



Extending Periodic Event Scheduling by Decisional Flow Transportation Networks

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- 2 Periodic Event Scheduling
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- 4 Periodic Rail Freight Planning
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#####
##### CONVERT PESP TO SAT #####
#####
cur_pesp
Graph: nodes=8180 arcs=15657
ShrinkGraph: nodes=8174 arcs=15653
calc and set connections ... done
adj_mat: cons=15653 maxcons=33419400 density=0%
Calculate nodes ... done (#nodes = 8174) in 0.653secs
Calculate connections ... done (#connections = 15653) in 0.91
merge clauses ... done (#variables=482384 #clauses=1447091)

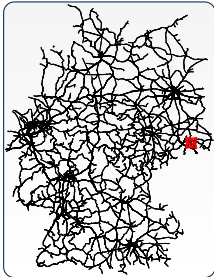
#####
##### SOLVE SAT #####
#####
SATSOLVER: glucose

c This is glucose 2.0 -- based on MiniSAT (Many thanks to M
c WARNING: For repeatability, setting FPU to use double prec
c =====[ Problem Statistics ]=====
c |
c | Number of variables:      482384
c | Number of clauses:       1447091
c | Parse time:               0.22 s
c |
c =====[ Search Statistics ]=====
c | Conflicts | ORIGINAL |
```

- timetabling of public transport railway networks (e. g., PESP) is difficult to be calculated automatically (*NP*-complete)
 - no existence of “default” software
- SAT solvers are universally applicable to real world problems
- best approach:

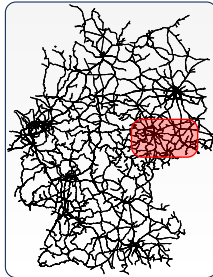
PESP instance → PESP \leq_p SAT → SAT solver → SAT solution → PESP schedule

manual effort



max: 20 nodes, 40 constraints

previous state-of-the-art solver



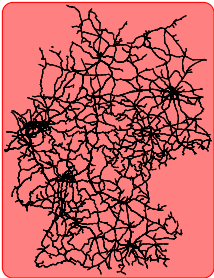
600 nodes, 3 000 constraints

new approach (SAT)



15 000 nodes, 80 000 constraints
(up to 1 000 000 constraints)

new approach (SAT)

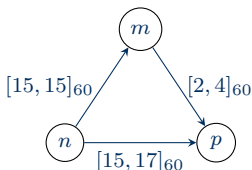


15 000 nodes,
80 000 constraints
(up to 1 000 000
constraints)

- extracting and resolving infeasible periodic event networks (local conflicts)
- **flow and decision periodic event scheduling (FDPESP)**
 - non-connected flow graphs (track allocation)
 - distinct chain paths (integration of routing and timetabling)
 - **duplicated chain paths (periodic rail freight train paths)**
- SAT-based optimization (e. g., MaxSAT, MCS)
 - minimization of weighted slacks
 - optimization in FDPESP

Periodic Event Networks

Periodic Event Scheduling Problem (PESP)



- period $T = 60$
- (periodic) events (nodes) $n, m, p \in \mathcal{V}$
 - schedule $\Pi : \mathcal{V} \rightarrow [0, T - 1] \subseteq \mathbb{N}$
 - potential $\Pi(n), \Pi(m), \Pi(p)$
- constraints resp. activities (edges) \mathcal{E}
- e. g., (n, m) with $[15, 15]_{60}$
 - constraint holds iff $\Pi(m) - \Pi(n) \in [15, 15]_{60}$
 - e. g., $\Pi(n) = 2, \Pi(m) = 17$ or $\Pi(n) = 50, \Pi(m) = 5$
- tuple $\mathcal{N} = (\mathcal{V}, \mathcal{E}, T)$ is called periodic event network

- let $\mathcal{N} = (\mathcal{V}, \mathcal{E}, T)$ be a periodic event network

Definition (Valid Schedule)

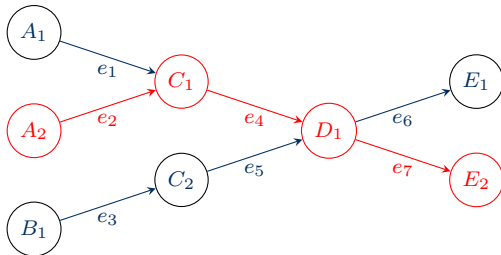
A schedule Π is **valid for \mathcal{N}** , iff for all $e = (n, m) \in \mathcal{E}$ with $[l, u]_T$ it holds

$$\Pi(m) - \Pi(n) \in [l, u]_T.$$

Definition (Periodic Event Scheduling Problem (PESP))

Is the decision problem whether it exists a valid schedule for \mathcal{N} .

