## Maximizing Trains Platformed, for a given Timetable

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## Task

Belgian Infrastructure Management Company: Infrabel:
"Maximizing Trains Platformed, for a given Timetable"

Resulting Schedule Implies:
Station Capacity Consumption

## Fixed: Constants:

Infrastructure, Timetable, Train Lines, Halting Pattern

## To Determine: Variables <br> Platform, In- \& Out-Routing, Corresponding sub-times, (in)feasible trains

## Specifics:

One Day of Traffic

## Reality



Figure: Train Occupation Time Points and Durations Between Them

## Model



Figure: Calculations are done from platform intervals towards routing intervals.

## Mixed Integer Linear Programming

- Train Platforming Problem, but with fixed times
- Mixed Integer Linear Programming approach, optimal
- Fictive platform connected to fictive routings, always feasible


## Goal Function:

- Minimize:

$$
\begin{align*}
g\left(o p_{o, p}\right) & =\sum_{o \in O_{I N I}} C 2 F_{I N I} c h 2 f_{o}+C 2 O R_{I N I I} \text { ch2or }  \tag{1}\\
& +\sum_{o \in O_{\text {SUP }}} C 2 F_{S U P} \text { ch } 2 f_{o}+\text { C2OR }_{\text {SUP }} \text { ch2or }
\end{align*}
$$

## Constraints:

- Infrastructure: Connectivity Platforms-Routings, Routing Conflicts
- Timetable: Fixed Platform Times, Train Run Times, Train Lengths


## Infrastructure

- $L$ is the set of lines of both sides of a station, both in and out lines
- $P$ is the set of platforms of a station
- $R$ is the set of routings from lines towards the platforms, and from platforms to lines
- $\forall p \in P: R_{p}$ is the set of routings that are connected to platform $p$
- $r 2 p: R \rightarrow P: r \mapsto p$ is the mapping that for each routing $r$, gives the platform $p$ it is connected to
- dep : $R \times R \rightarrow\{0,1\}:\left(r_{0}, r_{1}\right) \mapsto$ dep $_{r_{0}, r_{1}}$ defines route conflict pairs


## Train Activities

- $O$ is the set of occupations to be mapped on platforms
- $M$ is the set of all movements, where several movements can belong to the same occupation
- $M_{I N}$ is the set of IN movements
- Mout is the set of OUT movements
- $\forall o \in O: M_{o}$ is the set of movements for an occupation o
- $m 20: M \rightarrow O: m \mapsto o$ is the mapping that for each movement $m$, gives the occupation $o$ it is belongs to

Note that occupations of any complexity are supported: stop, pass, split, merge, split \& merge, ...

## Variables

- $\forall o \in O$ we define the variables
- o2po as the platform $p \in P$ chosen for occupation o
- $\forall p \in P: o p_{o, p}$ as the boolean that is true iff o $2 p_{o}=p$
- $\forall o \in O: \forall m \in M_{0}$ we define the variables
- $m 2 r_{m}$ as the routing $r \in R$ chosen for movement $m$
- $\forall r \in R$ : om $r_{o, m, r}$ as the boolean that is true iff $m 2 r_{m}=r$


## Constraints: Allocation

- Occupation to Platform Boolean Integer Variable Relation

$$
\forall o \in O: \begin{cases}\sum_{p \in P} o p_{o, p} & =1  \tag{2}\\ \sum_{p^{\prime} \in P} O p_{o, p^{\prime}} \cdot p^{\prime} & =o 2 p_{o} .\end{cases}
$$

- Movement to Routing Boolean Integer Variable Relation

$$
\forall o \in O: \forall m \in M_{0}: \begin{cases}\sum_{r \in R} m r_{o, m, r} & =1  \tag{3}\\ \sum_{r^{\prime} \in R} m r_{o, m, r^{\prime}} \cdot r^{\prime} & =m 2 r_{m} .\end{cases}
$$

- Relation between occupation to platform and movement to routing allocation boolean variables:

$$
\begin{equation*}
\forall o \in O: \forall m \in M_{o}: m r_{o, m, r} \Longrightarrow o p_{m 2 o_{m}, r 2 p_{r}} \tag{4}
\end{equation*}
$$

or/and equivalently:

$$
\begin{equation*}
\forall o \in O: \forall p \in P: o p_{o, p} \Longrightarrow \sum_{r \in R_{p}} m r_{o, m, r}=1 \tag{5}
\end{equation*}
$$

