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#### Belgian Infrastructure Management Company: Infrabel:

"Train Platforming Problem (TPP): platform and route as many trains as possible"

#### **Objectives:**

no conflicts in planning in stations, check robustness

#### Fixed:

infrastructure, train lines, halting pattern, arrival & departure times

#### Specifics:

- one busy day, morning peak hours, periodic/non-periodic
- (check current platforming +) create new ('optimised') one

# Platforming = Mapping Trains on Infrastructure



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Model

Objective function

# In objective function

#### In objective function:

- Minimize penalties
  - of assigning to fictive a platform and
  - of moving assignment from preferred (real) to non-preferred (real) platforms,

for both initial  $O_{INI}$  and for supplementary  $O_{SUP}$  train sets

$$g(op_{o,p}) = \sum_{o \in O_{INI}} CF_{INI} \cdot f_o + CR_{INI} \cdot cr_o + \sum_{o \in O_{SUP}} CF_{SUP} \cdot f_o + CR_{SUP} \cdot cr_o.$$
(1)

where

$$\forall o \in O : f_o \equiv (o2p_{o,p} = pFICT) \\ \forall o \in O : cr_o \equiv (o2p_{o,p} \neq pORIG_o)$$

- uses fictive platform at a higher cost than real platform
- conservative optimisation  $(CF_{INI}, CF_{SUP}, CR_{INI}, CR_{SUP}) = (8, 4, 2, 1)$
- progressive optimisation  $(CF_{INI}, CF_{SUP}, CR_{INI}, CR_{SUP}) = (1, 1, 0, 0)$

Model

Objective function

## Not in objective function

#### Not in objective function:

- weighting of trains by importance (e.g.:#passengers)
- important (e.g.:#passengers) transfer concerns, placing two trains close together

robustness against delays

Model

Variability

# Definitions: Movement & Occupation

#### Movement Definition:

- Train 'IN/OUT movement' specifies:
  - IN/OUT line
  - platform arrival time
  - platform departure time
- IN route: connects IN line to platform,
- OUT route: connects platform to OUT line.

#### Occupation Definition:

- platform 'occupation' specifies (bundles):
  - (list of) IN movement(s)
  - (list of) OUT movement(s)
  - e.g.: 1 IN movement, 2 OUT movements = train split
  - e.g.: 2 IN movements, 1 OUT movement = train merge

Model

#### Variability

# In / Not In Variability

#### In Variability:

- per occupation
  - one platform choice
- per movement
  - one route choice
  - (indirectly) one platform choice

#### Not in Variability:

• per line-platform combination: only 1 default routing allowed for now

only fixed platform arrival/departure times

Model

Constraints

# Constraints Requiring total Assignment

Per-Movement, Per-Occupation and Compatibility Constraints:

• For each occupation, exactly one platform has to be chosen:

$$\forall o \in O : \sum_{p \in P} op_{o,p} = 1$$
(2)

• For each movement, exactly one route has to be chosen:

$$\forall o \in O : \forall m \in M_o : \sum_{r \in R} mr_{o,m,r} = 1$$
(3)

• all movements in 1 occupation need to come together on 1 platform track

$$\forall o \in O : \forall m \in M_o : mr_{o,m,r} \implies op_{m2o_m,r2p_r}$$
(4)

- via m2om function, movement-occupation membership is respected
- via r2pr function, route-platform connectivity is respected

Model

Constraints

# Constraints Avoiding Conflicts

#### Inter-Occupation Constraints:

• no 2 extended occupations use equal platform tracks at any time

$$\forall \begin{array}{c} o_{0} \prec o_{1} \\ [otLoLbC_{o_{0}}, otHiUbC_{o_{0}}) \cap \\ [otLoLbC_{o_{1}}, otHiUbC_{o_{1}}) \neq \phi : \end{array} \\ op_{o_{0}, \rho_{0}} \land op_{o_{1}, \rho_{1}} \Longrightarrow osep_{o_{0}, o_{1}} \end{cases}$$

$$(5)$$

#### Inter-Movement Constraints:

• no 2 extended movements use *dependent* (equal or crossing) routings at any time

$$\forall \begin{array}{c} m_{0} \prec m_{1} \\ [mtLoLbC_{m_{0}}, mtHiUbC_{m_{0}}) \cap \\ [mtLoLbC_{m_{1}}, mtHiUbC_{m_{1}}) \neq \phi : \end{array} \\ mr_{o_{0}, m_{0}, r_{0}} \wedge mr_{o_{1}, m_{1}, r_{1}} \Longrightarrow msep_{m_{0}, m_{1}} \end{array}$$

$$(6)$$

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Model

Constraints

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# Separation boolean definitions

