

On the Interaction between Robust Timetable Planning and Delay Management

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Timetabling

Schedule the departure and arrival time of trains in order to reduce the traveling time for passengers

Delay Management

Modify the timetable when unpredictable events cause delays

Approaches

- Apply recovery strategies or rescheduling
- Design the timetable in order to easily recover when delays occur. This approach is called *Recoverable Robustness* [Liebchen et al. 2007, Cicerone et al. 2007]

This work

This work studies the *Recoverable Robustness* approach

Results of the paper

- We define the problem of finding timetables that are *recoverable robust* w. r. t. some kind of delays (*RDM Problem*)
- We show that finding an optimal solution for *RDM* is NP-hard
- We give an approximation algorithm, compute its price of robustness and we show that it is optimal for particular cases

Outline

- 1 Recoverable Robustness
 - Recoverable Robustness Problem
 - Robust Solutions and Algorithms
 - Price of Robustness
- 2 Recoverable Robust Delay Management
 - Timetabling Problem
 - Robust Delay Management Problem
- 3 Complexity
- 4 Approximation Algorithm
- 5 Conclusions and Future Works

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Idea

Given some *recovery capabilities*, a timetable is *robust against delays* if it can be turned into a *new* feasible timetable by applying the recovery capabilities when a delay occurs

Mimization Problem

$P = (I, F, f)$ where

- I , set of instances of P
- F , for each $i \in I$, $F(i)$ is the set of feasible solutions for i
- $f : S \rightarrow \mathbb{R}$, objective function of P , where $S = \bigcup_{i \in I} F(i)$

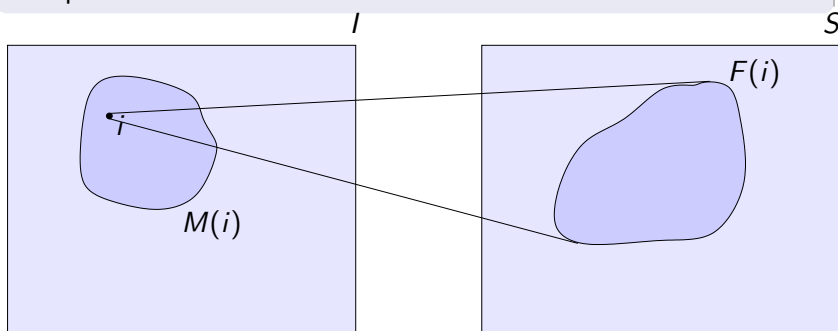
Recoverable Robustness Problem

$\mathcal{P} = (P, M, \mathbb{A})$

- $M : I \rightarrow 2^I$, *modification* function for instances of P
- \mathbb{A} , class of *recovery algorithms*

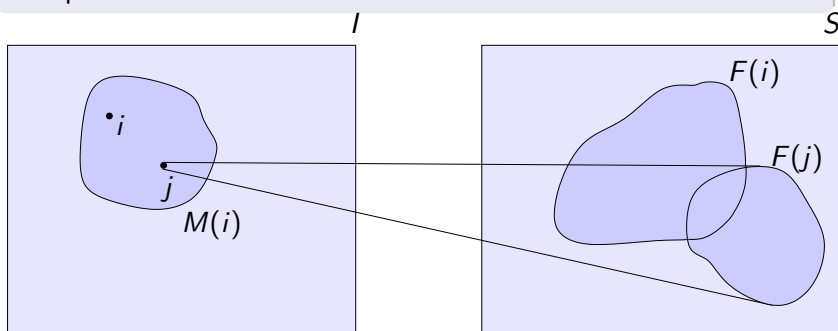
Modification function

- $i \in I$, an instance of P
- a disruption is a modification to i that can be seen as another instance $j \in M(i)$
- $M(i)$, set of instances of that can be obtained by applying all possible modifications to i



