

Temporal Vertex Cover with a Sliding Time Window

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These results have been presented in **ICALP 2018**

Joint work with:

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Research Seminar
Computer Engineering and Informatics Department (CEID)
University of Patras, Greece
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Static and Temporal Graphs

Modern networks are **highly dynamic**:

- **Social networks**: friendships are added/removed, individuals **leave**, new ones **enter**
- **Transportation networks**: transportation units change with time their **position** in the network
- **Physical systems**: e.g. systems of **interacting particles**

The common characteristic in all these applications:

- the **graph topology** is subject to **discrete changes** over time
- ⇒ the notion of **vertex adjacency** must be appropriately re-defined (by introducing the **time dimension** in the graph definition)

Various graph concepts (e.g. reachability, connectivity):

- crucially **depend** on the **exact temporal ordering** of the **edges**

Temporal graphs

Formally:

Definition (Temporal Graph)

A **temporal graph** is a pair (G, λ) where:

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

Temporal graphs

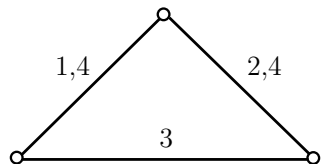
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temporal instances:



Temporal graphs

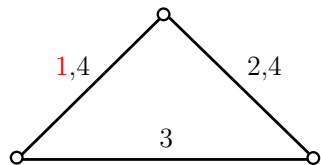
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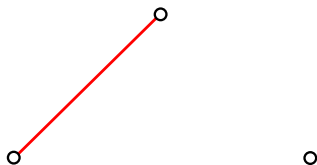
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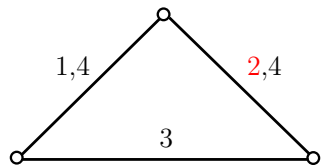
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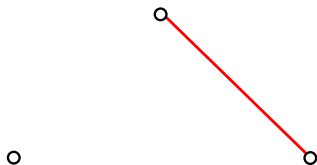
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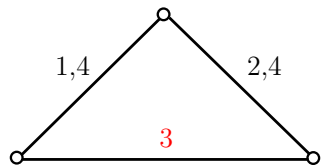
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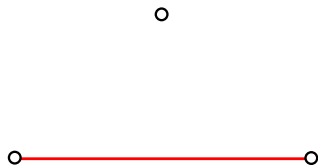
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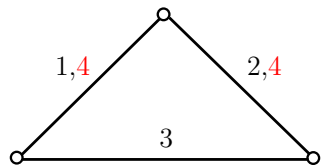
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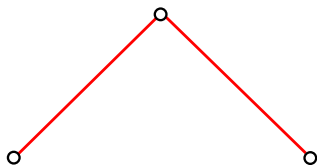
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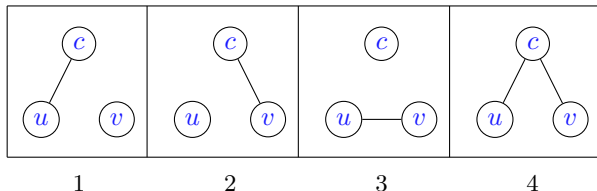
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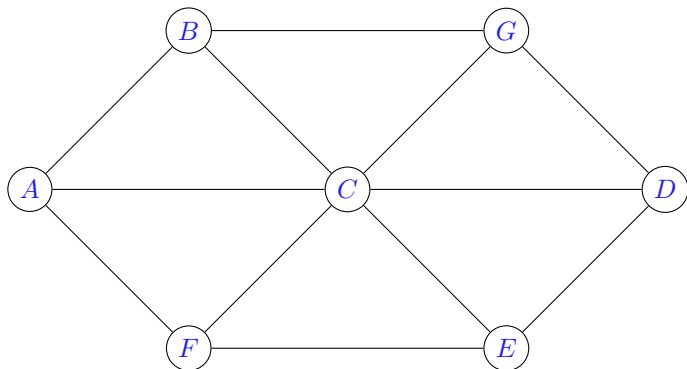
- $G = (V, E)$ is an **underlying (di)graph** and
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Alternatively, we can view it as a **sequence** of static graphs, the **snapshots**:



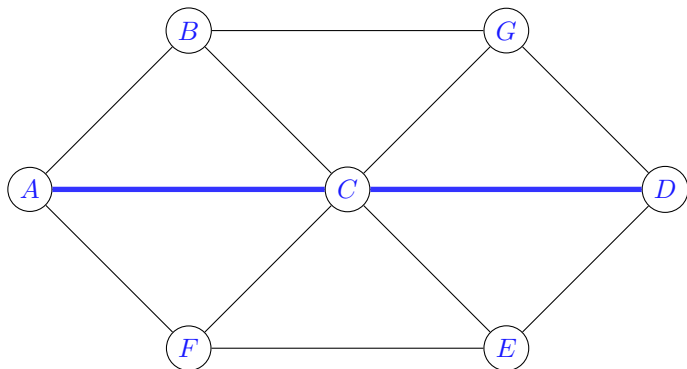
Example: static vs temporal graphs

From paths to temporal paths:



