

# The temporal explorer who returns to the base <sup>1</sup>

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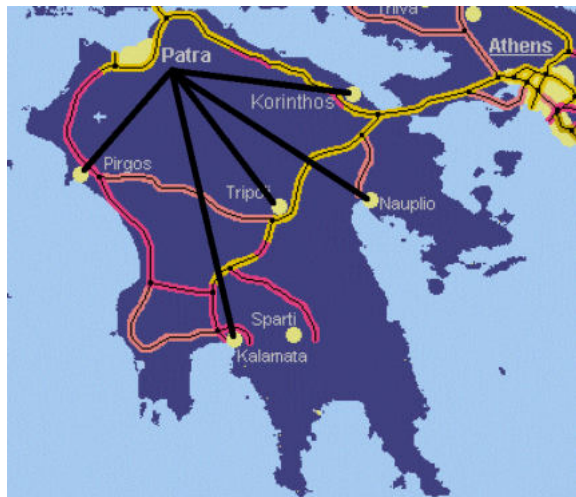
<sup>§</sup>Department of Computer Engineering & Informatics, University of Patras, Greece

July 9, 2018

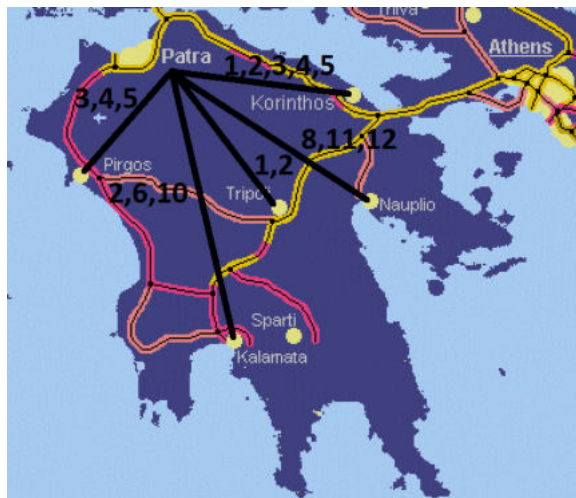
## Returning to the base



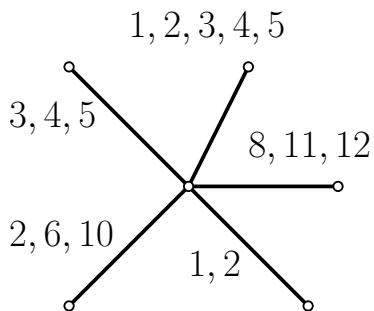
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# Temporal Graphs

## Definition (Temporal Graph)

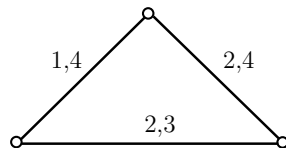
Let  $G = (V, E)$  be a graph. A temporal graph on  $G$  is a pair  $(G, L)$ , where  $L : E \rightarrow 2^{\mathbb{N}}$  is a time-labeling function, called a *labeling* of  $G$ , which **assigns to every edge** of  $G$  a set of **discrete-time labels**. The labels of an edge are the *discrete time instances* at which it is **available**.

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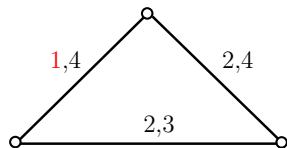


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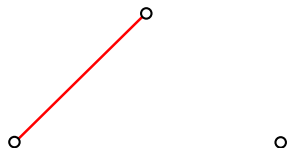
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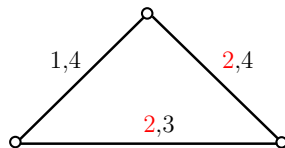


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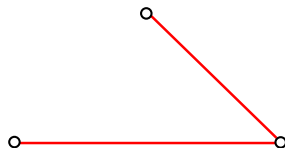
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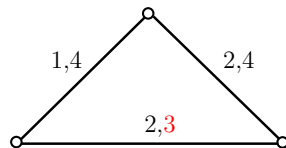


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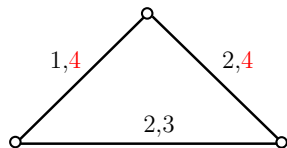


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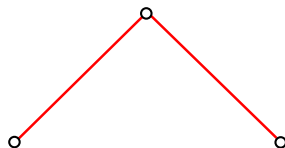
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# Temporal Graphs

## Definition (Temporal Star)

A temporal star is a temporal graph  $(G_s, L)$  on a star graph  $G_s = (V, E)$ . We denote by  $c$  the center of  $G_s$ .