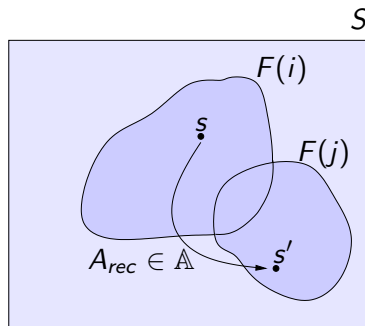
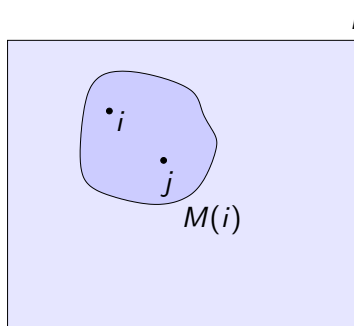
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Recovery algorithms

- Represent recovery capabilities against disruptions
- Given $(i, s) \in I \times S$, $j \in M(i)$ and $A_{rec} \in \mathbb{A}$,
 $A_{rec}(i, s, j) = s' \in F(j)$



Recovery algorithms

\mathbb{A} can be defined in terms of some restrictions, for example:

computational complexity: $\forall i \in I, \forall s \in S, \forall j \in M(i), A_{rec}(i, s, j)$
must be computed in $O(\cdot)$ time

feasibility constraints: Given a distance function $d : S \times S \rightarrow \mathbb{R}$
and $\Delta \in \mathbb{R}$, then $\forall i \in I, \forall s \in S, \forall j \in M(i),$
 $d(s, A_{rec}(i, s, j)) \leq \Delta$

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Definition (Robust Solution)

Given an instance $i \in I$, $s \in F(i)$ is a *robust solution* for i if and only if:

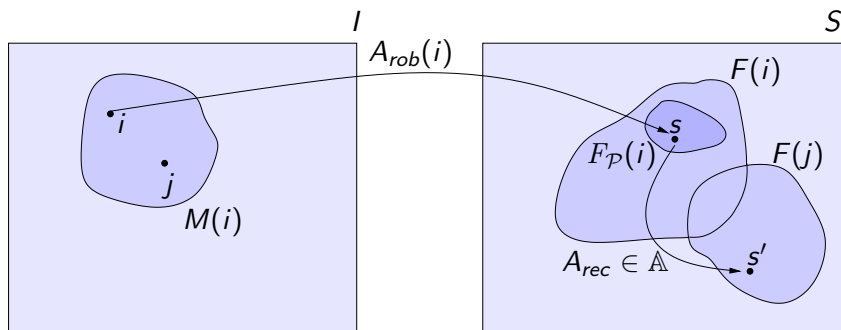
$$\forall j \in M(i), \exists A_{rec} \in \mathbb{A} : A_{rec}(i, s, j) \in F(j)$$

Set of Robust solutions:

$$F_{\mathcal{P}}(i) = \{s \in F(i) : s \text{ is a robust solution for } i\}$$

Definition (Robust Algorithm)

A *robust algorithm* is any algorithm A_{rob} such that, for each $i \in I$, $A_{rob}(i)$ is a robust solution for i with respect to \mathcal{P} .



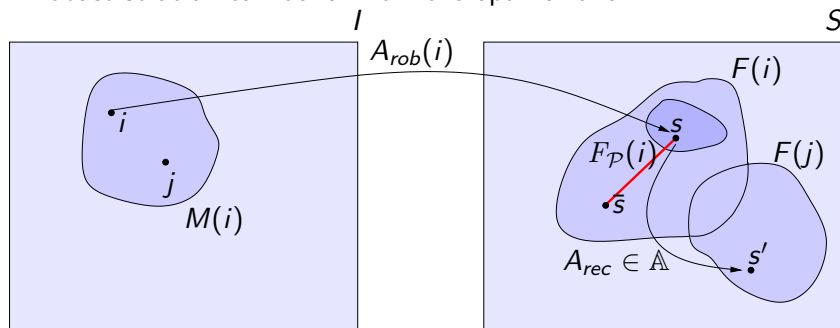
Strict Robustness

If we do not consider recoverability, that is, algorithms in \mathbb{A} do not change the solution s , $\forall (i, s) \in I \times S$, $\forall j \in M(i)$, $A_{rec}(i, s, j) = s$, then $\mathcal{P} = (P, M, \mathbb{A})$ is called *strict robustness problem*

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A robust solution can be far from the optimal one



Price of robustness

The worst case ratio between the cost of the solution computed by A_{rob} and the optimal one is called *price of robustness of A_{rob}* .