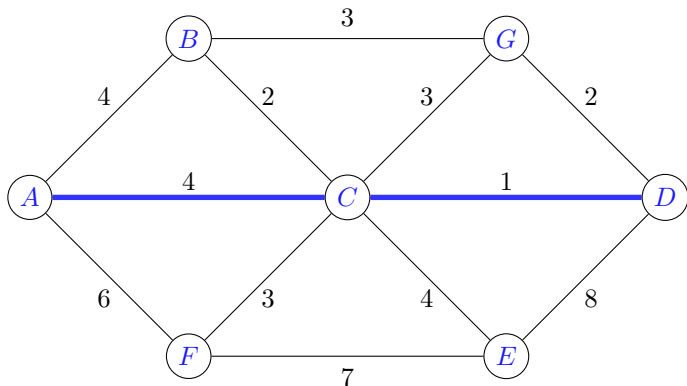
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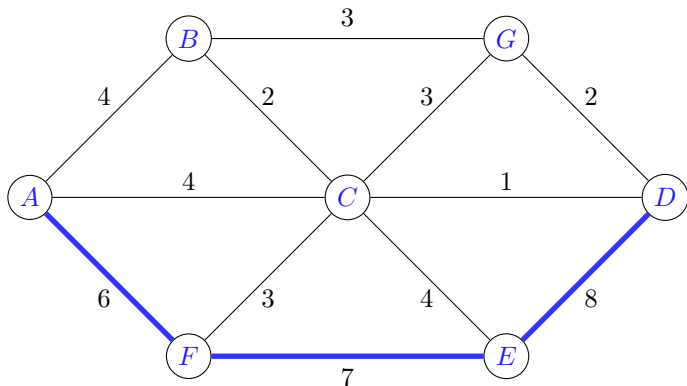
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Example: static vs temporal graphs

From paths to temporal paths:



- Basic definitions
- Temporal vertex cover
- Temporal vertex cover with a sliding time window
- Open problems

Basic definitions I

To specify a **temporal graph class**, we can:

- either restrict the **underlying graph** G ,
- or restrict the **labeling** $\lambda : E \rightarrow 2^{\mathbb{N}}$ (or both)

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Definition (Temporal Graph Classes)

For a class \mathcal{X} of static graphs we say that a temporal graph (G, λ) is

- **\mathcal{X} temporal**, if $G \in \mathcal{X}$;
- **always \mathcal{X} temporal**, if $G_i \in \mathcal{X}$ for every $i \in [T] = \{1, 2, \dots, T\}$.

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Definition (Temporal Vertex Subset)

A pair $(u, t) \in V \times [T]$ is called the **appearance of vertex u at time t** .

A **temporal vertex subset** of (G, λ) is a set $\mathcal{S} \subseteq V \times [T]$ of vertex appearances in (G, λ) .

Definition (Edge is Temporally Covered)

A vertex appearance (w, t) **temporally covers** an edge e if:

- (i) w covers e , i.e. $w \in e$, and
- (ii) $t \in \lambda(e)$, i.e. the edge e is **active** during the time slot t .

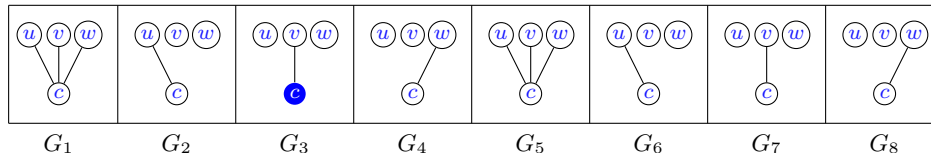
Basic definitions II

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Example:



- $(c, 3)$ **temporally covers** edge cv , but
- $(c, 3)$ **temporally covers** neither cu , nor cw .

Definition (Temporal Vertex Cover)

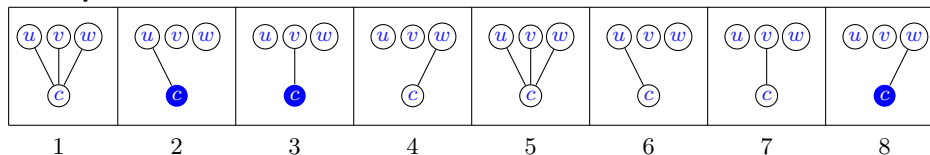
A **temporal vertex cover** of (G, λ) is a temporal vertex subset \mathcal{S} of (G, λ) such that every edge $e \in E(G)$ is **temporally covered** by at least one vertex appearance in \mathcal{S} .