## Definition (Time edge)

Let  $e = \{u, v\}$  be an edge of the underlying graph of a temporal graph and consider a label  $l \in L(e)$ . The ordered triplet  $(u, v, l)$  is called *time edge*.

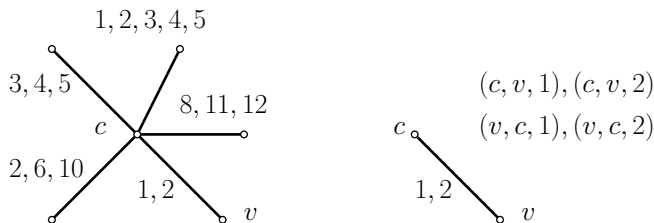
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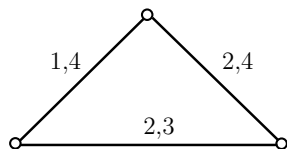
A *temporal path* or *journey*  $j$  from a vertex  $u$  to a vertex  $v$  ( $(u, v)$ -*journey*) is a **sequence of time edges**  $(u, u_1, l_1)$ ,  $(u_1, u_2, l_2)$ ,  $\dots$ ,  $(u_{k-1}, v, l_k)$ , such that  $l_i < l_{i+1}$ , for each  $1 \leq i \leq k - 1$ .

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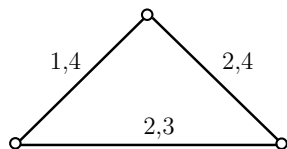


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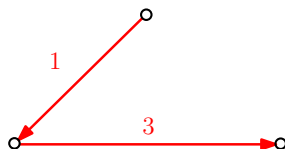
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A (partial) exploration of a temporal star is a **journey**  $J$  that **starts and ends at the center** of  $G_s$  which visits some nodes of  $G_s$ ; its size  $|J|$  is the number of nodes of  $G_s$  that are visited by  $J$ .

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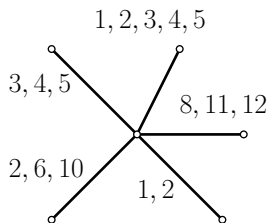
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- ▶ We **“enter”** (resp. **“exit”**) an edge when we cross it from **center to leaf** (resp. **leaf to center**) at a time on which the edge is **available**.
- ▶ We can assume that in an exploration the entry to any edge  $e$  is followed by the **exit** from  $e$  **at the earliest possible time**.  
Waiting at a leaf (instead of exiting as soon as possible) does not help in exploring more edges.

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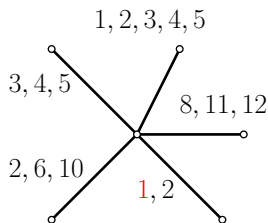
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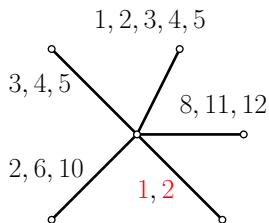
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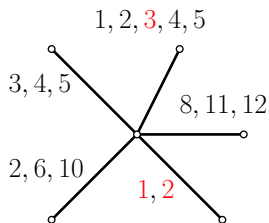
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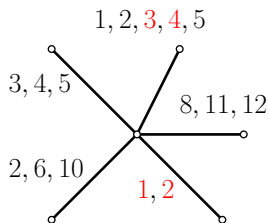
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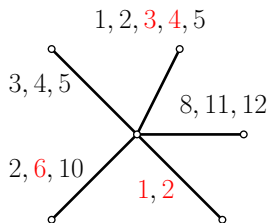
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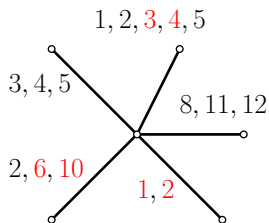




