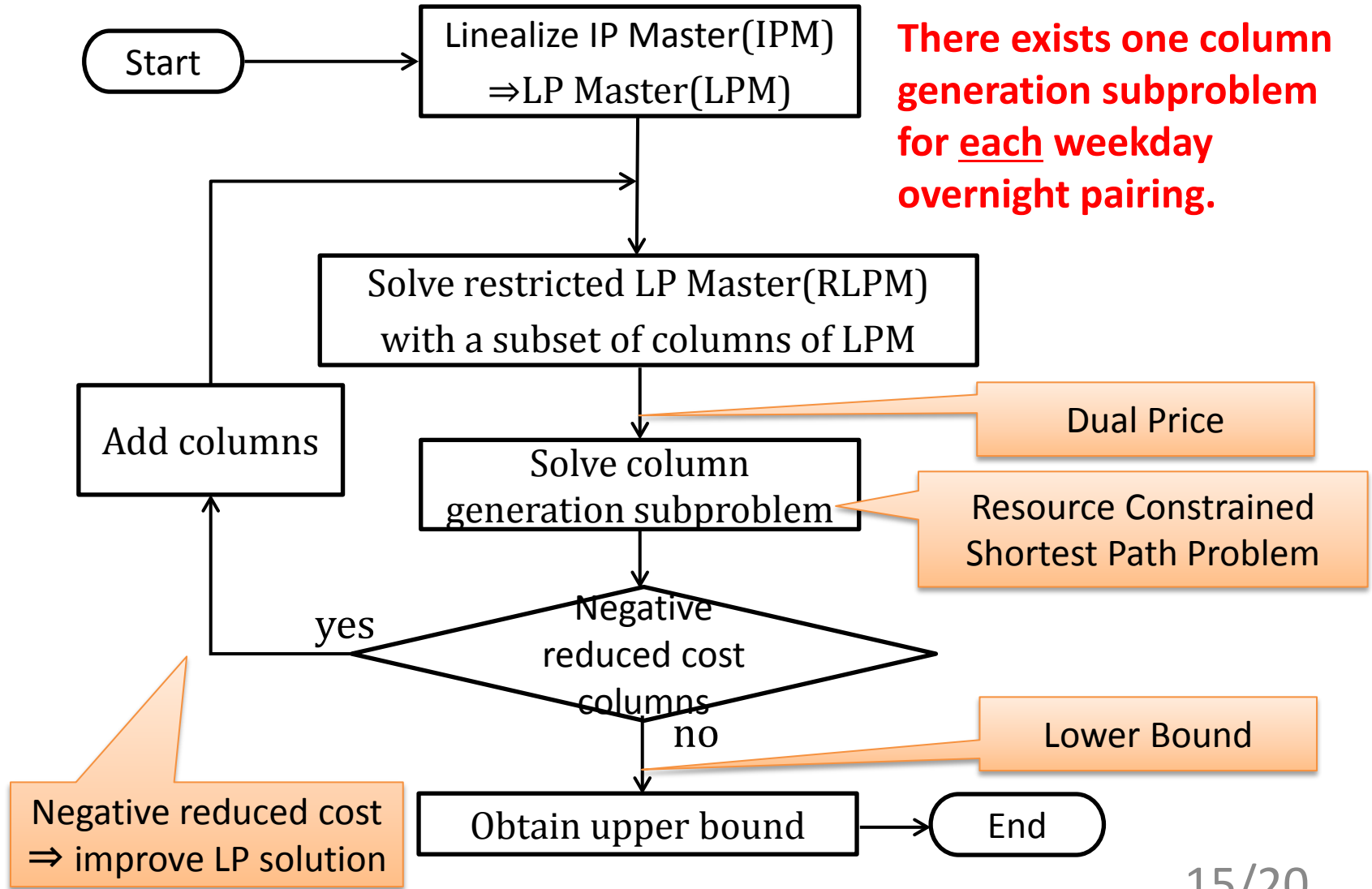
- (1) The generated holiday pairings satisfy all conditions to be satisfied by pairings.**
- (2) The concatenated mixed pairings satisfy**
  - Crew base constraint**
  - Maximum work hours**
  - Minimum and maximum sleep hours**
- (3) The start time of weekend overnight pairing is the same as that of the corresponding holiday pairing.**

We also **desire** the generated a holiday pairing to be **similar** to the corresponding weekday pairing.

# Similarity of a Holiday Pairing and the Corresponding Weekday Pairing

- Similarity measured by
  - Work hours (penalize more work on holiday)
  - Sleep hours (penalize reduced sleep on holiday)
- Similarity is expressed in the objective function of the holiday pairing problem as a “desirability” measure.