Basic definitions: Temporal Vertex Cover

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Example



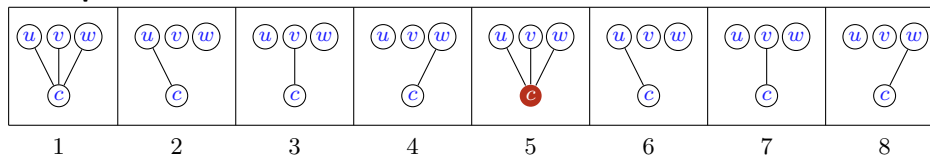
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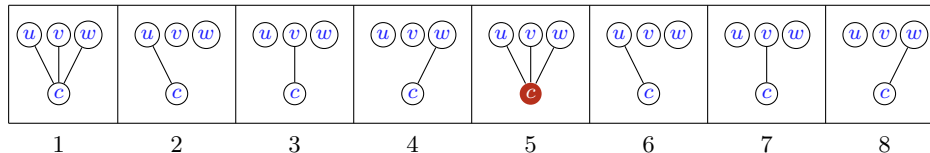
- $\{(c, 2), (c, 3), (c, 8)\}$ is a Temporal Vertex Cover
- $\{(c, 5)\}$ is a **minimum** Temporal Vertex Cover

Basic definitions: Temporal Vertex Cover

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Example



TEMPORAL VERTEX COVER (TVC)

Input: A temporal graph (G, λ) .

Output: A **temporal vertex cover** \mathcal{S} of (G, λ) with the minimum $|\mathcal{S}|$.

Definition (Time Windows)

- 1 For every time slot $t \in [1, T - \Delta + 1]$:
the **time window** $W_t = [t, t + \Delta - 1]$ is the sequence of the Δ consecutive time slots $t, t + 1, \dots, t + \Delta - 1$.

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- 3 $\mathcal{S}[W_t] = \{(w, t) \in \mathcal{S} : t \in W_t\}$ is the restriction of the temporal vertex subset \mathcal{S} to the window W_t .

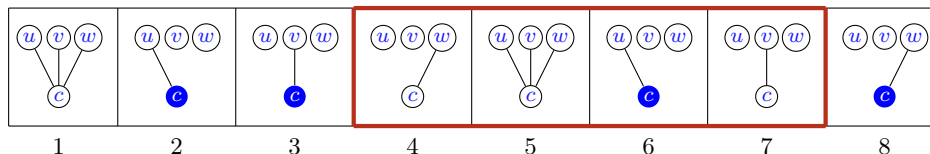
Definition (Sliding Δ -Window Temporal Vertex Cover)

A **sliding Δ -window temporal vertex cover** of (G, λ) is a temporal vertex subset \mathcal{S} of (G, λ) such that:

- for every time window W_t and for every edge $e \in E[W_t]$,
- e is **temporally covered** by at least one vertex appearance $(w, t) \in \mathcal{S}[W_t]$.

Basic definitions: Sliding Window Temporal Vertex Cover

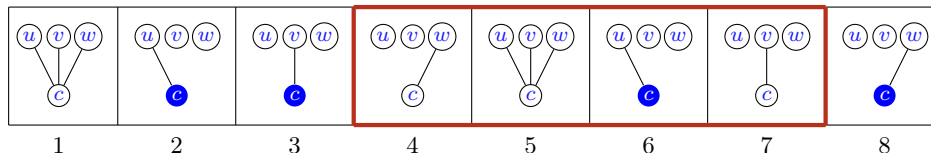
Example ($\Delta = 4$)



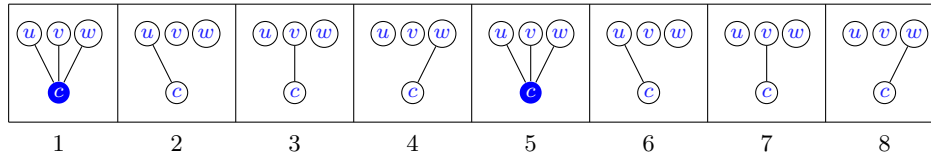
- $\{(c, 2), (c, 3), (c, 6), (c, 8)\}$ is **not** a sliding Δ -window temporal vertex cover, as edges $cv, cw \in E[W_4]$ are **not** temporally covered in **window** W_4 .

Basic definitions: Sliding Window Temporal Vertex Cover

Example ($\Delta = 4$)



- $\{(c, 2), (c, 3), (c, 6), (c, 8)\}$ is **not** a sliding Δ -window temporal vertex cover, as edges $cv, cw \in E[W_4]$ are **not** temporally covered in window W_4 .



- $\{(c, 1), (c, 5)\}$ is a **sliding Δ -window temporal vertex cover**.

SLIDING WINDOW TEMPORAL VERTEX COVER (SW-TVC)

Input: A temporal graph (G, λ) with lifetime T , and an integer $\Delta \leq T$.

Output: A sliding Δ -window temporal vertex cover \mathcal{S} of (G, λ) with the minimum $|\mathcal{S}|$.

Motivation:

- **(static) Vertex Cover:**
network surveillance (e.g. CCTV cameras etc.)
- **Temporal Vertex Cover:**
network surveillance in a dynamic network
- **Sliding Window Temporal Vertex Cover:**
dynamic surveillance in every possible Δ -time window
(e.g. for crimes that need time Δ to be performed)

- Basic definitions
- Temporal vertex cover
- Temporal vertex cover with a sliding time window
- Open problems

Temporal Vertex Cover: the star temporal case

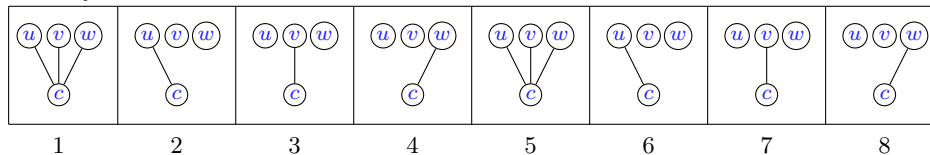
Lemma

TVC on *star temporal graphs* is equivalent to **SET COVER**.