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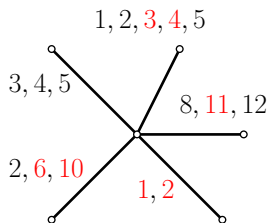
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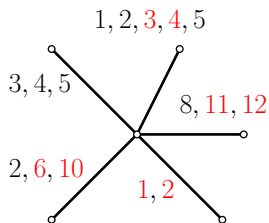
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## The problems

### StarExp( $k$ )

**Input:** A temporal star  $(G_s, L)$  such that every edge has at most  $k$  labels.

**Question:** Is  $(G_s, L)$  explorable?

### MaxStarExp( $k$ )

**Input:** A temporal star  $(G_s, L)$  such that every edge has at most  $k$  labels.

**Output:** A (partial) exploration of  $(G_s, L)$  of *maximum* size.

## Overview of results

- ▶ MaxStarExp(2) can be efficiently solved in  $O(n \log n)$  time
- ▶ StarExp(3) can be solved in  $O(n \log n)$  time
- ▶ StarExp( $k$ ) is NP-complete and MaxStarExp( $k$ ) is APX-hard, when  $k \geq 6$
- ▶ Greedy 2-approximation algorithm for MaxStarExp( $k$ )
- ▶ Characterisation of temporal stars with random labels that asymptotically almost surely admit a complete exploration

## MaxStarExp(2) solution in $O(n \log n)$ time

MaxStarExp(2) is reducible to the Interval Scheduling Maximization Problem (ISMP).

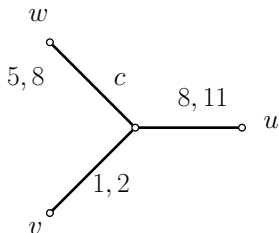
Interval Scheduling Maximization Problem (ISMP)

**Input:** A set of intervals, each with a start and a finish time.

**Output:** Find a set of non-overlapping intervals of maximum size.

## MaxStarExp(2) solution in $O(n \log n)$ time

- ▶ Every **edge**  $e$  can be **viewed as an interval** to be scheduled.
- ▶ Any (partial) exploration of  $(G_S, L)$  corresponds to a set of **non-overlapping intervals** of the same size as the exploration, and vice versa.



Interval 1:  $(8, 11.5)$

Interval 2:  $(1, 2.5)$

Interval 3:  $(5, 8.5)$

## MaxStarExp(2) solution in $O(n \log n)$ time

Greedy optimal solution for ISMP:

1. Start with the set  $S = E$  of all edges. Select the edge,  $e$ , with the **smallest largest label** (equivalent to the **earliest finish time** of the corresponding interval).
2. Remove from  $S$  the edge  $e$  and all **conflicting edges**.
3. Repeat until  $S$  is empty.

Time needed:  $(|E| \log |E|) = O(n \log n)$



## StarExp(3) solution in $O(n^2)$ time

- ▶ Note that if  $e$  has **2 labels**, it must be explored by entering at the smallest and leaving at the largest label.
- ▶ The instance is reduced to a smaller one, with **only edges with three labels**, by removing all conflicting labels with the exploration of  $e$  from other edges.
- ▶ We reduce MaxStarExp(3) to 2SAT.
- ▶ For every edge  $e$  with labels  $l_1, l_2, l_3$ , we define the **two possible exploration windows**  $[l_1, l_2], [l_2, l_3]$ .
- ▶ We assign to  $e$  a Boolean variable  $x_e$  such that the truth assignment  $x_e = 0$  (resp.  $x_e = 1$ ) means that edge  $e$  is explored in the 1st interval (resp. 2nd interval).

