# Spanners and connectivity problems in temporal graphs

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(Liverpool CS seminar)

Based on two joint works with:



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#### Example of scenario





#### Example of scenario



#### Modeling





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#### Modeling



#### Properties:

Temporal connectivity?	$\mathcal{TC}$
Repeatedly?	$\mathcal{TC}^{\mathcal{R}}$
Recurrent links?	$\mathcal{E}^{\mathcal{R}}$
In bounded time?	$\mathcal{E}^{\mathcal{B}}$

#### $\rightarrow$ Classes of temporal graphs





## Distributed algorithm







## Movement synthesis

## Temporal graphs for their own sake



What does make them truly different?

Temporal graphs (a.k.a. time-varying, time-dependent, evolving, dynamic,...)  $\mathcal{G} = (V, E, \lambda)$ , where  $\lambda : E \to 2^{\mathbb{N}}$  assigns *presence times* to edges.



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#### Temporal paths

- Non-strict ex: ((a, c, 3), (c, d, 4), (d, e, 4))
- Strict ex:  $\langle (a, c, 3), (c, d, 4), (d, e, 5) \rangle$

(non-decreasing)

(increasing)

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Connect

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5.7

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→ Warning: Reachability is non-symmetrical... and non-transitive!

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How about complexity?

Minimum-size spanner is APX-hard

(Kleinberg, Kempe, Kumar, 2000)

(Axiotis, Fotakis, 2016)

(Akrida, Gasieniec, Mertzios, Spirakis, 2017)

# Bad news and good news

### Recall the bad news:

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Spanners of size O(n log n) always exist in complete temporal graphs



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Spanners of size O(n log n) always exist in complete temporal graphs



Good news 2: (C., Raskin, Renken, Zamaraev, FOCS 2021):

Nearly optimal spanners (of size 2n + o(n)) almost surely exist in random temporal graphs, as soon as the graph is temporally connected

# Before we start... an easier model

Simple Temporal Graphs (STGs):

- 1. A single presence time per edge  $(\lambda : E \to \mathbb{N})$
- 2. Adjacent edges have different times ( $\lambda$  is locally injective)



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Further motivations:

- Distributed models by pairwise interactions, e.g. population protocols or gossip models (without repetition)
- Close model to edge-ordered graphs (Chvátal, Komlós, 1971)



## Good news 1:

Temporal cliques admit sparse spanners



(with)



# Two promising techniques...

## Pivotability

Pivot node v and time t such that:

- $\blacktriangleright$  all nodes can reach v before t
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Then in-tree  $\cup$  out-tree = spanner of size 2n - 2 (in fact 2n - 3...)



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#### Dismountability Three nodes u, v, w such that: $uv = \min - edge(v)$ $uw = \max - edge(w)$ Then spanner ( $\mathcal{G}$ ) := spanner ( $\mathcal{G}[V \setminus u]$ ) + uv + uwRecursively, $v = \frac{1}{2}$ v

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### ... unfortunately

Both techniques fail in some cases.

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#### Backward spanner also possible

 $\rightarrow$  Spanner = max edges + all edges of collectors



# Combining both directions

- Each vertex can reach at least one emitter u through u's min edge
- Each vertex can be reached by a collector v through v's max edge
- Each emitter can reach all collectors through direct edges



+ edges between emitters and collectors



#### Theorem:

At most n/2 emitters and n/2 collectors  $\Rightarrow \exists$  Spanners of size  $\binom{n}{2}/2 + O(n)$ 

pprox half of the edges



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#### Technique: Partial delegations among emitters

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#### Iterative procedure:

In each step *i*:

- Half of the emitters partially delegate to other half
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### Conclusion:

 $\exists$  spanner of size  $O(n \log n)$   $\Box$ 





### Open questions (deterministic)

#### Better spanners for temporal cliques?

- ▶ Is  $O(n \log n)$  optimal for cliques? Is O(n) possible?
- Even better, does  $2n 4 \le OPT \le 2n 3$ ? (so far, no counter-example found)

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#### What about random temporal graphs?

