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NeST Workshop, 12 June 2019 Department of Computer Science Liverpool University

Motivation

### Main question:

■ What is the natural problem that extends graph coloring to the case where the graph changes over time?

Motivation

# A motivating scenario:

 Mobile agents broadcast information



Motivation

# A motivating scenario:

- Mobile agents broadcast information
- When agents meet they can exchange information



#### Motivation

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- Information can only be exchanged if agents broadcast on different channels



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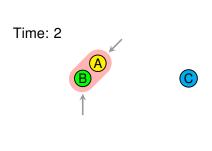
"Dynamic Channel Assignment Problem"

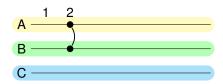
Time: 1 B

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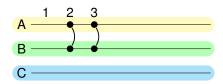
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Time: 3







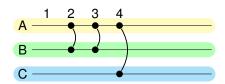
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Time: 4



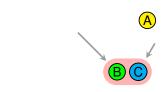


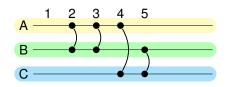
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Time: 5

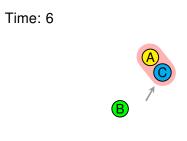


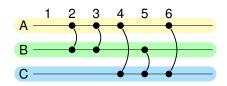


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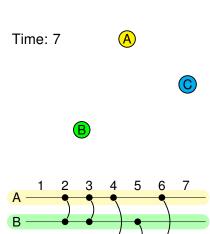




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"Dynamic Channel Assignment Problem"

# Modeling:

Vertices in a temporal graph

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- Vertices in a temporal graph
- Time-edges

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- Vertices in a temporal graph
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- Vertices need to be differently colored in order to exchange information

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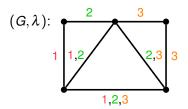
- Vertices in a temporal graph
- Time-edges
- Vertices need to be differently colored in order to exchange information
- Each time-edge should be "properly colored" at least once in each Δ-window in which it exists

Temporal Graphs

# Temporal Graph

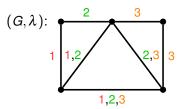
Temporal Graphs

## Temporal Graph



Temporal Graphs

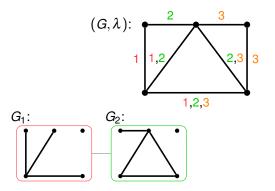
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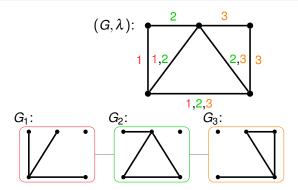
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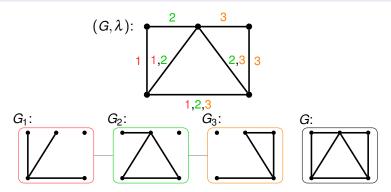
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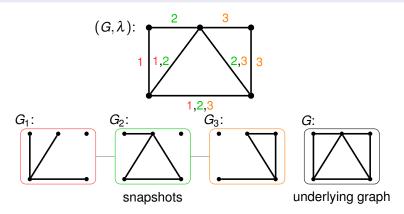
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Temporal Graphs

## Temporal Graph



Sliding Window Temporal Graph Coloring

# Proper Sliding $\Delta$ -Window Temporal Coloring

A proper sliding  $\Delta$ -window temporal coloring of  $(G, \lambda)$  is a coloring vector  $\phi = (\phi_1, \phi_2, \dots, \phi_T)$  such that:

Sliding Window Temporal Graph Coloring

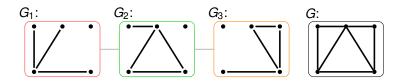
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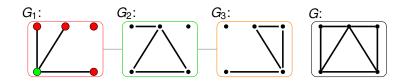
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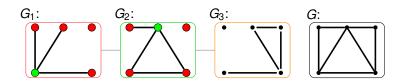
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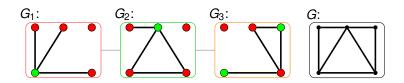
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Main Results

# Sliding Window Temporal Coloring (SWTC)

**Input:** A temporal graph  $(G,\lambda)$ , and two integers  $k \in \mathbb{N}$  and  $\Delta \leq T$ . **Question:** Does there exist a proper sliding  $\Delta$ -window temporal

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SWTC is NP-hard, even if

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- Extension for small number of agents (FPT algorithm for n).
- FPT-approx. algorithm for parameter "vertex cover number of G" (additive error of one).

Main Exponential Time Algorithm I

### Observation

Let  $\phi$  and  $\psi$  be two proper sliding  $\Delta$ -window temporal colorings for two intervals of the snapshots of  $(G, \lambda)$ .

