

# Realizing Temporal Transportation Trees

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Algorithmic Aspects of Temporal Graphs VII

**Imagine you are given a train track system.**



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Your task is to design a (periodic) schedule for the trains, such that travel times are sufficiently fast.

# Restriction: Transportation Trees

**Restriction:** Train track system has a tree structure.

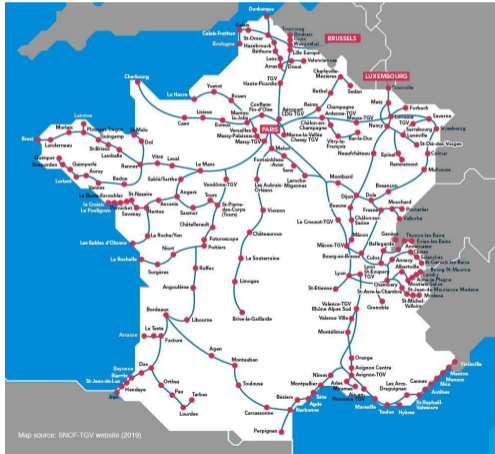
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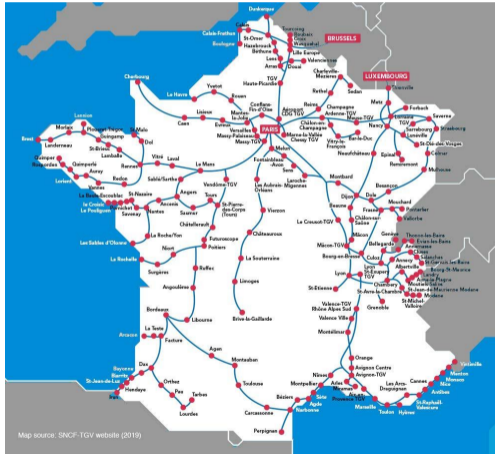
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$\mathcal{G} = (V, E, \lambda)$  where for all  $e \in E$ :

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Travel time  $\delta(u, v)$  from  $u$  to  $v$  is **duration of fastest** temporal path from  $u$  to  $v$  in  $\mathcal{G}$ .



# Example

**Duration of a fastest path:**      Last label  $-$  first label  $+$  one.

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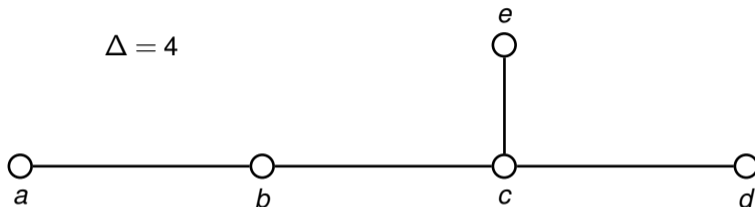
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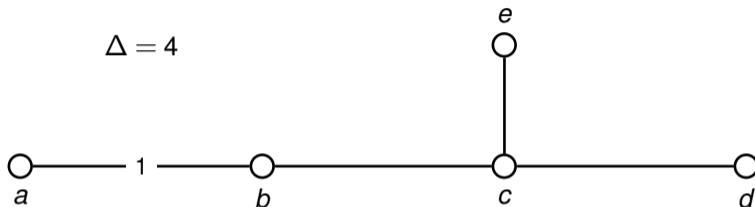
Distance matrix (excerpt):