## StarExp(3) solution in $O(n^2)$ time

- ▶ For any two edges  $e_1$  and  $e_2$  with conflicting exploration windows, we add clauses:
  - ▶  $(x_1 \vee x_2)$  if the first exploration window of  $e_1$  is conflicting with the first exploration window of  $e_2$ .
  - ▶  $(\neg x_1 \vee \neg x_2)$  if the second exploration window of  $e_1$  is conflicting with the second exploration window of  $e_2$ .
  - ▶  $(\neg x_1 \vee x_2)$  if the second exploration window of  $e_1$  is conflicting with the first exploration window of  $e_2$ .
  - ▶  $(x_1 \vee \neg x_2)$  if the first exploration window of  $e_1$  is conflicting with the second exploration window of  $e_2$ .
- ▶ The constructed 2-CNF formula is satisfiable if and only if  $(G_s, L)$  is explorable.
- ▶ The formula contains  $O(n^2)$  clauses in total, and thus the exploration problem can be solved in  $O(n^2)$  time using a linear-time algorithm for 2SAT.

## StarExp(3) solution in $O(n \log n)$ time

The idea:

- ▶ Reduce StarExp(3) to 2SAT where the number of clauses in the constructed formula is **linear in  $n$** .
- ▶ **Sort** the  $3n$  labels of  $(G_s, L)$  and scan through them to **detect conflicts**.

## Hardness for $k \geq 6$ labels per edge

### Theorem

StarExp( $k$ ) is *NP-complete* and MaxStarExp( $k$ ) is *APX-hard*, for every  $k \geq 6$ .

Reduction from 3SAT(3):

3SAT(3)

**Input:** A boolean formula  $F$  in CNF with variables  $x_1, x_2, \dots, x_p$  and clauses  $c_1, c_2, \dots, c_q$ , such that each clause has at most 3 literals, and each variable appears in at most 3 clauses.

**Output:** Decision on whether the formula is satisfiable.

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**Output:** Decision on whether the formula is satisfiable.

- ▶ Wlog assume every variable occurs **once** negated,  $\neg x_i$ , and **at most twice** non-negated,  $x_i$ .

## The reduction

- ▶  $(G_S, L)$  has one edge per clause, and three edges per variable (one “primary” and two “auxiliary”) of  $F$ .
- ▶ The “primary” edge corresponding to a variable  $x$  has two pairs of labels, the 1st corresponding to  $x = 0$  and the 2nd corresponding to  $x = 1$ .

## The reduction

- ▶ Any edge corresponding to a clause containing  $x$  has an (entry, exit) pair of labels **conflicting with the 1st pair** of labels of the edge corresponding to  $x$  (associated with  $x = 0$ ) but not with the 2nd pair.
- ▶ Any edge corresponding to a clause containing  $\neg x$  has an (entry, exit) pair of labels **conflicting with the 2nd pair** of labels of the edge corresponding to  $x$  (associated with  $x = 1$ ) but not with the 1st pair.
- ▶ For every variable  $x$  we have two “auxiliary” edges:
  - ▶ The first one to **avoid entering and exiting** the primary edge corresponding to  $x$  **using labels from different pairs**.
  - ▶ The second one to **avoid entering** an edge corresponding to **some clause** using a label associated with  $x$  and **exiting** using a label associated with a *different* variable  $y$ .

## Greedy 2-approximation for MaxStarExp( $k$ )

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- ▶ Notice: there is an **optimal solution** exploring an edge  $e$  which has an exploration window with the **earliest exit time**.
- ▶ Indeed, suppose that it is not the case and consider an optimal solution not exploring  $e$ .
- ▶ One can **exchange** the explored edge of this solution that has **earliest exit time** with the edge  $e$  using its first exploration window.

## Greedy 2-approximation for MaxStarExp( $k$ )

**Input:** a temporal star graph  $(G_s, L)$  with at most  $k$  labels per edge,  $k \in \mathbb{N}^*$

**Output:** a (partial) exploration of  $(G_s, L)$

Initialize the set of candidate edges to be  $\mathcal{C} = E$ ;

Initialize the set of explored edges to be  $Exp = \emptyset$ ;

$t := 0$ ;

**while**  $\mathcal{C} \neq \emptyset$  **do**

Find  $e \in \mathcal{C}$  to be explored with **entry time at least  $t$**  and **minimum exit time**. Let  $t_0$  be said exit time;

Add  $e$  to the set of explored edges,  $Exp$  (with exploration window from  $t$  until  $t_0$ );

Remove  $e$  from the set of candidate edges,  $\mathcal{C}$ ;

$t = t_0 + 1$ ;

**if** no  $e \in \mathcal{C}$  has 2 labels greater or equal to  $t$  **then**

**break**;

**end**

**end**

## $k$ random labels per edge: The setting

- ▶ Each edge of  $G_S$  receives  $k$  labels independently of other edges, and each label is chosen uniformly at random and independently of others from the set of integers  $\{1, 2, \dots, \alpha\}$ , for some  $\alpha \in \mathbb{N}$ .