Occupation Separation boolean definition:

#### Movement separation boolean definition:

 $\forall \begin{array}{c} m_0 \prec m_1 \\ [mtLoLbC_{m_0}, mtHiUbC_{m_0}) \cap \\ [mtLoLbC_{m_1}, mtHiUbC_{m_1}) \neq \phi : \end{array}$ 

 $m_0, m_1 \in M$ :

$$\begin{split} mbef_{m_{0},m_{1}} &\equiv (mtHiV_{o_{0}} + dt_{S} \leq mtLoV_{m_{1}}) \\ mbef_{m_{1},m_{0}} &\equiv (mtHiV_{o_{1}} + dt_{S} \leq mtLoV_{m_{0}}) \\ msep_{m_{0},m_{1}} &\equiv (mbef_{m_{0},m_{1}} \lor mbef_{m_{1},m_{0}}), \end{split}$$
(8)

Software Implementation

User Interface

## User Interface Parameters

| leopardGUI: LEan Optimiser of Platforms And Ro   | utings including routing Dependencies  | - • • ×              |
|--|--|----------------------|
| Date   | 16/04/2013 👻   |                      |
| From Hour  | 07:10  |                      |
| Up To Hour   | 08:50 Select the start hour for which you want to ru   | n Leopard.           |
| Extract Macro Infrastructure From  | a371 •   |                      |
| Select Station   | BRUGGE[210]  |                      |
| Fix Station Movements  | fix •  |                      |
| if in original plan: same relation, same platform track<br>then enforce in optimised plan: same platform track too   | if = real orig. platform tracks if = fictive orig. platform tracks   |                      |
| Mirror unmatched movements by turn-around time   | 5,0  |                      |
| Avoid routing conflicts also for Mirrored movements  |  | No.                  |
| Fixed train length in meter (-1 for actual length)   | 400  |                      |
| Draw Long Text for Movements   |  |                      |
| Mark and name times in occupations   |  |                      |
| Warn for (Real, Real)-dependent Route low reuse times  | Verlap Too dose Quite dose Robust  |                      |
| Define warning level Upper Times (min)   | 0,0 1,0 🙀 2,0 🖈 5,0 🔹  |                      |
| Warn for (Real,Fictive)-Route time overlaps  | Potential conflict   |                      |
| Popup Platforming Plan for   | ☑ Original ☑ Optimised   | About                |
| FINAL Station Connectivity that Luks Routes will be chec<br>incOrDecKm,io,L_jd,L_nm,LST_jdc,LST_track_dir,LST_nm<br>de<br>Incl_fourt_503_50A1_1_511_A_140_1022_1_1_210_RBUGG   | ked against and rejected against in case of no match.<br>LST_vMax,LS_jdc,LS_side,P1P2_orient,P1_jd,P1_nm,P1_sym_nm,P2_jd,P2_<br>E FR_6N9_1488FKF_IFCR1_2 | nm,P2_sym_nm,LS_StSi |
| [inc], [in], 503, [504], 7, [2], 8, 140, 598, 2, 1, 152, (NOOST)<br>[inc], [in], 503, [504], 2, [2], 8, 140, 1022, 1, 1, 210, RNGG<br>[inc], [in], 503, [504], 2, [2], 8, 140, 1022, 1, 1, 210, RNGG<br>[inc], [in], 503, [504], 2, [2], 8, 140, 598, 2, 1, 1596, NOOST) | H N (900) 200,200,800 (200,FR, 1<br>E,FR,609,)ABBEKE,[FGB],2<br>AMP,[YFPO],210,8RUGGE,FK,1<br>E DEPET 210,8RUGGE,FK,1<br>E DEPET 210,8RUGGE,FK,1         |                      |