- **leafs** of the underlying star \leftrightarrow **ground set** of the **SET COVER** instance
- each **snapshot** graph \leftrightarrow a **set** in the **SET COVER** instance

Goal: Choose **sets** (**snapshots**) to cover all **elements** (**leafs' edges**)

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Temporal Vertex Cover: the star temporal case

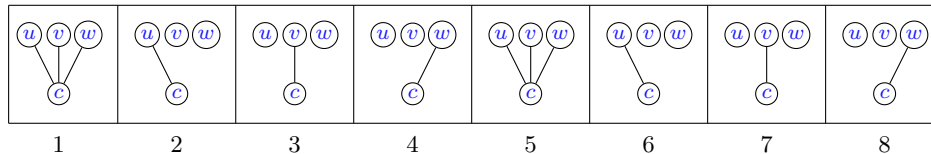
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Example:



① **Universe:** $\{u, v, w\}$

② **Sets:** $S_1 = \{u, v, w\}$, $S_2 = \{u\}$, $S_3 = \{v\}$, $S_4 = \{w\}$, ...

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Consequences:

- 1 **TVC** is NP-complete even on *star temporal graphs*.
- 2 For any $\varepsilon < 1$, **TVC** on *star temporal graphs* cannot be optimally solved in $O(2^{\varepsilon T})$ time, unless SETH fails (due to Hitting Set).

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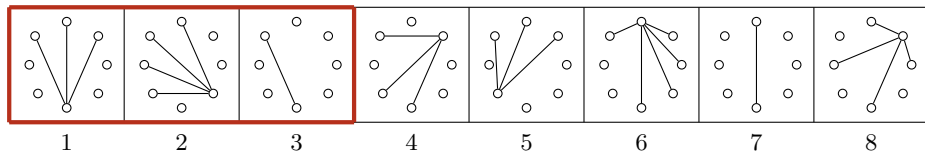
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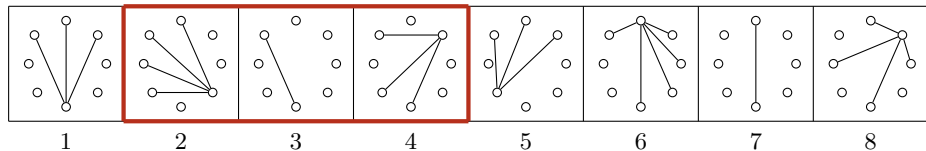
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- 4 **TVC** on *star temporal graphs* can be $\ln n$ -approximated in polynomial time.
- 5 For *general* graphs: $2 \ln n$ -approximation algorithm by a similar reduction from **TVC** to **SET COVER**.

- Basic definitions
- Alternative models
- Temporal vertex cover
- Temporal vertex cover with a sliding time window
- Open problems

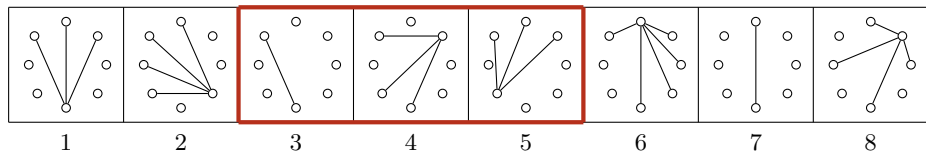
SW-TVC: **always star** temporal graphs



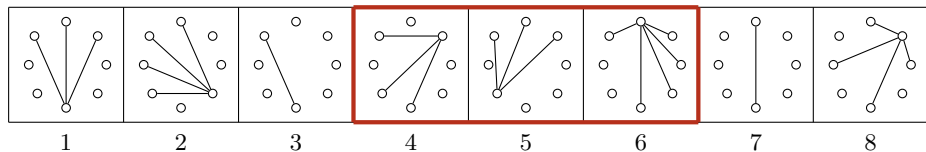
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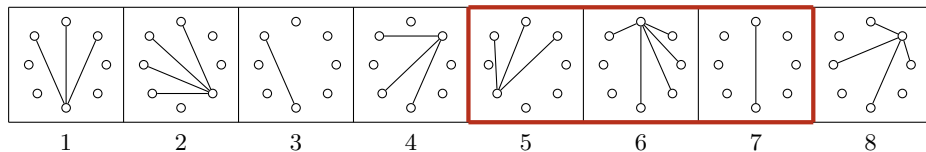
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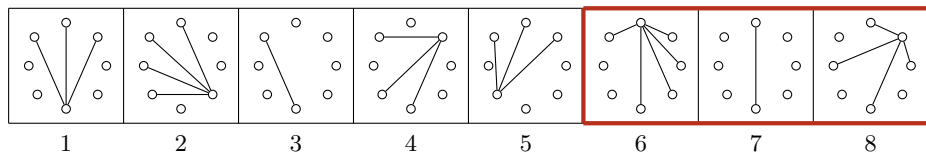
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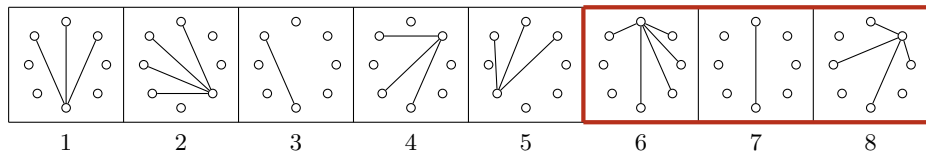
SW-TVC: always star temporal graphs