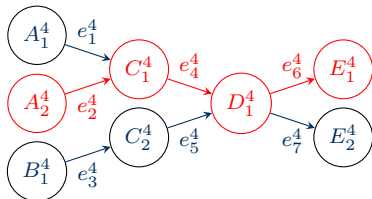
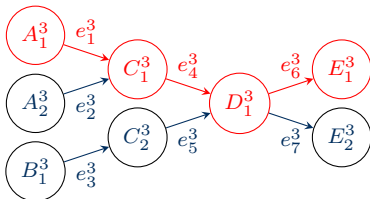
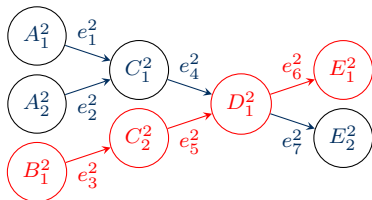
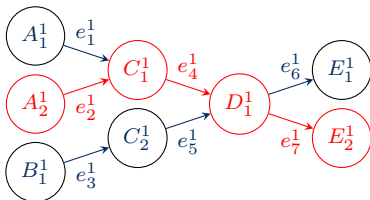
- PESP is *NP*-complete

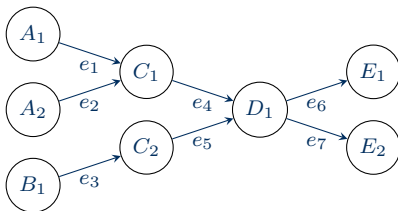


- extending PESP by further structures:
 - decision nodes and decision edges
 - transport networks (flow graphs)
- goal: **path** of a source to a destination node maintaining feasibility

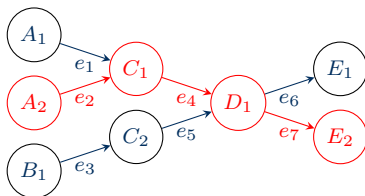
Flow Decision PESP

Duplicating Flow Graphs





- $\mathcal{N} = (\mathcal{V}, \mathcal{E}, T)$... periodic event network
- \mathcal{S} ... set of flow graphs
- \mathcal{H} ... set of decision nodes ($\mathcal{H} \subseteq \mathcal{V}$)
- bijective mapping of flow edges e_i ($i \in \{1, \dots, 7\}$) and periodic events via label function $l(e_i) = n_i$ ($n_i \in \mathcal{H}$)
- $\mathcal{D} = (\mathcal{V}, \mathcal{E}, T, \mathcal{H})$ is flow decision periodic event network for \mathcal{S}
- node, edge sets of \mathcal{S} not necessarily disjoint (currently no application)



- $\mathcal{D} = (\mathcal{V}, \mathcal{E}, T, \mathcal{H})$... flow decision periodic event network for flow graph set \mathcal{S}
- \mathcal{V}' ... set of periodic events ($\mathcal{V}' \subseteq \mathcal{V}$), e. g., $\mathcal{V}' = \{n_2, n_4, n_7, n_8\}$
- Π ... schedule for \mathcal{V}'

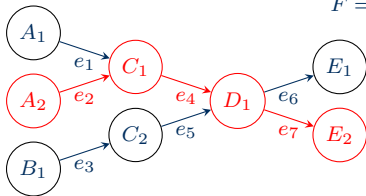
Definition (Valid Schedule – extended)

Π is valid for \mathcal{D} under \mathcal{S} , iff

- exists exactly one path for all flow graphs in \mathcal{S} via l^{-1} for nodes in \mathcal{V}'
- for all $e = (n, m) \in \mathcal{E}$: $n, m \in \mathcal{V}' \Rightarrow e$ holds under Π

$$F = \neg p \wedge (q \vee r)$$

- literal: $L = p$ or $L = \neg p$ (variable or its negation), $p \in \mathcal{R}$
- clause c : disjunction of literals
- formula F in **conjunctive normal form** (CNF): conjunction of clauses
- interpretation $I : \mathcal{R} \rightarrow \{0, 1\}$
- F is **satisfiable** ($F^I = 1$) iff for all clauses at least one literal $L^I = 1$
- e. g., $p^I = 0$, $q^I = 1$ and $r^I = 0$ implies $F^I = 1$
- F **unsatisfiable** if no such I exists



$$\begin{aligned}
 F = & (q_1 \vee q_2 \vee q_3) \wedge (\neg q_1 \vee \neg q_2) \wedge (\neg q_1 \vee \neg q_3) \wedge (\neg q_2 \vee \neg q_3) \\
 & \wedge (q_6 \vee q_7) \wedge (\neg q_6 \vee \neg q_7) \\
 & \wedge (\neg q_6 \vee \neg q_7) \\