Software Implementation Solver running times

#### Solver running times

Table: Solver running times on a Xeon CPU E31240 Quad Core 3.3 GHz, comparing CPLEX v12.5.0.0 32 bit, XPRESS BCL v4.6.1 64 bit and Gurobi v5.6.3 64 bit

|        |                  |                                |        |       |        |                    | # Stations   |  |  |  |
|--------|------------------|--------------------------------|--------|-------|--------|--------------------|--------------|--|--|--|
| Solver |                  | # Stations Optimally Solved in |        |       |        |                    |              |  |  |  |
|        |                  |                                |        |       |        |                    | Solved in    |  |  |  |
|        | $< 1 \mathrm{s}$ | $< 10 \mathrm{s}$              | < 20 s | < 30s | < 50 s | $< 130 \mathrm{s}$ | $\geq$ 7200s |  |  |  |
| CPLEX  | 526              | 8                              | 0      | 0     | 1      | 1                  | 0            |  |  |  |
| XPRESS | 528              | 5                              | 1      | 1     | 0      | 0                  | 1            |  |  |  |
| Gurobi | 533              | 3                              | 0      | 0     | 0      | 0                  | 0            |  |  |  |

#### Results

Antwerp-Central Original

# **Original Assignment**



Figure: Antwerp-Central original Assignment: 3 levels, some conflicts

#### Results

Antwerp-Central Optimised, Non-Periodic

## Optimised Assignment, Non-Periodic



# Figure: Antwerp-Central Opt. assignment, non-periodic: no conflicts, some unplaced trains

Results

Antwerp-Central Optimised, Periodic

# Optimised Assignment, Periodic



#### Figure: Antwerp-Central Opt. assignment, periodic: no conflicts, some unplaced trains

#### Results

Antwerp-Central Both, Non-Periodic

## Both Assignments, Non-Periodic



Figure: Antwerp-Central: comparing original and optimised assignments

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Results

Antwerp-Central Both, Non-Periodic

## Antwerp Station



Figure: Antwerp Station

Results

Ghent Sint-Pieters Original

## **Original Assignment**



Figure: Ghent Sint-Pieters original Assignment: some conflicts

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Results

Ghent Sint-Pieters Optimised, Non-Periodic

## Optimised Assignment, Non-Periodic



# Figure: Ghent Sint-Pieters Opt. assignment, non-periodic: no conflicts, some unplaced trains

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Results

Ghent Sint-Pieters Both, Non-Periodic

## Both Assignments, Non-Periodic



#### Figure: Ghent Sint-Pieters: comparing original and optimised assignments

Results

Ghent Sint-Pieters Both, Non-Periodic

#### **Ghent Station**



Figure: Ghent Station

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Results

Comparative Overview

# Comparing Original and Optimised Assignment KPIs

#platform #UnplatformedOrig Orig

kOra #ightOrar #greenLinr RobustnessSc #platformed( #UnplatformedOpt Opt

#redLit #darkOra #lightOrar #greenLini RobustnessSot Both

| 20 | 0  | Orig Plan 401 | 0  | 0   | 0  | 0   | 0    | 20 | 0 Opt Plan 401 | 0 | 0  | 0  | 0   | 0   | Both Plan 401 |
|----|----|---------------|----|-----|----|-----|------|----|----------------|---|----|----|-----|-----|---------------|