The minimum price of robustness among all the robust algorithms is called *price of robustness of problem*

Given a Recoverable Robustness Problem \mathcal{P} ,

Definition (Price of robustness of a robust algorithm A_{rob})

$$P_{rob}(\mathcal{P}, A_{rob}) = \max_{i \in I} \left\{ \frac{f(A_{rob}(i))}{\min\{f(x) : x \in F(i)\}} \right\}$$

Definition (Price of robustness of \mathcal{P})

$$P_{rob}(\mathcal{P}) = \min\{P_{rob}(\mathcal{P}, A_{rob}) : A_{rob} \text{ is a robust algorithm for } \mathcal{P}\}$$

Definition (exact and optimal algorithms)

- A_{rob} is *exact* if $P_{rob}(\mathcal{P}, A_{rob}) = 1$
- A_{rob} is \mathcal{P} -*optimal* if $P_{rob}(\mathcal{P}, A_{rob}) = P_{rob}(\mathcal{P})$

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The problem [Schöbel, 2007]

Scheduling the departure and arrival time of trains

Instances

- A *event activity network* made of departure and arrival events and activities
- The *minimum time* needed for each activity
- The *number of passengers* involved in each activity

Solutions

A scheduled time for each event in the network that satisfies the minimum duration time of each activity

Objective

Minimizing the overall traveling time for passengers

Instances

$\mathcal{N} = (\mathcal{E}, \mathcal{A})$ where

- \mathcal{E} : *departure and arrival events*
- \mathcal{A} : *driving, waiting and changing activities*

$L : \mathcal{A} \rightarrow \mathbb{N}$: for each activity $a \in \mathcal{A}$, $L(a)$ is the minimum duration time for a

$w : \mathcal{A} \rightarrow \mathbb{N}$: for each activity $a \in \mathcal{A}$, $w(a)$ is the number of passengers involved in a

Feasible solutions

$\Pi \in \mathbb{N}^{|\mathcal{E}|}$ such that:

- $\Pi(v) - \Pi(u) \geq L(a)$, for each $a = (u, v) \in \mathcal{A}$
- $\Pi(u) \in \mathbb{N}$, for each $u \in \mathcal{E}$

Objective

$$\min f = \sum_{a=(u,v) \in \mathcal{A}} w(a) (\Pi(v) - \Pi(u))$$

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To define a recoverable robustness problem, we need to define a modification function M and a set of recovery capabilities \mathbb{A}

Modification function

We allow only one delay on an activity a of at most α time
We can model it as an increase of the minimal duration time a
Given $i = (\mathcal{N}, L, w)$,

$$M(i) = \{(\mathcal{N}, L', w) : L' \text{ differs from } L \text{ by at most one activity}\}$$