### Good news 2:

# Spanners of size 2n + o(n) almost surely exist

### in random temporal graphs

(with)





Random simple temporal graphs:

- 1. Pick an Erdös-Rényi  $G \sim G_{n,p}$
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 $\log n$  $2 \frac{\log n}{2}$ nStandard connectivity First source  $(1 \leftrightarrow *)$ Most vertex pairs reach each other  $(\sim * \rightsquigarrow \sim *)$ 

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Timeline for p (as  $n \to \infty$ ):



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(sharp:  $\exists \epsilon(n) = o(1)$ , not true at  $(1 - \epsilon(n))p$ , true at  $(1 + \epsilon(n))p$ )

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#### Another point of view:

- 1. Take a complete graph  $K_n$
- 2. Assign random real times in [0, 1] to every edge
- 3. Restrict your attention to  $\mathcal{G}_{[0,p]}$
- $\rightarrow$  Better for analysis.
















For sufficiently large n, what happens when p increases?



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### Analysis

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- $\Rightarrow$  Expect to reach all vertices at  $\sum_{k=1}^{n} \frac{1}{k(n-k)} \approx 2 \frac{\log n}{n}$ .

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- The waiting time for one of these to appear is  $\approx \frac{1}{k(n-k)}$
- ⇒ Expect to reach all vertices at  $\sum_{k=1}^{n} \frac{1}{k(n-k)} \approx 2 \frac{\log n}{n}$ .
- Azuma's inequality for concentration.

We note foremost(u) the set of vertices reached by a foremost tree from u.

#### Reachability thresholds

 $\blacktriangleright \sim * \rightsquigarrow \sim * \iff \forall u, \forall v, a.a.s. \ v \in foremost(u)$ 

 $(\log n/n)$ 

We note foremost(u) the set of vertices reached by a foremost tree from u.

#### Reachability thresholds

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 $\blacktriangleright \text{ Pivotal } (* \rightsquigarrow 1 \rightsquigarrow *) \iff (* \rightsquigarrow \sim *) + (\sim * \rightsquigarrow *)$   $(4 \log n/n)$ 

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 $\triangleright \sim * \rightarrow \sim * \iff \forall u, \forall v, a.a.s. v \in foremost(u)$  $(\log n/n)$ ▶  $1 \rightsquigarrow * \iff a.a.s. \exists u, \forall v, v \in foremost(u)$  $(2\log n/n)$  $\blacktriangleright \sim * \rightsquigarrow * \iff \forall u, a.a.s. \ \forall v, v \in foremost(u)$  $(2\log n/n)$  $\blacktriangleright * \rightsquigarrow * \iff a.a.s \ \forall u, \forall v, v \in foremost(u)$  $(3\log n/n)$ LB:  $(* \rightsquigarrow 1) + (\log n/n)$ , each non sink must have at least one new edge. UB:  $(* \rightarrow \sim *) + (\log n/n)$ , each non sink is reached from at least one sink.

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- $\mathsf{Pivotal} \ (* \rightsquigarrow 1 \rightsquigarrow *) \Longleftrightarrow (* \rightsquigarrow \sim *) + (\sim * \rightsquigarrow *)$  $(4\log n/n)$
- Optimal spanner (size 2n 4) Pivotal square. Sharp ?

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$Pivotal\;(\ast \rightsquigarrow 1 \rightsquigarrow \ast) \Longleftarrow (\ast \rightsquigarrow \sim \ast) + (\sim \ast \rightsquigarrow \ast)$	$(4\log n/n)$
Optimal spanner (size $2n - 4$ ) Pivotal square. Sharp ?	$(4\log n/n)$
Nearly optimal spanner (size $2n + o(n)$ ) LB: Trivial (not temporally connected) UB: Explicit construction Three intervals of length $\log n/n$ :	$(3\log n/n)$
$\sim * \rightsquigarrow 1$ (say $u$ ) $u \rightsquigarrow \sim *$	By $\log n/n$ between $2 \log n/n$ and $3 \log n/n$ .