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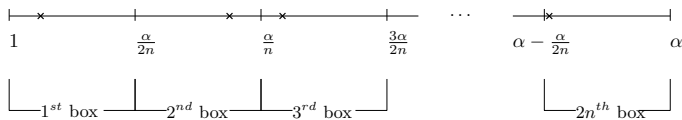
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- ▶ *Uniform random temporal star*;  $G_S(\alpha, k)$ .
- ▶ Goal: investigate the explorability of a uniform random temporal star based on different values of  $\alpha$  and  $k$ .

Case:  $\alpha \geq 2n$  and  $k \geq 6n \ln n$

### Theorem

If  $\alpha \geq 2n$  and  $k \geq 6n \ln n$ , then the probability that *we can explore all edges* of  $G_S(\alpha, k)$  tends to 1 as  $n$  tends to infinity.

Proof sketch.



We show that for every edge of  $G_S$ , there will be asymptotically almost surely *at least one of its labels* that falls *in the first box*, one of its labels that falls *in the second box*, etc.

### Observation

If for every edge  $e \in E$  and for every box  $B_i$  there is at least one label of  $e$  that lies within  $B_i$ , then there exists an exploration of  $G_S(\alpha, k)$ .

## Case: $\alpha \geq 4$ and $k = 2$

### Theorem

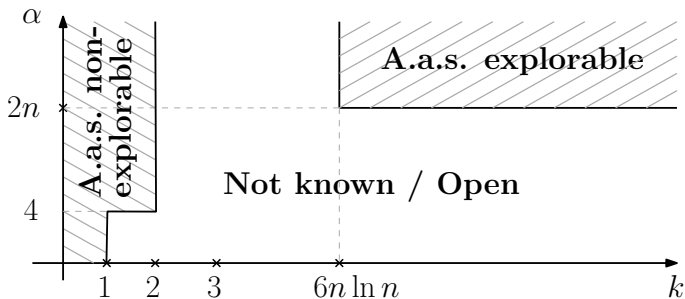
If  $\alpha \geq 4$  and  $k = 2$ , then the *probability* that we can explore all edges of  $G_s(\alpha, k)$  *tends to zero* as  $n$  tends to infinity.

### Proof idea.

- ▶ We introduce the notion of **blocking pairs** of edges.
- ▶ We show that for two particular edges, they are blocking asymptotically almost surely.
- ▶ We arbitrarily **group all edges** of  $G_s(\alpha, 2)$  into  $\lfloor \frac{n-1}{2} \rfloor$  independent pairs.
- ▶ If there is an exploration in  $G_s(\alpha, 2)$ , then there are no blocking pairs of edges in any such pairing.
- ▶ We show that **there is no exploration** asymptotically almost surely



## Explorability of $G_s(\alpha, k)$



The shaded areas of the chart indicate the pairs  $(\alpha, k)$  for which  $G_s(\alpha, k)$  is asymptotically almost surely (a.a.s.) explorable and non-explorable, respectively.

## Open problems

- ▶ Complexity of the maximization problem **MaxStarExp(3)**
- ▶ Complexity of  $\text{StarExp}(k)$  and  $\text{MaxStarExp}(k)$ , for  $k \in \{4, 5\}$
- ▶ Variation of  $\text{StarExp}(k)$  and  $\text{MaxStarExp}(k)$  where the consecutive labels of every edge are  $\lambda$  time steps apart, for some  $\lambda \in \mathbb{N}$ ; complexity and/or best approximation factor

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Thank you

[arxiv.org/abs/1805.04713](https://arxiv.org/abs/1805.04713)