Main Exponential Time Algorithm I

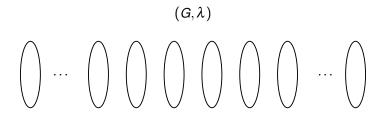
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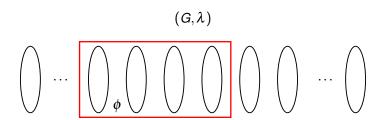
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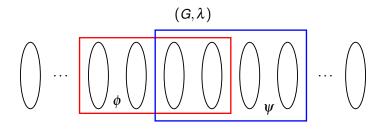
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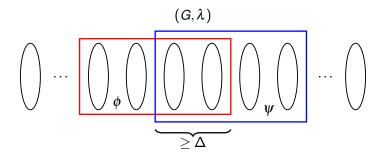
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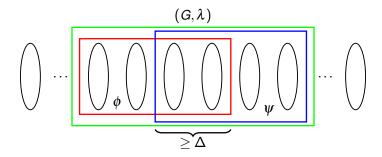
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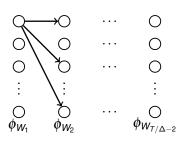


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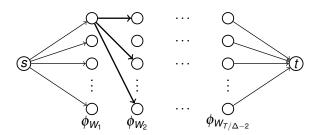
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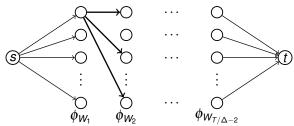
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- 4 If there is a path from s to t, answer YES, otherwise NO.



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SWTC can be solved in  $O(k^{4\Delta \cdot n} \cdot T)$  time.

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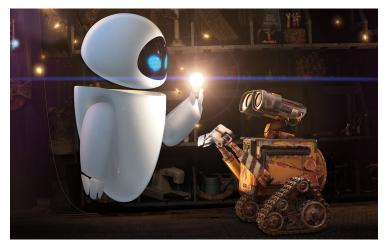
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#### **ETH Lower Bound**

SWTC does not admit a  $2^{o(n) \cdot f(T+k)}$ -time algorithm for any computable function f unless ETH fails.

Fixed-Parameter Tractability I



How to exploit few vertices?

Fixed-Parameter Tractability II

### Observation

If a snapshot appears  $n^2$  times in a  $\Delta$ -window, all its edges can be colored properly. [just properly color every edge of it once]

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### Reduction Rule

If a snapshot appears more than  $2n^2$  times in a  $\Delta$ -window, then replace of its "middle" copies with an edgeless snapshot.

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#### Lemma

If the reduction rule is not applicable, each  $\Delta$ -window contains at most  $2n^2 \cdot 2^{n^2}$  (non-trivial) snapshots.

Fixed-Parameter Tractability III

Recall our first exponential-time algorithm:

#### Theorem

Sliding Window Temporal Coloring can be solved in  $O(k^{4\Delta \cdot n} \cdot T)$  time.

Therefore, since every  $\Delta$ -window has at most  $2n^2 \cdot 2^{n^2}$  snapshots (and since  $k \le n$ ):

#### Theorem

SWTC is linear-time fixed-parameter tractable (FPT) with respect to n (i.e. in  $O(f(n) \cdot T)$  time).

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Fixed-Parameter Tractability III

One of our hardness results:

#### Theorem

SWTC is NP-hard, even if the vertex cover number of the underlying graph G is at most 2k + 13 (where k = number of colors).

Thus we cannot hope for an (exact) FPT algorithm with respect to the parameter "vertex cover number of the underlying graph".

Fixed-Parameter Tractability III

### However:

#### Theorem

SWTC admits a linear-time FPT-approximation algorithm for parameter "vertex cover number of *G*" with an additive error one. (Objective: Minimize number of colors.)

Fixed-Parameter Tractability III

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#### Idea:

- Compute in linear FPT-time a minimum vertex cover of G (the rest is independent set in every slot!)
- Use our exponential algorithm to optimally solve SWTC in the temporal graph induced by the vertex cover vertices
- This is a lower bound on the number of colors needed for  $(G, \lambda)$
- Color all other vertices in all slots with a fresh color

Constant Underlying VC Reduction - Main Ideas I

Reduction from **Monotone Exactly 1-in-3 SAT**.

Constant Underlying VC Reduction - Main Ideas I

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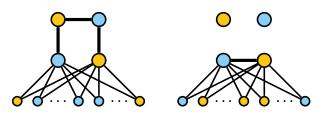
Main Idea: Encode variables with vertices, clauses with snapshots.

Constant Underlying VC Reduction - Main Ideas I

### Reduction from **Monotone Exactly 1-in-3 SAT**.

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### Variable Gadget:



Constant Underlying VC Reduction - Main Ideas II

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Type 1 snapshot.

Type 2 snapshot.

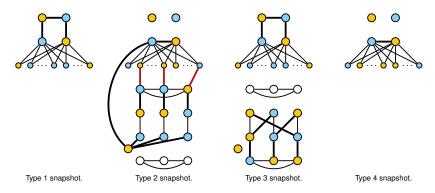
Type 3 snapshot.

Type 4 snapshot.

Constant Underlying VC Reduction - Main Ideas II

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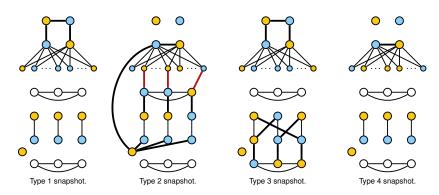
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#### and Future Work

### Further Results:

■ NP-hard for constant k,  $\Delta$ , and T even if each snapshot is a cluster graph.

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Restrict input graphs to only change slowly over time.

#### and Future Work

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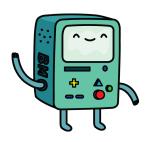
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### Thank you!



https://arxiv.org/ pdf/1811.04753.pdf Link to arXiv.