| 23 | 0  | Orig Plan 402 | 33 | 8   | 8  | 13  | -337 | 17 | 6 Opt Plan 402 | 0 | 7  | 3  | 9   | -31 | Both Plan 402 |
| 9  | 0  | Orig Plan 404 | 0  | 0   | 0  | 0   | 0    | 9  | 0 Opt Plan 404 | 0 | 0  | 0  | 0   | 0   | Both Plan 404 |
| 10 | 0  | Orig Plan 405 | 0  | 0   | 0  | 0   | 0    | 10 | 0 Opt Plan 405 | 0 | 0  | 0  | 0   | 0   | Both Plan 405 |
| 23 | 0  | Orig Plan 406 | 0  | 0   | 0  | 5   | 0    | 23 | 0 Opt Plan 406 | 0 | 2  | 1  | 9   | -9  | Both Plan 406 |
| 9  | 0  | Orig Plan 409 | 0  | 0   | 0  | 0   | 0    | 9  | 0 Opt Plan 409 | 0 | 0  | 0  | 0   | 0   | Both Plan 409 |
| 13 | 0  | Orig Plan 412 | 0  | 0   | 0  | 0   | 0    | 13 | 0 Opt Plan 412 | 0 | 0  | 0  | 0   | 0   | Both Plan 412 |
| 21 | 0  | Orig Plan 413 | 0  | 0   | 1  | 4   | -1   | 21 | 0 Opt Plan 413 | 0 | 0  | 1  | 4   | -1  | Both Plan 413 |
| 28 | 0  | Orig Plan 414 | 0  | 0   | 2  | 5   | -2   | 28 | 0 Opt Plan 414 | 0 | 0  | 2  | 5   | -2  | Both Plan 414 |
| 46 | 0  | Orig Plan 415 | 0  | 8   | 20 | 18  | -52  | 46 | 0 Opt Plan 415 | 0 | 8  | 20 | 18  | -52 | Both Plan 415 |
| 14 | 0  | Orig Plan 418 | 0  | 0   | 0  | 0   | 0    | 14 | 0 Opt Plan 418 | 0 | 0  | 0  | 0   | 0   | Both Plan 418 |
| 17 | 0  | Orig Plan 421 | 0  | 0   | 0  | 0   | 0    | 17 | 0 Opt Plan 421 | 0 | 0  | 0  | 0   | 0   | Both Plan 421 |
| 15 | 0  | Orig Plan 422 | 0  | 0   | 0  | 1   | 0    | 15 | 0 Opt Plan 422 | 0 | 0  | 0  | 1   | 0   | Both Plan 422 |
| 7  | 0  | Orig Plan 423 | 0  | 0   | 0  | 0   | 0    | 7  | 0 Opt Plan 423 | 0 | 0  | 0  | 0   | 0   | Both Plan 423 |
| 24 | 0  | Orig Plan 424 | 0  | 1   | 2  | 1   | -6   | 24 | 0 Opt Plan 424 | 0 | 1  | 2  | 1   | -6  | Both Plan 424 |
| 23 | 1  | Orig Plan 427 | 0  | 0   | 0  | - 4 | 0    | 24 | 0 Opt Plan 427 | 0 | 0  | 0  | - 4 | 0   | Both Plan 427 |
| 0  | 12 | Orig Plan 432 | 0  | 0   | 0  | 0   | 0    | 12 | 0 Opt Plan 432 | 0 | 0  | 0  | 0   | 0   | Both Plan 432 |
| 14 | 0  | Orig Plan 433 | 0  | 0   | 0  | 0   | 0    | 14 | 0 Opt Plan 433 | 0 | 0  | 0  | 0   | 0   | Both Plan 433 |
| 11 | 0  | Orig Plan 434 | 0  | 0   | 0  | 0   | 0    | 11 | 0 Opt Plan 434 | 0 | 0  | 0  | 0   | 0   | Both Plan 434 |
| 10 | 0  | Orig Plan 435 | 0  | 0   | 0  | 0   | 0    | 10 | 0 Opt Plan 435 | 0 | 0  | 0  | 0   | 0   | Both Plan 435 |
| 12 | 0  | Orig Plan 436 | 0  | 0   | 0  | 0   | 0    | 12 | 0 Opt Plan 436 | 0 | 0  | 0  | 0   | 0   | Both Plan 436 |
| 34 | 0  | Orig Plan 438 | 1  | - 4 | 10 | 8   | -35  | 33 | 1 Opt Plan 438 | 0 | 5  | 5  | 11  | -25 | Both Plan 438 |
| 9  | 0  | Orig Plan 442 | 0  | 0   | 0  | 0   | 0    | 9  | 0 Opt Plan 442 | 0 | 0  | 0  | 0   | 0   | Both Plan 442 |
| 15 | 0  | Orig Plan 446 | 0  | 1   | 2  | 1   | -6   | 15 | 0 Opt Plan 446 | 0 | 1  | 2  | 1   | -6  | Both Plan 446 |
| 33 | 0  | Orig Plan 447 | 0  | 0   | 0  | 9   | 0    | 33 | 0 Opt Plan 447 | 0 | 0  | 0  | 9   | 0   | Both Plan 447 |
| 33 | 1  | Orig Plan 449 | 0  | 0   | 0  | 1   | 0    | 34 | 0 Opt Plan 449 | 0 | 0  | 0  | 2   | 0   | Both Plan 449 |
| 87 | 7  | Orig Plan 455 | 16 | 13  | 20 | 17  | -216 | 92 | 2 Opt Plan 455 | 0 | 14 | 17 | 16  | -73 | Both Plan 455 |
| 36 | 0  | Orig Plan 457 | 0  | 2   | 5  | 9   | -13  | 36 | 0 Opt Plan 457 | 0 | 2  | 5  | 9   | -13 | Both Plan 457 |
| 34 | 1  | Orio Plan 458 | 2  | 1   | 7  | 6   | -38  | 34 | Ont Plan 458   | 0 | 4  | 7  | 6   | -23 | Both Plan 458 |