▶ u ~→ missing

▶ missing ~→ missing

 $\begin{array}{c} \text{By } \log n/n \\ \text{between } 2 \log n/n \text{ and } 3 \log n/n. \\ \text{between } 0 \text{ and } 2 \log n \\ \text{between } \log n/n \text{ and } 3 \log n/n \\ \text{between } 0 \text{ and } 3 \log n/n \end{array}$ 

# Random Non-Simple Temporal Graphs

 $\mathcal{H}_{n,p}$ : Each edge independently appears according to a rate 1 Poisson process stopped at time p.



#### Theorem

All our thresholds also hold for  $\mathcal{H}_{n,p}$ .

### Simple temporal graphs (beyond spanners)

Special properties and symmetries

## Equivalence based on reachability (up to time distortion)

Different STGs are equivalent in terms of reachability



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How to capture this equivalence?
Different STGs are equivalent in terms of *reachability* 



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Option 1: Local ordering?

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How to capture this equivalence?

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STG representatives have good properties for generation

+ canonization, isomorphism testing, and computation of generators for the automorphism group, are all feasible in *polynomial time*.

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- 2. Assign them the smallest available time
- 3. Increment time
- 4. Repeat on remaining edges



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### Properties of the labeling

Time induces a *proper* coloring of the edges (by definition of STGs).

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(If you know a name for this type of edge coloring, please let me know.)

Input: Two STGs  $G_1$  and  $G_2$ Output: Are they equivalent?

### Two steps algorithm:

- 1. Canonize them
- 2. Test for (classical) isomorphism of the canonical forms

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Key observation: when trying to send  $v_1$  to  $v_2$ , the mapping among neighbors unfolds recursively without choices (due to the *proper coloring* of the edges)

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Remark: Also feasible using Babai & Luks machinery (1983)

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At most *n* automorphisms!

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*Case 2:* The underlying graph is not connected (the complement trick does not works for temporal graphs...)

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*Claim:*  $Aut(\mathcal{G}) = \langle \text{ isomorphisms } + \text{ automorphisms } \rangle$ 

 $\rightarrow$  Generators for  $Aut(\mathcal{G})$  can be computed in polynomial time!

#### Enumeration up to equivalence

(motivated by conjecture refutation on spanners)

#### Generation tree

Principle: One level = one time unit

 $\rightarrow$  children of a graph = all the possible ways to add the *next time* 



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 $\downarrow$  Isomorphism types separated (forever)

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Coloring lemma: (t+1) must be adjacent to (t)

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 $\rightarrow\,$  Enumerate all matchings of eligible *non-edges*. Each one defines a successor.

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Two cases

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 $\rightarrow$  Enumerate matchings of eligible *non-edges* whose *multisets of orbits* are distinct



Done using the generators for  $Aut(\mathcal{G})$ 

#### https://github.com/acasteigts/STGen

#### How to use

```
include("generation.jl")
n = 5
```

for g in TGraphs(n)
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Implemented in Julia (other versions also in Python and Java)

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Do simple temporal cliques admit spanners of size 2n - 3?

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 $\rightarrow$  True for  $n \leq 7$  (and for all non-rigid graphs at n = 8). Otherwise still open! :-)

# Some numbers

# Vertices	# STGs	# Temporally connected STGs	# Simple Temporal cliques
1	1	1	1
2	2	1	1
3	4	1	1
4	62	32	20
5	15378	10207	4524
6	89769096	70557834	23218501
7	13828417028594	?	3129434545680
8	?	?	?

Non dismountable clique:



Non pivotable clique (seen as a union of two graphs):



# Thanks!



next time... :-)