### THE COMPLEXITY OF COMPUTING OPTIMUM LABELINGS FOR TEMPORAL CONNECTIVITY

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## Temporal Graphs

### Definition

A temporal graph G is a pair  $(G, \lambda)$  where:

- G = (V, E) is an underlying (di)graph and
- $\lambda : E \to 2^{\mathbb{N}}$  is a discrete time-labeling function.

Maximum label is called a *lifetime* (*age*) of G.

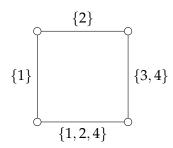
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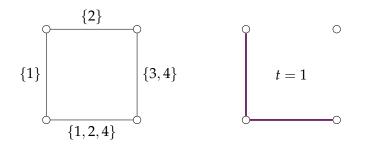
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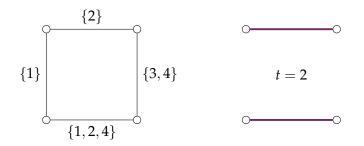
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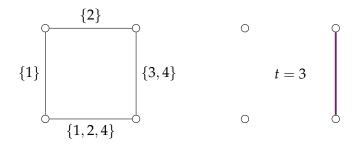
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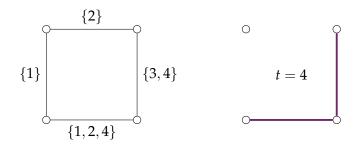
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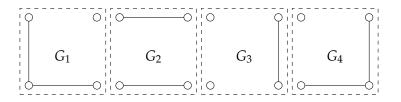
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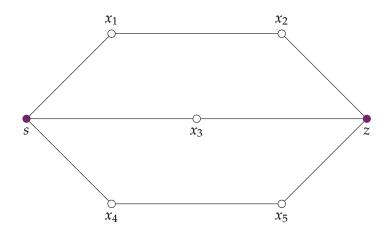
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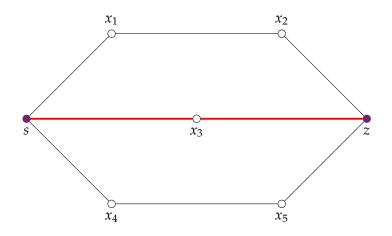
Alternatively we can view it as a sequence of static graphs, called *snapshots*:



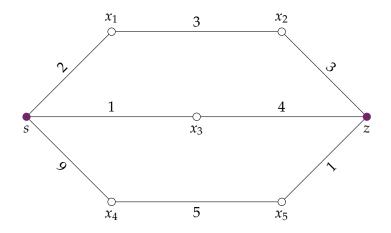
# From Paths to Temporal Paths



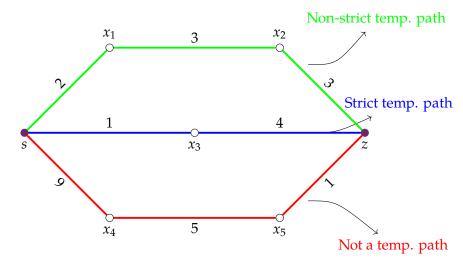
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## FROM PATHS TO TEMPORAL PATHS



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# Definitions and Notations

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A temporal graph G is (temporally) connected iff for all  $u, v \in V(G)$  there exists a temporal (u, v)-path<sup>1</sup>.

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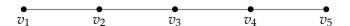
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- Maximum label  $\alpha(\lambda)$  is called the age of  $\mathcal{G}$ .
- The total cost of  $(G, \lambda)$  is  $|\lambda| = \sum_{e \in E} |\lambda_e|$ .

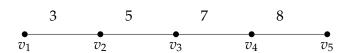
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Min. Labeling (ML)

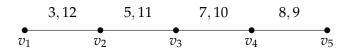
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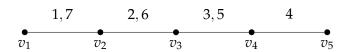
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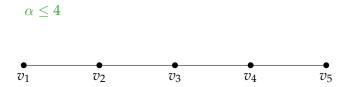


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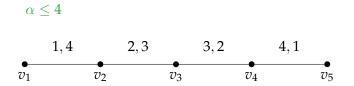


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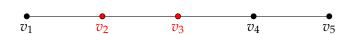


Min. Steiner Labeling (MSL)

- **Input:** A static graph G = (V, E), a subset  $R \subseteq V$  and an integer  $k \in \mathbb{N}$ .
- **Question:** Does there exist a temporally *R*-connected temporal graph (*G*,  $\lambda$ ), where  $|\lambda| \le k$ ?