 & \wedge (\neg q_1 \vee \neg q_2) \wedge (\neg q_4 \vee \neg q_5) \\
 & \wedge (\neg q_1 \vee q_4) \wedge (\neg q_2 \vee q_4) \wedge (\neg q_4 \vee q_6 \vee q_7) \dots
 \end{aligned}$$

- q_i ... propositional variable if flow edge (node) e_i is active (in path)
- exactly one source (at-least-one, at-most-one)
- exactly one destination (at-least-one, at-most-one)
- flow conservation
 - at-most-one outgoing flow edge per flow node
 - at-most-one incoming flow edge per flow node
 - at-least-one successor flow edge active if incoming active
- $q_2^I = 1, q_4^I = 1, q_7^I = 1$ (remaining = 0) \Rightarrow **path** (e_2, e_4, e_7)

Encoding to SAT

encoding Flow Decision PESP constraints

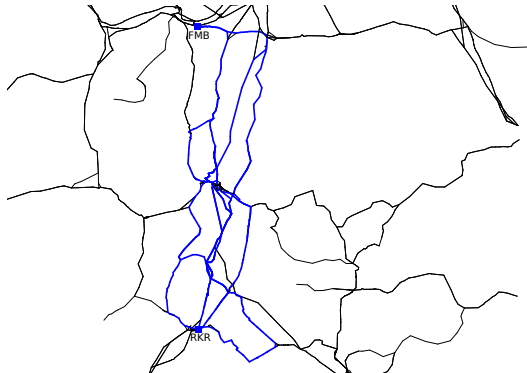
- $\mathcal{D} = (\mathcal{V}, \mathcal{E}, T, \mathcal{H})$... flow decision periodic event network for flow graph set \mathcal{S}
- encode constraint (edge) $e = (n_i, n_j)$ for a periodic event network with mapping encodeEdge (developed in 2011)
- $M = \{q_k \in \mathcal{R} \mid k \in \{i, j\} : n_k \in \mathcal{H}\}$
- encoding for constraints

$$\text{encodeEdge}_M(e) = \bigvee_{q \in M} (\neg q) \vee \text{encodeEdge}(e)$$

final encoding:

- encode flow graphs
- encode periodic events
- encode constraints via encodeEdge_M

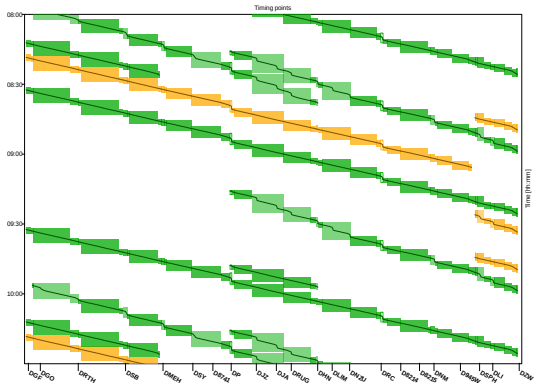
and connect all structures conjunctively



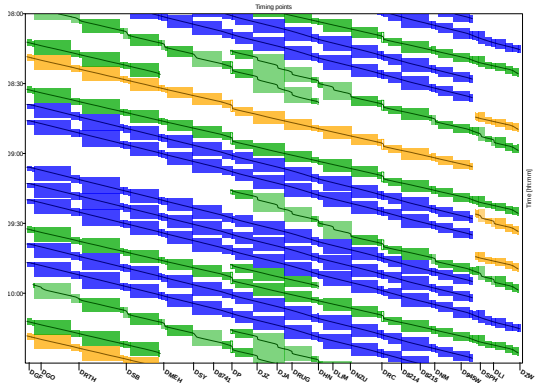
- input data:
 - feasible periodic event network
 - relation of the to be inserted train paths (e. g., Mainz → Karlsruhe, Germany)

Periodic Rail Freight Planning

Problem (2)



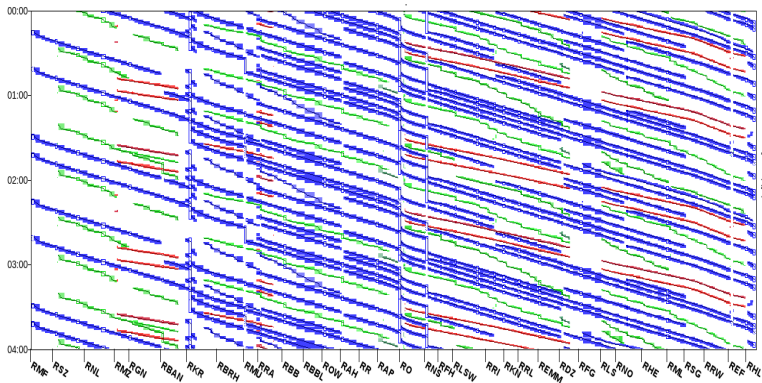
- goal: insertion (path+timetable) of rail freight train paths based on short sub paths (e. g., Gutenfürst → Zwickau, Germany)



- newly inserted rail freight train paths (blue) on given relation (Gutenfürst → Zwickau, Germany)

Periodic Rail Freight Planning

Result (2)



- Mannheim (Germany) → Basel (Switzerland)
- 200 flow edges per flow graph, 12 duplicated flow graphs

- automated timetabling of large and complex periodic event networks is possible
- reasonable extension of PESP by flow graphs:
 - track allocation
 - integration of routing and timetabling
 - periodic rail freight train paths
- outlook:
 - more efficient encoding for even better computational time
 - solver parallelization with appropriate preprocesses



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