## Constraints: Separation

- Separate pair of platform occupation intervals if they are on the same platform resource:

$$
\begin{align*}
& \forall o_{0} \in O: \forall o_{1} \in O: o_{0} \prec o_{1}: \\
& {\left[\text { otLoLbC } C_{o_{0}}, \text { otHiUbCC } C_{o_{0}}\right] \cap} \\
& {\left[\text { otLoLbCC } C_{o_{1}}, \text { otHiUbCC } C_{o_{1}}\right] \neq \phi:} \\
& \forall p_{0} \in P_{o_{0}}: \forall p_{1} \in P_{o_{1}}: p_{1}=p_{0}: \tag{6}
\end{align*} \quad\left\{\quad \left\{\quad o p_{o_{0}, p_{0}} \wedge o p_{o_{1}, p_{1}} .\right.\right.
$$

- Separate pair of movement routing intervals if they are on the same routing resource:

$$
\begin{align*}
& \forall m_{0} \in M: \forall m_{1} \in M: m_{0} \prec m_{1}: \\
& {\left[m t L o L b C_{m_{0}}, m t H i U b C_{m_{0}}\right] \cap} \\
& {\left[m t L o L b C_{o_{1}}, m t H i U b C_{o_{1}}\right] \neq \phi:} \\
& \forall r_{0} \in R_{m_{0}}: \forall r_{1} \in R_{m_{1}}: \operatorname{dep}_{r_{0}, r_{1}}:
\end{align*} \quad\left\{\quad \left\{\quad \begin{array}{c}
m r_{o_{0}, m_{0}, r_{0}} \wedge m r_{o_{1}, m_{1}, r_{1}} \tag{7}
\end{array}\right.\right.
$$

## Schedule Graph



Figure: Occupation Time Interval Graph for Mechelen Station and Peak Original and Optimized Traffic
[Original schedule in dark colors. Optimized schedule in light colors.] * [ Red for initial, blue for supplementary traffic.]

## Solver Response Times Table I

| $\begin{gathered} \text { Station } \\ \# \mathrm{P}, \# \mathrm{R}, \# \mathrm{O} \end{gathered}$ | $\begin{gathered} \text { Solver } \\ \text { on Machine } \end{gathered}$ | $\begin{aligned} & \text { \#Con- } \\ & \text { straints } \end{aligned}$ | \#Var- <br> iables | $\begin{gathered} \hline \text { Time } \\ (\mathrm{h}, \mathrm{~m}, \mathrm{~s}) \end{gathered}$ |
| :---: | :---: | :---: | :---: | :---: |
| Bergen$7,128,178$ | Cplex v12.2 on Apple 4C 2.3-3.2 GHz | 103362 | 33473 | 291.34s |
|  | Gurobi v4.5.1 on Apple 4C $2.3-3.2 \mathrm{GHz}$ | 109955 | 37175 | 451.35s |
|  | Cplex v11.2 on HP 2C 3.16 GHz | 103365 | 33474 | 1216s |
|  | Xpress v7.2 on HP 2C 3.16 GHz | 109955 | 37175 | OM at 3100s |
|  | Gurobi v4.5.1 on HP 2C 3.16 GHz | 109955 | 37175 | 4422s |
| $\begin{gathered} \text { Brugge } \\ 10,198,68 \end{gathered}$ | Cplex v12.2 on Apple 4C 2.3-3.2 GHz | 34384 | 10958 | 3.54s |
|  | Gurobi v4.5.1 on Apple 4C $2.3-3.2 \mathrm{GHz}$ | 35627 | 11717 | 23.5s |
|  | Cplex v11.2 on HP 2C 3.16 GHz | 34384 | 10958 | 305s |
|  | Xpress v7.2 on HP 2C 3.16 GHz | 35627 | 11717 | 11s |
|  | Gurobi v4.5.1 on HP 2C 3.16 GHz | 35627 | 11717 | 84s |
| Dender- <br> leeuw$9,206,211$ | Cplex v12.2 on Apple 4C 2.3-3.2 GHz | 154553 | 47187 | 37.57s |
|  | Gurobi v4.5.1 on Apple 4C $2.3-3.2 \mathrm{GHz}$ | 159226 | 50074 | 26.79s |
|  | Cplex v11.2 on HP 2C 3.16 GHz | 154553 | 47187 | 621 s |
|  | Xpress v7.2 on HP 2C 3.16 GHz | 159226 | 50074 | 11s |
|  | Gurobi v4.5.1 on HP 2C 3.16 GHz | 159226 | 50074 | 2651s |