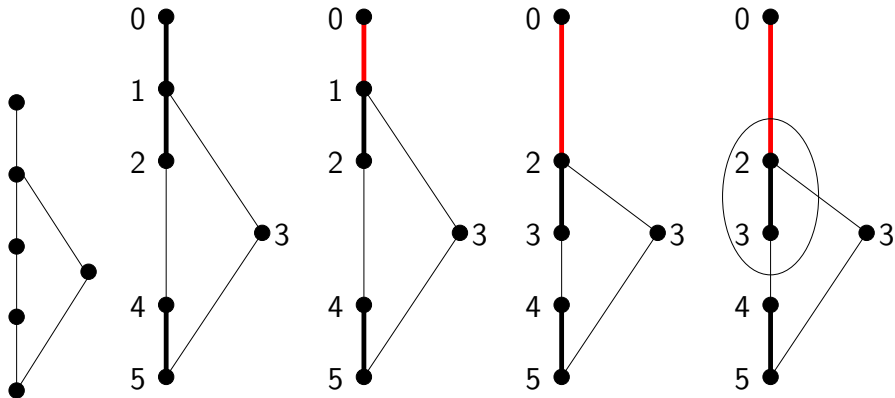
Recovery capabilities

A recovery algorithm can change the time of at most Δ *affected events*

Affected events

- The slack time of an activity $a = (u, v)$ is
$$s(a) = \Pi(v) - \Pi(u) - L(a)$$
- Given a delay of α time on the activity $a = (u, v)$, a node x is affected if there exists a path from (u, v) to x whose total slack time is less than α

$$L(a) = 1 \quad \forall a \in \mathcal{A}$$



Problem RDM

$RDM = (TT, M, \mathbb{A})$ is the problem of finding a timetable that can be recovered by changing the time of at most Δ events when a delay of at most α time occurs

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Theorem

Finding a solution for \mathcal{RDM} that minimizes f is NP-hard for $\Delta \geq 5$.

Corollary

Computing $P_{rob}(\mathcal{RDM})$ is NP-hard.

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Critical Path Method

Assume that we have a single source in \mathcal{N} , v_0

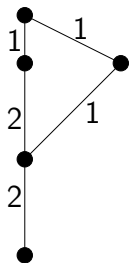
Given $i = (\mathcal{N}, L, w)$,

$$CPM(i) = \begin{cases} \Pi(v) = 0 & \text{if } v = v_0 \\ \Pi(v) = \max \{ \Pi(u) + L(a) : a = (u, v) \in \mathcal{A} \} & \text{otherwise} \end{cases}$$

- w_{min} , w_{max} , L_{min} and L_{max} : minimum and maximum values assigned by the functions w and L
- $\gamma = (1 + \frac{\alpha}{L_{min}})$
- $i_\gamma = (\mathcal{N}, \gamma L, w)$

Robust algorithm

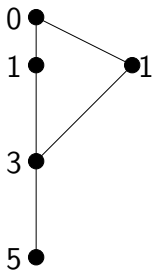
$$CPM_\gamma(i) = CPM(i_\gamma)$$



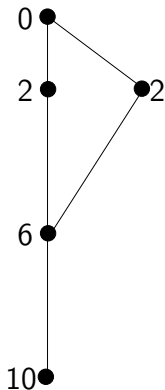
$$\alpha = 1$$

$$\gamma = 2$$

i



$CPM(i)$



$CPM_\gamma(i)$

Robustness of CPM_γ

It is easy to prove that CPM_γ is robust against delays:

For each $a = (u, v) \in \mathcal{A}$,

$$\Pi(v) - \Pi(u) \geq \left(1 + \frac{\alpha}{L_{min}}\right) L(a) \geq L(a) + \alpha$$

Theorem (Price of robustness of CPM_γ)

For any $\Delta \geq 0$, the price of robustness of CPM_γ for $RDM = (TT, M, \mathbb{A}_\Delta)$ is bounded by:

$$P_{rob}(RDM, CPM_\gamma) \leq \gamma \frac{w_{max}}{w_{min}}$$

Theorem (Price of robustness of RDM)

Let $\Delta = 0$ and $L(a)$ be constant for each $a \in A$, then

$$P_{rob}(RDM) \geq \gamma \frac{w_{min}}{w_{max}}$$

Corollary

Let $\Delta = 0$, and w and L be constant, then

$P_{rob}(RDM, CPM_\gamma) = \gamma$ and CPM_γ is RDM -optimal.

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Results of the paper

- We have defined a recoverable robustness problem: the delay management problem with one single bounded delay and limited recovery capabilities
- We have shown that finding an optimal solution for this problem is *NP*-hard
- We have given an approximation algorithm which is optimal for particular cases

Future Works

- Considering more than one delays or other kind of disruptions
- Considering different recovery capabilities