| 12281 | 613               | 399     | 752     | 1524    | 2245    | -8123   | 12641 | 253               | 0     | 707     | 1578    | 2409    | -4406   |   |         |
|-------|-------------------|---------|---------|---------|---------|---------|-------|-------------------|-------|---------|---------|---------|---------|---|---------|
|       | hi=red=work to do | hi=bad  | hi=bad  | hi=bad  | hi=bad  | low=bad |       | hi=red=work to do |       | hi=bad  | hi=bad  | hi=bad  | lo=bad  |   |         |
|       |                   | lo=good | lo=good | lo=good | lo=good | hi=good |       |                   |       | lo=good | lo=good | lo=good | hi=good |   |         |
|       | 12894             |         |         |         |         |         |       | 12894             |       |         |         |         |         |   |         |
|       | Sum               |         |         |         |         |         |       | Sum               |       |         |         |         |         |   |         |
|       | 4,75%             |         |         |         |         |         |       | 1,96%             |       |         |         |         |         |   |         |
|       | % Unplatformed    |         |         |         |         |         |       | % Unplatformed    |       |         |         |         |         |   |         |
|       | 95,25%            |         |         |         |         |         |       | 98,04%            |       |         |         |         |         |   |         |
|       | % Platformed      |         |         |         |         |         |       | % Platformed      |       |         |         |         |         |   |         |
|       |                   |         |         |         |         |         |       |                   |       |         |         |         |         | - | -       |
|       |                   |         |         |         |         |         |       |                   | <br>P | < mil 1 | F 4 .   | - •     |         |   | $-\psi$ |

Results

Comparative Overview

# **TPP** Research and Integration

|   | inte     | grated:    |
|---|----------|------------|
| publication   | company  | in tool(s) |
| [Zwaneveld et al.(1996)Zwaneveld, Kroon, Romeijn, Salomon, Dauzère-Perès, Van Hoesel, and Ambergen] | ProRail  | CTATIONS   |
| [Zwaneveld(1997)]   | NL       | STATIONS   |
| [De Luca Cardillo(1998)]  |          |            |
| [Delerme and Redriguer(2001)]   | SNCE     | RECIFE     |
| [Delottie and Kounguez(2001)]   | 31401    | FR         |
| [Billionnet(2003)]  |          |            |
| [Carey and Cantille(2002)]  | British  |            |
|   | Rail, UK |            |
| [Caprara et al.(2011)Caprara, Galli, and Toth]  | RFI, IT  |            |
| [Lusby et al.(2011)Lusby, Larsen, Ryan, and Ehrgott]  |          |            |
| [Sels et al (2014)Sels, Dewilde, Catterises, and Vansteenworgen]                                    | Infrabel | Ocapi      |
| [Jeis et al.(2014)Jeis, Dewilde, Cattiysse, and Valisteenwegen]                                     | BE       | Leopard    |

#### Table: Comparing TPP Research & Integration

# Conclusions & Future Work

#### Conclusions

- Leopard usable as check of current platform assignment
  - indicates all conflicts
  - indicates all robustness issues
- Leopard usable as generator of correct platform assignment
  - guarantees no conflicts
  - can have robustness issues, indicates them
- fast as a Leopard
- Further Work
  - roll-out with Infrabel planners
  - avoid robustness issues
  - weight trains per # passengers
  - allow some variability of platform times
  - allow multiple routes per line-platform combination

Automatically and Quickly Planning Platform and Route of Trains in Railway Stations Conclusions & Future Work



- Questions?
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- www.LogicallyYours.com/Company/

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