Table: Optimization Execution Times I
$\# P=$ number of real platforms. $\# R=$ number of real routings. $\# \mathrm{O}=$ number of occupations, initial and supplementary together. Cplex Matrix dimensions are already (slightly) reduced ones. n.a. $=$ not available (not enough patience limit). $\mathrm{OM}=\mathrm{Out}$ of Memory.

Solver Response Times

## Solver Response Times Table II

| $\begin{gathered} \text { Station } \\ \# \mathrm{P}, \# \mathrm{R}, \# \mathrm{O} \end{gathered}$ | $\begin{gathered} \text { Solver } \\ \text { on Machine } \end{gathered}$ | \#Constraints | $\begin{aligned} & \text { \#Var- } \\ & \text { iables } \end{aligned}$ | $\begin{gathered} \text { Time } \\ (\mathrm{h}, \mathrm{~m}, \mathrm{~s}) \end{gathered}$ |
| :---: | :---: | :---: | :---: | :---: |
| $\begin{gathered} \text { Leuven } \\ 14,324,256 \end{gathered}$ | Cplex v12.2 on Apple 4C 2.3-3.2 GHz | 105709 | 36242 | 303s |
|  | Gurobi v4.5.1 on Apple 4C 2.3-3.2 GHz | 113119 | 40676 | 224.92s |
|  | Cplex v11.2 on HP 2C 3.16 GHz | 105709 | 36242 | 321s |
|  | Xpress v7.2 on HP 2C 3.16 GHz | 113119 | 40676 | 3600s (at 3\%) |
|  | Gurobi v4.5.1 on HP 2C 3.16 GHz | 113119 | 40676 | 1569 |
| Mechelen | Cplex v12.2 on Apple 4C 2.3-3.2 GHz | 9959 | 4756 | 0.09s |
|  | Gurobi v4.5.1 on Apple 4C 2.3-3.2 GHz | 12201 | 6292 | 3.1s |
| 10,170,121 | Cplex v11.2 on HP 2C 3.16 GHz | 9959 | 4756 | 4.3 s |
|  | Xpress v7.2 on HP 2C 3.16 GHz | 12201 | 6293 | 7s |
|  | Gurobi v4.5.1 on HP 2C 3.16 GHz | 12201 | 6293 | 17s |

Table: Optimization Execution Times II
$\# \mathrm{P}=$ number of real platforms. $\# \mathrm{R}=$ number of real routings. $\# \mathrm{O}=$ number of occupations, initial and supplementary together. Cplex Matrix dimensions are already (slightly) reduced ones. n.a. $=$ not available (not enough patience limit). $\mathrm{OM}=$ Out of Memory.

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## Results

Solver Response Times

## Solver Times Graph



Figure: Intel Core2 Duo, 1.4 GB per process (left) to QuadCore i7, 8GB per process (right) comparison. Serious Improvement across all Solvers.

## Conclusions \& Further Work

- Conclusions: Business Results
- timetable based capacity (cfr UIC code 406)
- fixed time platforming
- robust via separation times
- platforming (\& routing) in less than 5 minutes per station
- both conservative and progressive options
- improved estimation in practice
- user surprised about platforming 'cleverness/inventiveness'
- business problem solved
- Conclusions: Research Method: Compared To Billonnet (2003)
- also fixed time TPP
- routing choice influences timing and potential conflicts
- so our conflicts are conditional, 10 to 100 times bigger problems
- no (conditional) conflict clique heuristics
- we cover full search space i.o. subset
- we use real world data i.o. randomized
- half the solver time


## Further Work

- interface
- availability of data of all stations
- model: consider passenger transfers
- strive for transfers between neighboring platforms
- weigh with passenger numbers (flows)

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## Questions?

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