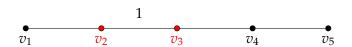
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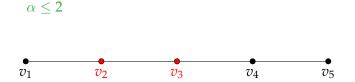


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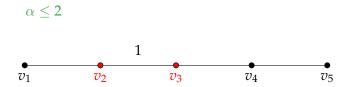
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Temporal Graphs	Opt. Labelings	MAL 15 NP-c.	FPT of MSL
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Age	Non-restricted	Restricted
Temp. connected		
R-connected		

Temporal Graphs 000	Opt. Labelings 00•	MAL 15 NP-c. 00000	FPT of MSL 00

Age	Non-restricted	Restricted
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## Results

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#### MAL IS NP-COMPLETE

#### Reduction from Monotone Max XOR(3):

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### MAL is NP-complete

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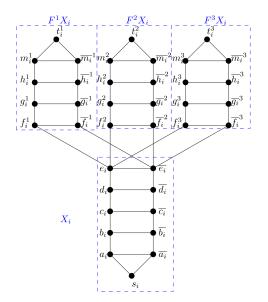
- conjunction of XOR clauses,
- non-negated variables,
- variables appear exactly 3 times.

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Opt. Labelings

MAL is NP-c. 0●000

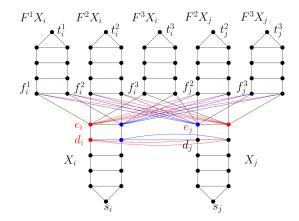
### VARIABLE GADGETS



Temporal Graphs	Opt. Labelings	MAL is NP-c.	FPT of MSL
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#### Connecting variable gadgets I

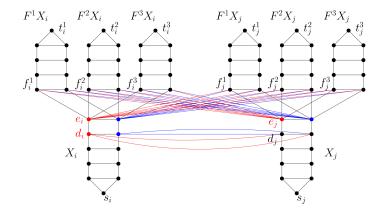
Clause  $(x_i \oplus x_j)$  with 3<sup>rd</sup> and 1<sup>st</sup> appearance of  $x_i, x_j$ , respectively.



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#### Connecting variable gadgets II

#### No clause with $x_i$ and $x_j$ .

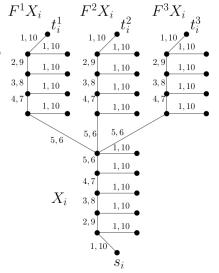


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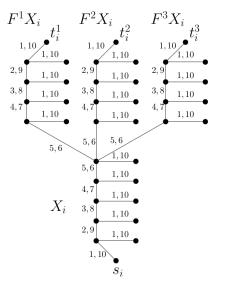
#### ► α = d = 10,

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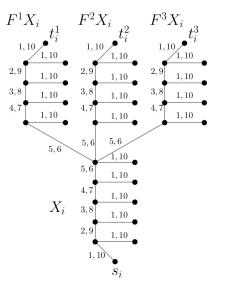


- $\blacktriangleright \ \alpha = d = 10,$
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- a clause is satisfied iff only one side of the shared fork is labeled.



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$$OPT(G_{\phi}, d_{\phi}) \leq \operatorname{poly}(n, k)$$
$$\Leftrightarrow$$
$$OPT(\phi) \geq k.$$



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Crucial property:

Temporal Graphs 000	Opt. Labelings 000	MAL 15 NP-c. 00000	FPT of MSL ●0

#### Crucial property:

 There exists a minimum labeling that is a tree or a tree with a C<sub>4</sub>.

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Idea of the algorithm:

- ► Use an FPT algorithm for Steiner Tree.
- ▶ Iterate over all *C*<sub>4</sub>s in *G*, check if one can be labeled in an optimum solution.

# Thank you!

Questions?

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MAL is NP-hard for α = d and poly-time solvable for α = 2d, what happens for d < α < 2d?</p>

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- ► Is there an XP algorithm form MASL?
- What if we require two temporally disjoint paths among vertices?