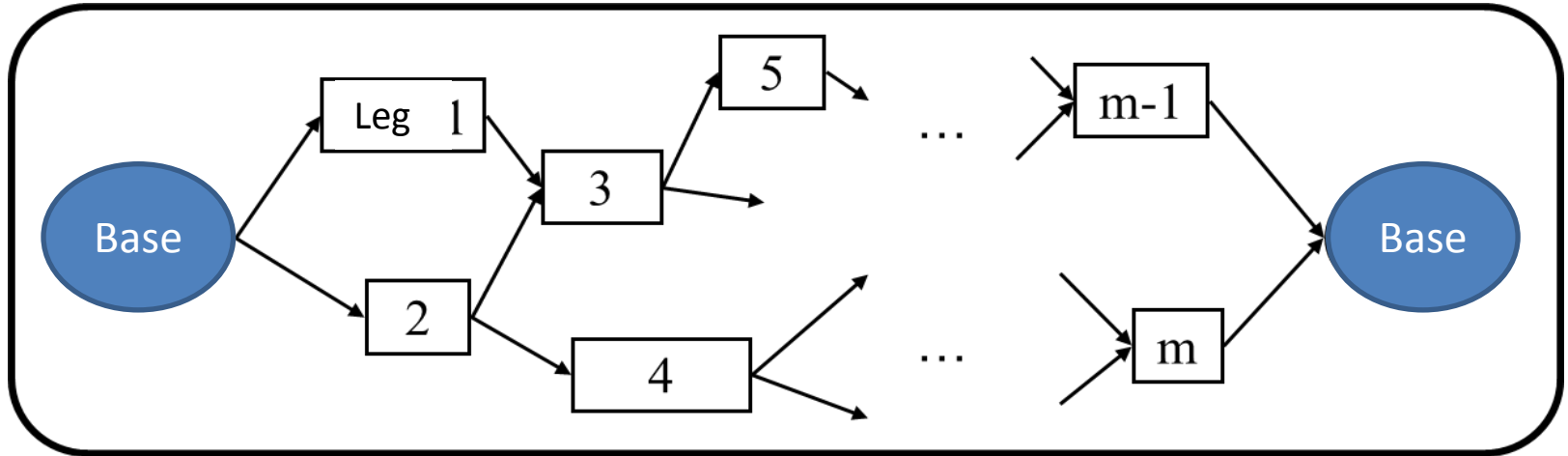
# Column Generation Algorithm



# Column Generation Subproblem

## Resource-Constrained Shortest Path Problem

Network (Node=Leg, Arc="Connectability" of legs)



Constraints of Mixed Pairing	How to satisfy constraints?	How similar pairings are?
Max Work Hours	Identical start time of pairings <b>Condition (3)</b>	Cost on arc
Max & Min Sleep Hours	Eliminate certain arcs on the network	Cost on arc



# Two Variants of Holiday Pairing Problem

- Two variants considered depending on how one-day pairings are generated
- Variant 1:
  - Consider correspondence with weekday one-day pairing
  - (One-day pairing) 1:1 correspondence model
- Variant 2:
  - Do not consider correspondence with weekday one-day pairing; Instead, generate pairings for each crew base
  - (One-day pairing) no correspondence model

# Numerical Experiments

## Objective

1. Performance evaluation using **JR Nara line** (Kyoto $\leftrightarrow$ Nara)  
# of weekday/holiday train legs = 174/162
2. Comparisons of 2 variants of holiday pairing generation

## Method

- PC: Corei7-3770s, 8GB memory, Windows7 64-bit
- Performed experiments when # of weekday one-day pairings = 1, 2, 3, 4

# Holiday Pairing Problem Solved Quickly

Table 1: Comparison of CPU time (sec.)  
(# of weekday one-day pairings =2)

	LP Relaxation	Integer Program
Weekday Pairing	32.04	1440.22
<b>Holiday Pairing</b>		
<b>One-day 1:1 correspondence</b>	<b>24.04</b>	<b>34.06</b>
<b>One-day no correspondence</b>	<b>27.55</b>	<b>31.04</b>

# “No Correspondence” Model Seems to Yield More Similar Pairings

Table 2: Comparison When # of Weekday One-day Pairings is 2

	1:1 Corresp.		No Corresp.
Total # Weekday Pairings	22		22
Objective Value (①+②)	40h 41min	>	33h 43min
①Diff. of Work Hours	29h 43min		23h 52min
②Diff. of Sleep Hours	10h 58min		9h 51min

Table 3: Comparison When # of Weekday One-day Pairings is 3

	1:1 Corresp.		No Corresp.
Total # Weekday Pairings	23		23
Objective Value (①+②)	28h 29min	>	26h 16min
①Diff. of Work Hours	19h 58min		17h 22min
②Diff. of Sleep Hours	8h 31min		8h 54min

No correspondence model allows more flexibility.

Larger # of weekday one-day pairings allows more flexibility.

# Conclusions

- Succeeded to generate 4 different sets of crew pairings which take holiday timetable into considerations, based on column generation.
- Appeared that better results could be obtained by allowing more room of flexibility in weekday one-day pairings.

## References :

- [1] Abbink,E., Van` t Wout,J., Huisman,D.: `` Solving large scale crew scheduling problems by using iterative partitioning, " Econometric Institute Report EI2008-03, Erasmus University, Rotterdam, 2008.
- [2] Bazargan,M.:Airline Operations and Scheduling, 2nd edition, Ashgate, Surrey, England, 2010.