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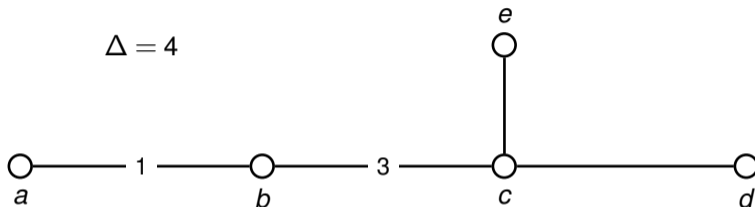
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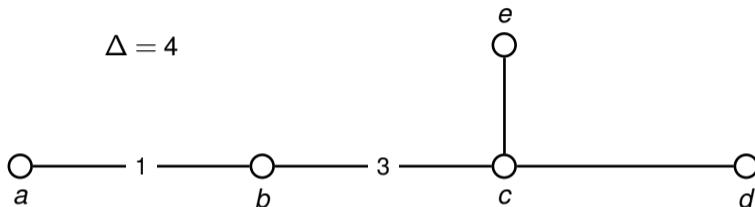
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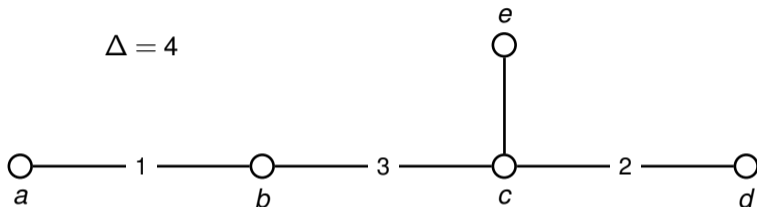
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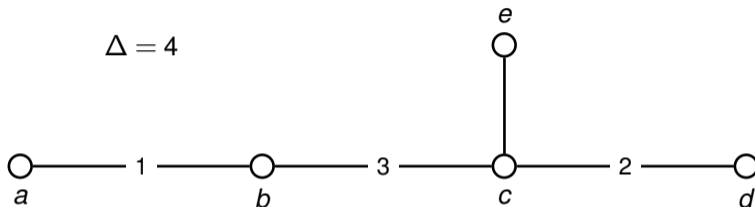
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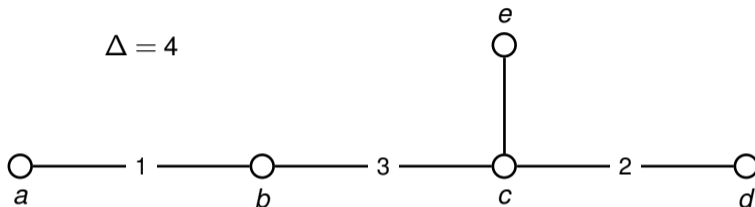
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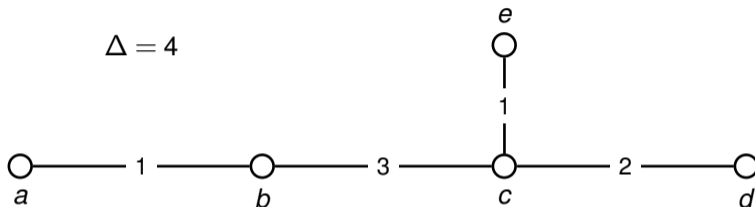
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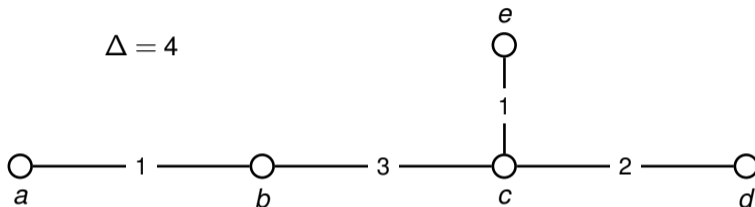
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**Input:** A vector  $x$  of  $n$  variables of which some are considered integer variables, a constraint matrix  $A \in \mathbb{R}^{m \times n}$ , two vectors  $b \in \mathbb{R}^m$ ,  $c \in \mathbb{R}^n$ , and a target value  $t \in \mathbb{R}$ .

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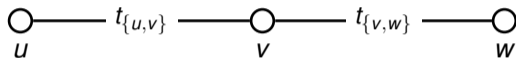
**MILP** is fixed-parameter tractable w.r.t. the number of integer variables.

## Lemma

If the constraint matrix for the fractional variables is **totally unimodular**, then the MILP admits an optimal solution where **all variables are set to integer values**.

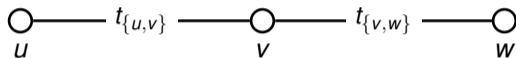
# Travel Delays

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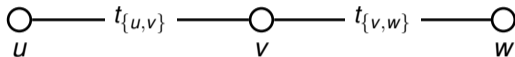
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$$\tau_v^{u,w} = \begin{cases} t_{\{v,w\}} - t_{\{u,v\}}, & \text{if } t_{\{v,w\}} > t_{\{u,v\}}, \\ t_{\{v,w\}} - t_{\{u,v\}} + \Delta, & \text{otherwise.} \end{cases}$$

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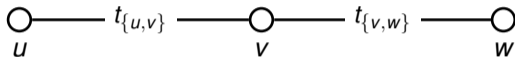


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Labels computable from travel delays!

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**Main Idea:** Create a **fractional variable** for each travel delay.

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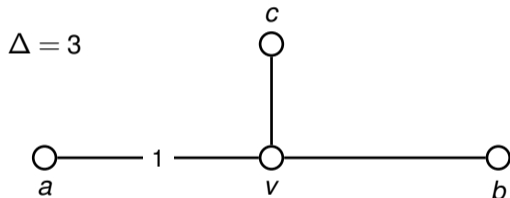
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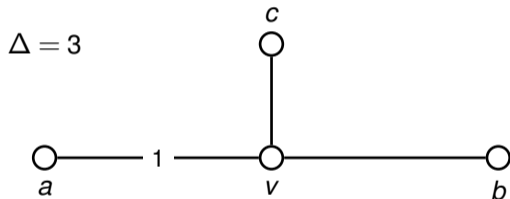
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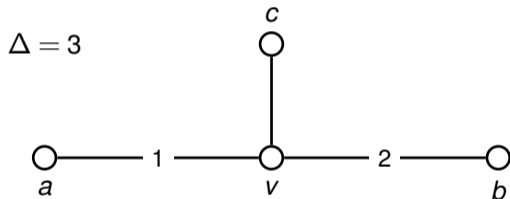
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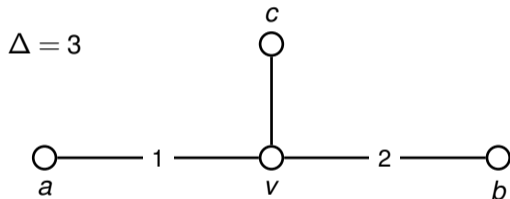
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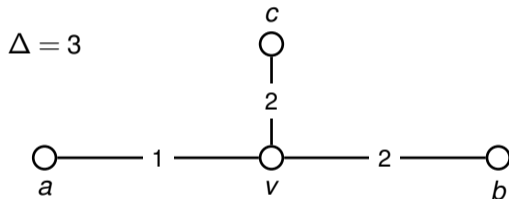
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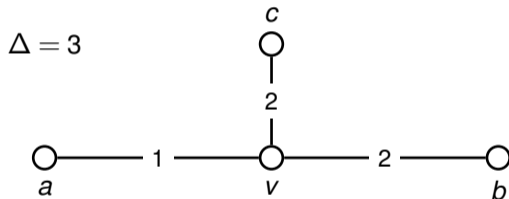