- On **always star** temporal graphs, a minimum size **SW-TVC** contains **at most one vertex** (the **star center**) in each snapshot

⇒ we assign a Boolean variable $x_i \in \{0, 1\}$ for the snapshot at time i

SW-TVC: always star temporal graphs



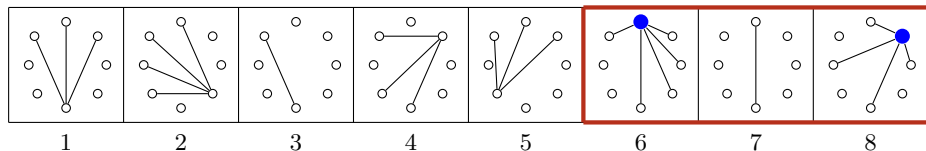
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- For variables $x_1, x_2, \dots, x_\Delta$ we define $f(t; x_1, x_2, \dots, x_\Delta)$ to be the smallest cardinality of a sliding **Δ -window temporal vertex cover** \mathcal{S} of $(G, \lambda)|_{[1, t+\Delta-1]}$, such that the solution at times $t, t+1, \dots, t+\Delta-1$ is defined by the **variables** $x_1, x_2, \dots, x_\Delta$.

SW-TVC: always star temporal graphs

$$f(6; 1, 0, 1)$$

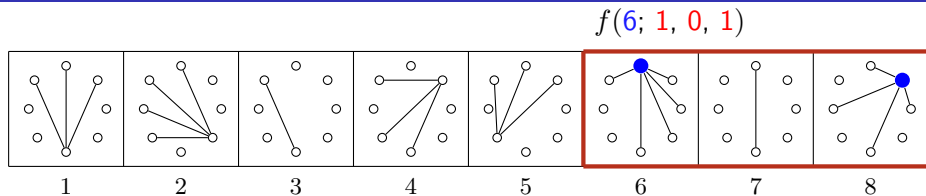


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Lemma (dynamic programming)

$$f(t; x_1, x_2, \dots, x_\Delta) = x_\Delta + \min_{y \in \{0,1\}} \{f(t-1; y, x_1, x_2, \dots, x_{\Delta-1})\}$$

Theorem (always star temporal graphs)

SW-TVC on *always star temporal graphs* can be solved in $O(T\Delta(n + m) \cdot 2^\Delta)$ time.

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Theorem (the general case)

SW-TVC on *general temporal graphs* can be solved in $O(T\Delta(n+m) \cdot 2^{n(\Delta+1)})$ time.

Main idea:

- for each of the Δ snapshots in the (currently) last Δ -window, we enumerate all 2^n vertex subsets,
- instead of just enumerating over the truth values of Δ Boolean variables (“always star” case)

Theorem

For *any* two (arbitrarily growing) functions $f : \mathbb{N} \rightarrow \mathbb{N}$ and $g : \mathbb{N} \rightarrow \mathbb{N}$, there exists a constant $\varepsilon \in (0, 1)$ such that SW-TVC cannot be solved in $f(T) \cdot 2^{\varepsilon n \cdot g(\Delta)}$ time assuming ETH.

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Proof (idea):

- reduction from VERTEX COVER
- $T = \Delta = 2$
- $G_1 = G$; G_2 is an independent set
- given f and g , choose appropriate ε

SW-TVC: Optimality under ETH

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- given f and g , choose appropriate ε

Corollary

Our $O(T\Delta(n+m) \cdot 2^{n(\Delta+1)})$ -time algorithm is asymptotically almost optimal (assuming ETH).

SW-TVC: always bounded vertex cover number temporal graphs

Let \mathcal{C}_k be the class of graphs with **vertex cover number** at most k .

Theorem

SW-TVC on *always* \mathcal{C}_k temporal graphs can be solved in $O(T\Delta(n+m) \cdot n^{k(\Delta+1)})$ time.

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Main idea:

- in the optimal solution, the choice at step i is a subset of a minimum vertex cover at this snapshot
- ⇒ for each of the Δ last snapshots, enumerate all n^k vertex subsets (candidates for vertex cover at snapshot i)

If the parameter Δ (the size of a sliding window) is **fixed**, we refer to **SW-TVC** as **Δ -TVC** (i.e. Δ is a part of the problem name).

