# Path Covers of Temporal Graphs: When is Dilworth dynamic?

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Figure: (from left) Dr. Antoine Dailly, Dr. Florent Foucaud, Prof. Ralf Klasing

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- LaBRI, University of Bordeaux.

hanks to Antoine for the slides !







Theorem [Dilworth, 1950]

The minimum size of a chain partition of a finite poset is equal to the maximum size of an antichain of this poset.

 $\{1,2,3\} \\ \{1,2,4\} \\ \{1,2\} \\ \{1,2\} \\ \{1\} \\ \{2\} \\ \{4\} \}$ 



Theorem [Dilworth, 1950]

The minimum size of a path partition of a transitive DAG is equal to the maximum size of an antichain of this DAG.

Restated for graphs...

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Theorem [Dilworth, 1950]

The minimum size of a path cover of a DAG is equal to the maximum size of an antichain of this DAG.

Restated for graphs... ... and covers.

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Restated for graphs... ... and covers.

Algorithms:

#### • Algorithmic proof (polynomial time) [Fulkerson, 1956]



# Introduction: temporal (di)graphs



Many results and applications in distributed algorithms, dynamic networks (transportation, social, biological...), interest in the graph algorithms community.

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- Two vertices are temporally connected if there is a temporal path between them.
- A temporal antichain is a set of vertices who are pairwise not temporally connected.



## A temporal Dilworth's theorem?



Temporal Dilworth property?

In a temporal DAG, the minimum size of a temporal path partition/cover is equal to the maximum size of a temporal antichain.

Not all temporal DAGs have the Temporal Dilworth Property.



## A temporal Dilworth's theorem?



(Temporal Dilworth property?)

In a temporal DAG, the minimum size of a temporal path partition/cover is equal to the maximum size of a temporal antichain.

Two problems:

Temporal Path Cover (TPC) Temporal Path Partition/Temporally Disjoint Path Cover (TD-PC)

Two questions:

Which temporal DAGs have the Dilworth property?

 $\Rightarrow$  Combinatorial aspect

What is the complexity of those problems?

 $\Rightarrow$  Algorithmic aspect

# Our results

~

|                | Temporal Path Cover  | < Temporally - Disj. Pat   |
|----------------|--|--|
| Temporal class | TPC  | TD-PC  |
| Oriented paths | $\mathscr{O}(\ell n)$  | $\mathscr{O}(\ell n)$  |
| Rooted trees   | $\mathscr{O}(\ell n^2)$  | $\mathcal{O}(\ell n^2)$  |
| Oriented trees | $\mathscr{O}(\ell n^2 + n^3)$  | NP-hard  |
| DAGs*          | NP-hard  | NP-hard  |
| Digraphs       | $ \begin{array}{c} XP \ (tw \ and \ t_{max}) \\ n^{\mathscr{O}(tw^2 \ t_{max} \log(tw \ t_{max}))} \end{array} $ | $\frac{\text{FPT (tw and } t_{\text{max}})}{2^{\mathscr{O}(\text{tw}^2 t_{\text{max}} \log(\text{tw} t_{\text{max}}))} n}$ |

\* planar, subcubic, bipartite, girth 10, ℓ = 1, t<sub>max</sub> = 2

n = number of vertices  $\ell$  = number of (unsorted) time labels per arc

 $t_{max} = total number of time-steps$ 

Classes with polynomial-time algorithm also have the Dilworth property.

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Lemma

```
Clique in G \Leftrightarrow Temporal Path in \mathscr{T}.
```

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## Claim

No even holes of length greater than four either (using Helly property and vertex-intersection of temporal paths).



There are no antiholes in the connectivity graph.






















edge does not exist in  $\mathcal{T}$ .



Temporal path cover







The connectivity graph is (hole, antihole)-free

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Theorem [Hayward, Spinrad & Sritharan, 2000]

There is a  $\mathcal{O}(mn)$  algorithm for Clique Cover in weakly chordal graphs with *n* vertices and *m* edges.

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 $\Rightarrow$  Connectivity graph in  $\mathcal{O}(n^2 \ell)$ , then [HSS00] in  $\mathcal{O}(n^2 \times n)$ .

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#### Remark

The connectivity graph is not chordal (it may contain  $C_4$ ).



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Figure: The gadget  $H(s_i)$  for each triplet  $s_i$ .

TEMPORAL PATH COVER is NP-hard on Temporal DAGs.

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Figure: Vertex partition of the gadget  $H(s_i)$  into length-2 paths.

Total number of timesteps = 2 (bounded); Treewidth is unbounded; There are Temporal DAGs (transitive tournaments) without the Dilworth Property.

TEMPORAL DISJOINT PATH COVER is NP-hard on temporal oriented trees.

- Reduction from UNARY BIN PACKING (inspired by [Kunz, Molter, Zehavi, 23]);
- Treewidth = 1; Total number of timesteps = unbounded;
- Does not have TD-Dilworth property.



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Dynamic programing on a nice tree decomposition

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Dynamic programing on a nice tree decomposition

#### Observation

Any arc of  $\mathscr{D}$  appears in at most  $t_{\max}$  paths of a TD-PC  $\Rightarrow$  At most  $p = \binom{tw}{2} \cdot t_{\max}$  temporally disjoint paths contain at least one arc from a given bag

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For simplicity, duplicate the arcs such that each has only one time label (so a TD-PC uses arc-disjoint paths)

 $\Rightarrow$  At most

• A partition  $Q_0, Q_1, \ldots, Q_t$  of the arcs inside  $X_v$  ( $Q_i$  for  $i \neq 0$  is in a temporal path  $P_i$  of a TD-PC,  $Q_0$  is the unused arcs)

 $\Rightarrow$  At most  $p^p$ 

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# Consistency of a type

- The ordered vertices V<sub>i</sub>, the arcs of Q<sub>i</sub>, and the information about the arcs going outside of X<sub>v</sub>, induce temporal paths
- The arcs going outside of  $X_{\nu}$  exist in the digraph and their labels are compatible with the order
- Every vertex of  $X_v$  is in a  $V_i$

Now, we compute from the bottom-up, maintaining consistency.

### Dynamic programing using consistent types of partial solutions

- Leaf node: No partial solution since empty
- **Introduce node:** Check compatibility with the child (either *a* is in a path in the type, or *a* is added as a single-vertex path)
- Forget node: Check compatibility with child (the types are the ones obtained by removing the vertex *a*), discard those where *a* has an arc going above
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Running time  $2^{\mathcal{O}(p\log p)}n$ , so FPT w.r.t.  $p = f(tw, t_{max})$ 

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Same principle, but the paths can intersect
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# And for TPC?

Same principle, but the paths can intersect  $\Rightarrow$  More information in type: how many times in the solution does  $Q_i$  appear  $\Rightarrow$  Running time  $k^{\mathscr{O}(p\log p)}n$  where  $k \in \mathscr{O}(n)$  is the solution size  $\Rightarrow$  XP w.r.t. p

# Conclusion and future work

| Temporal class | TPC  | TD-PC  |
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#### Perspectives

- Better FPT, FPT for TPC?
- Approximation?
- Classes of oriented trees where TD-PC is polynomial?
- Other temporal problems that can be reduced to a static problem?

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