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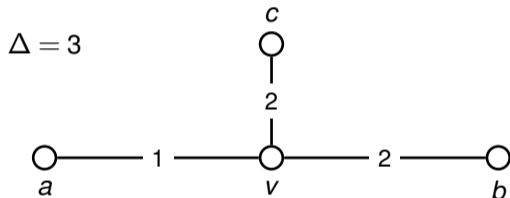
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Travel delays not  
realizable!





**Main Idea:** Create a **fractional variable** for each travel delay.

Add constraint for each vertex pair  $s, t$  checking that  $\delta(s, t) \leq D(s, t)$ .

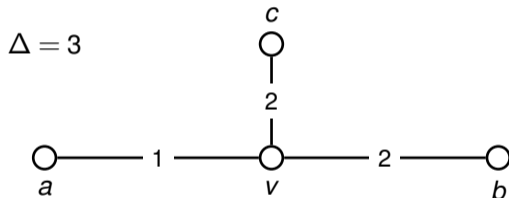
**Problem:** High degree vertices (degree larger than two).

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## Observation

Let  $G$  be a tree with  $\ell$  leaves. Then the following holds.

- The maximum degree of  $G$  is at most  $\ell$ .
- The number of vertices with degree larger than two is at most  $\ell$ .

## Main Idea:

- Create a **fractional variable**  $x_v^{a,b}$  for each travel delay from  $a$  to  $b$  at vertex  $v$ .  
Assume vertices are ordered and  $a < b$ .

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 & \sum_{\substack{v \text{ has high deg and is traversed forward}}} x_v^{a,b} + \sum_{\substack{v \text{ has high deg and is traversed backward}}} (\Delta - x_v^{a,b}) \leq D(s, t) - 1
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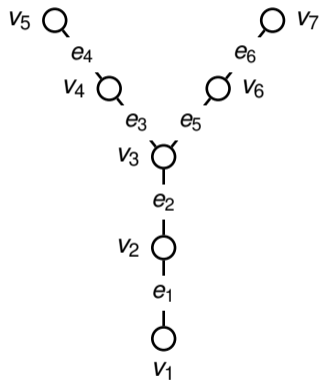
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Formal construction of the directed tree:

# MILP Formulation III

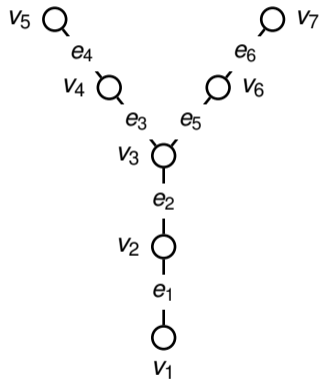
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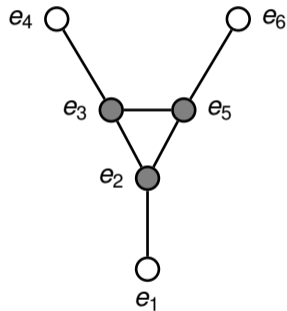
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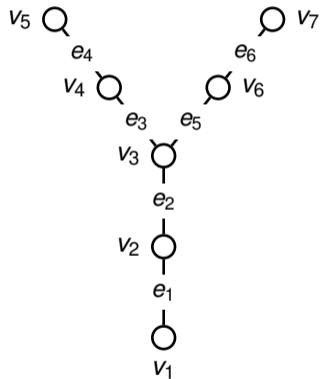


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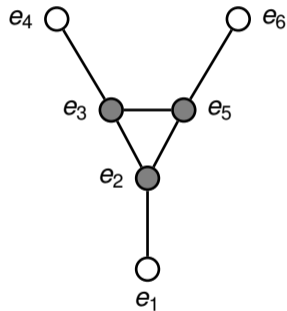


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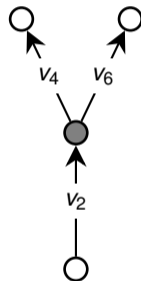
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**Thank you!**