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Observation

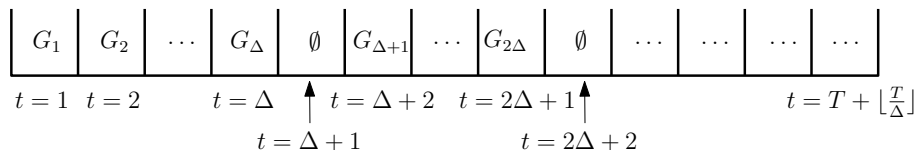
$(\Delta + 1)$ -TVC *is at least as hard as* **Δ -TVC**.

Δ -TVC

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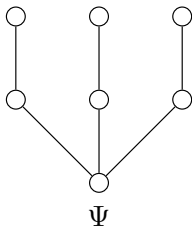
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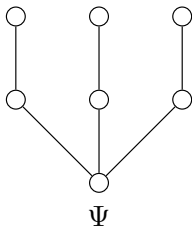
2-TVC is hard to approximate

Let \mathcal{X} be the class of graphs whose connected components are induced subgraphs of graph Ψ .



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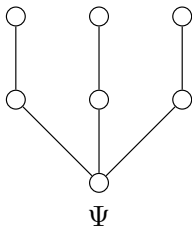
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There is *no PTAS* for **2-TVC** on *always* \mathcal{X} temporal graphs.

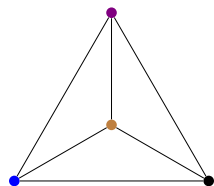
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Theorem

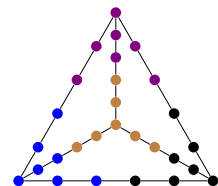
There is **no PTAS** for **2-TVC** on **always \mathcal{X}** temporal graphs.

Proof (sketch):

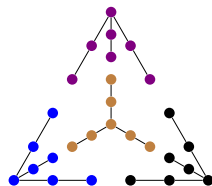
- 1 Let \mathcal{Y} be the class of graphs which can be obtained from **cubic graphs** by **subdividing every edge exactly 4 times**.
- 2 There is **no PTAS** for **VERTEX COVER** on \mathcal{Y} .
- 3 Reduce **VERTEX COVER** on \mathcal{Y} to **2-TVC** on **always \mathcal{X}** temporal graphs such that **optimal solutions** of both problems **have same size**.



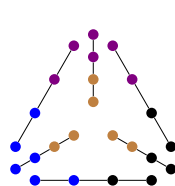
K_4



The 4-subdivision of K_4



Snapshot G_1



Snapshot G_2

SW-TVC: approximation algorithms I

Reduction from SW-TVC to SET COVER.

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Consequences:

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(every set $C_{v,s}$ has at most $n\Delta$ elements
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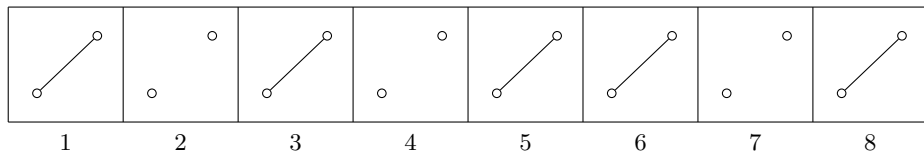
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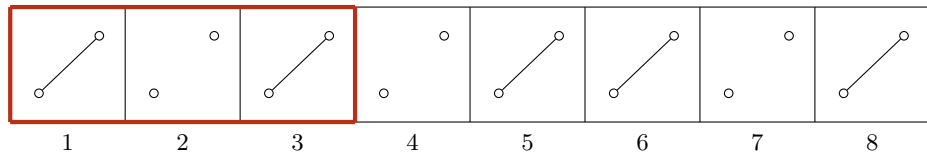
SW-TVC: approximation algorithms II

Single-edge temporal graph: **exact algorithm**

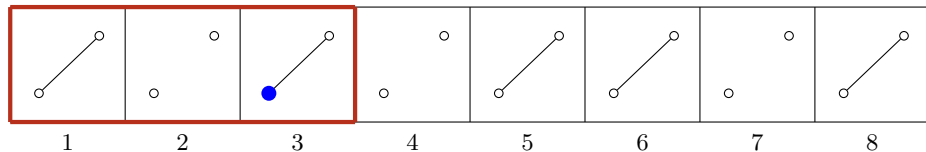


SW-TVC: approximation algorithms II

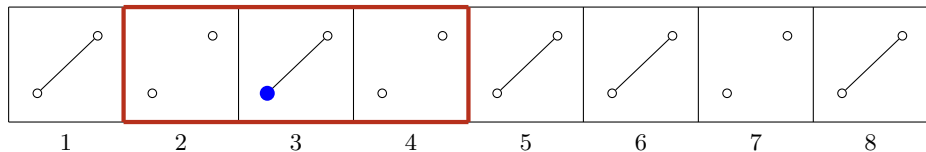
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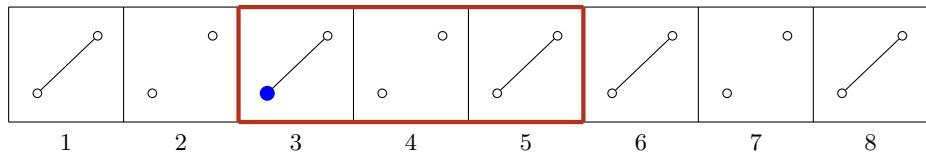
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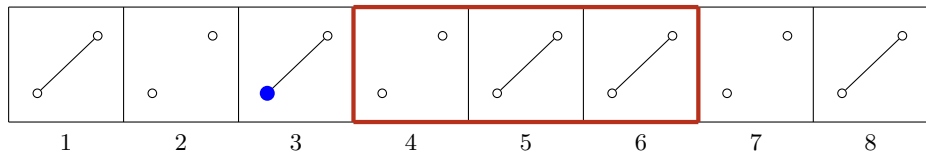


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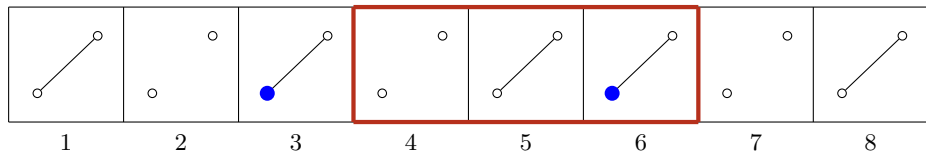


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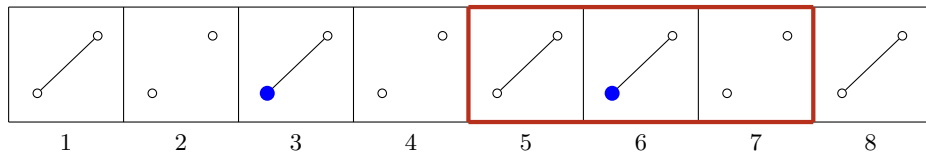
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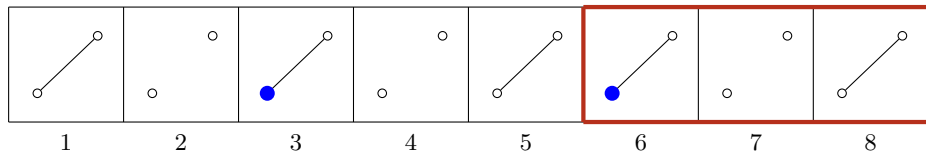
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Algorithm **SW-TVC** on **single-edge** temporal graphs

Input: A temporal graph (G, λ) of lifetime T with $V(G) = \{u, v\}$; and $\Delta \leq T$.

Output: A **minimum-cardinality sliding Δ -window temporal vertex cover** \mathcal{S} of (G, λ) .

```
1:  $\mathcal{S} \leftarrow \emptyset$ 
2:  $t = 1$ 
3: while  $t \leq T - \Delta + 1$  do
4:   if  $\exists r \in [t, t + \Delta - 1]$  such that  $uv \in E_r$  then
5:     choose maximum such  $r$  and add  $(u, r)$  to  $\mathcal{S}$ 
6:      $t \leftarrow r + 1$ 
7:   else
8:      $t \leftarrow t + 1$ 
return  $\mathcal{S}$ 
```

- greedy algorithm
- linear time

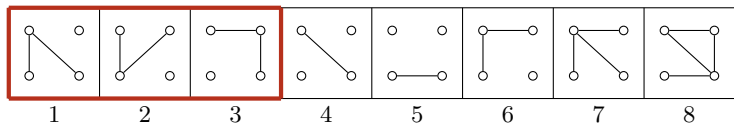
Always degree at most d temporal graphs: d -approx. algorithm

Main idea:

- solve independently each single-edge subgraph of G
- take the union of the solutions

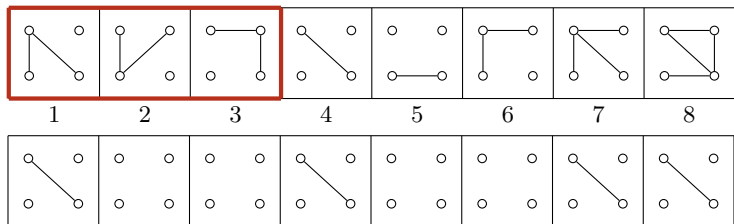
SW-TVC: approximation algorithms II

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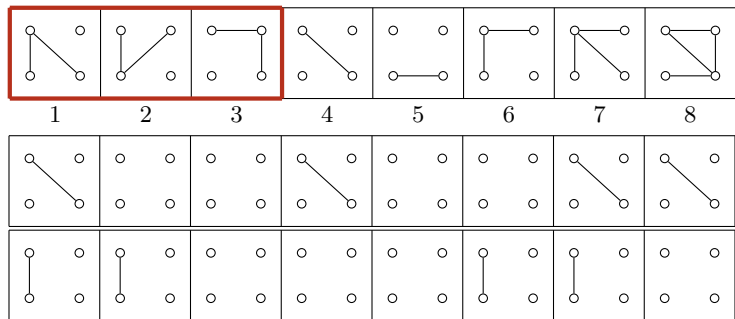
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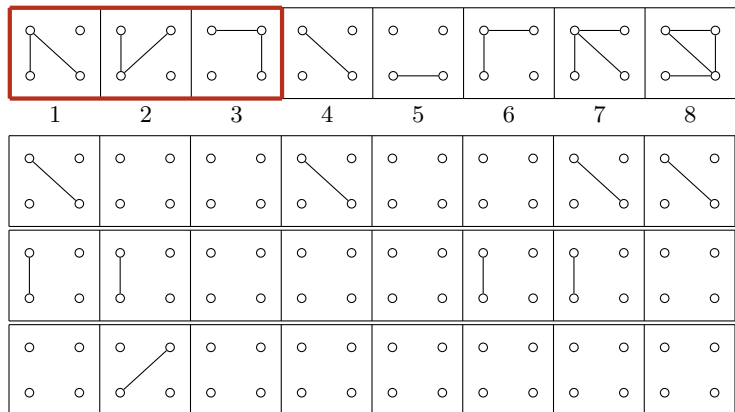
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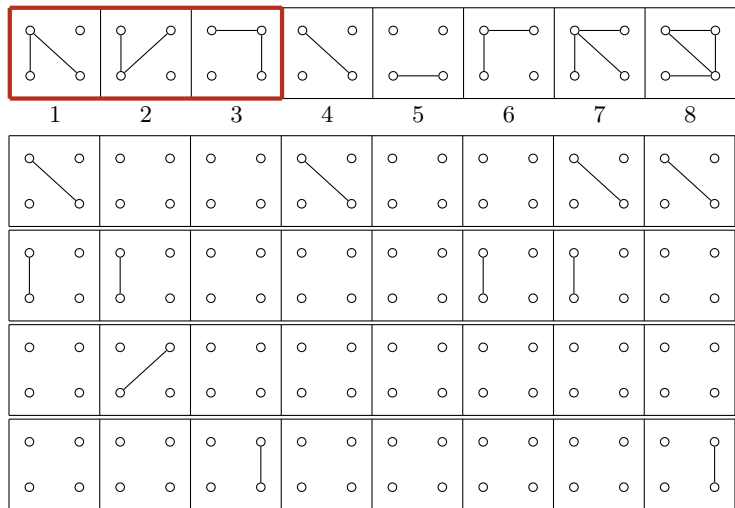
SW-TVC: approximation algorithms II

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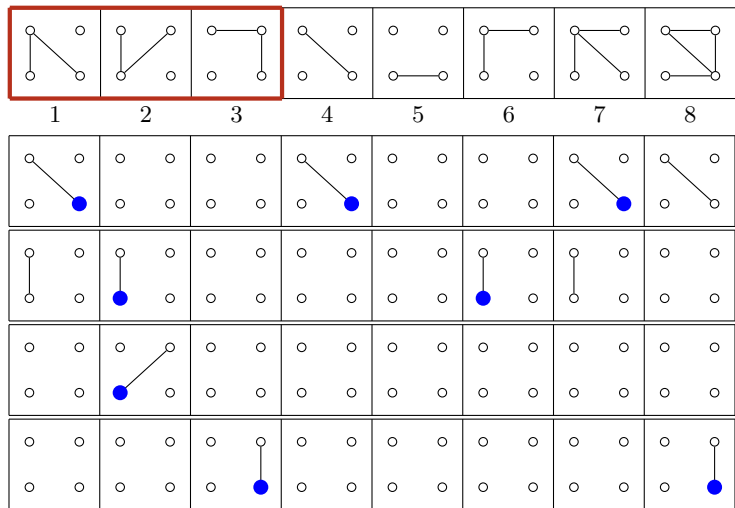
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...

SW-TVC: approximation algorithms II

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Algorithm d -approximation of SW-TVC on always degree at most d temporal graphs

Input: An always degree at most d temporal graph (G, λ) of lifetime T , and $\Delta \leq T$.

Output: A sliding Δ -window temporal vertex cover \mathcal{S} of (G, λ) .

- 1: for every edge $uv \in E(G)$ do
 - 2: Compute an optimal solution \mathcal{S}_{uv} of the problem for $(G[\{u, v\}], \lambda)$
 - 3: $\mathcal{S} \leftarrow \mathcal{S} \cup \mathcal{S}_{uv}$
- return \mathcal{S}
-

Lemma

The above algorithm is a $O(mT)$ -time d -approximation algorithm for SW-TVC on always degree at most d temporal graphs.

SW-TVC: approximation algorithms II

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Corollary

SW-TVC can be *optimally* solved in $O(mT)$ time on the class of always degree at most 1 (matching) temporal graphs.

- Basic definitions
- Alternative models
- Temporal vertex cover
- Temporal vertex cover with a sliding time window
- Open problems

Problem 1

Determine the complexity status of Δ -TVC on degree at most 2 temporal graphs.

- ① Δ -TVC on always degree at most 1 can be solved in linear time.

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Can Δ -TVC on *always degree at most d* temporal graphs be approximated within a factor better than d ?

Thank you!