Spanners and connectivity problems in temporal graphs

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> (Liverpool CS seminar)

Based on two joint works with:

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Joseph Peters (Vancouver)

Michael Raskin (Munich)

Malte Renken (Berlin)

(Liverpool)

## (Highly) dynamic networks?

## $\theta=0$

Example of scenario


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Modeling

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(x+5

## (Highly) dynamic networks?



Example of scenario


Modeling
Properties:

- Repeatedly?
- Recurrent links?
- In bounded time?
- ...
$\rightarrow$ Classes of temporal graphs
- Temporal connectivity? $\mathcal{T C}$

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ene


## Some classes of temporal graphs

infinite lifetime


## Some classes of temporal graphs

Distributed algorithm


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## Distributed algorithm



Centralized algorithm

## Some classes of temporal graphs

Distributed algorithm


Temporal graphs for their own sake


What does make them truly different?

## Basic definitions

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

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Temporal paths

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


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Output: a graph $\mathcal{G}^{\prime} \subseteq \mathcal{G}$ that preserves temporal connectivity $\left(\mathcal{G}^{\prime} \in T C\right)$
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How about complexity?

- Minimum-size spanner is APX-hard


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

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


## Before we start... an easier model

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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:

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


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## Dismountability

Three nodes $u, v, w$ such that:

- uv $=$ min $-\operatorname{edge}(v)$
- uw $=$ max-edge $(w)$

Then spanner $(\mathcal{G}):=\operatorname{spanner}(\mathcal{G}[V \backslash u])+u v+u w$


Recursively,


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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
$\rightarrow$ Spanner $=$ min edges + max edges
+ edges between emitters and collectors



## Theorem:

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

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## Iterative procedure:

In each step $i$ :


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## Conclusion:

$\exists$ spanner of size $O(n \log n) \quad \square$

## Open questions (deterministic)

## Better spanners for temporal cliques?

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


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## Relaxing the complete graph assumption

- Can more general classes of dense graphs be sparsified?
$\rightarrow$ Recall that $\exists$ unsparsifiable graphs of density $\Theta\left(n^{2}\right)$
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What about random temporal graphs?

## Good news 2:

Spanners of size $2 n+o(n)$ almost surely exist in random temporal graphs
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## Sharp thresholds in random temporal graphs (C., Raskin, Renken, Zamaraev, 2021)

Random simple temporal graphs:

1. Pick an Erdös-Rényi $G \sim G_{n, p}$
2. Permute the edges randomly, interpret as (unique) presence time


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

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Standard connectivity

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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.

## Timeline of temporal reachability in $\mathcal{G}_{n, p}$

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## Main technical tool: growth of a foremost tree

Foremost tree (from $s$ )

- Foremost temporal paths from $s$ to all
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- Azuma's inequality for concentration.


## Derived arguments

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- Nearly optimal spanner (size $2 n+o(n)$ )

LB: Trivial (not temporally connected)
UB: Explicit construction
Three intervals of length $\log n / n$ :

- $\sim * \rightsquigarrow 1$ (say $u$ )
- $u \rightsquigarrow \sim *$
- missing $\rightsquigarrow u$
- $u \rightsquigarrow$ missing
- missing $\rightsquigarrow$ missing


## 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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STG representatives have good properties for generation

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


## STG representatives

## Canonization

1. Find edges that are local minima
2. Assign them the smallest available time
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(If you know a name for this type of edge coloring, please let me know.)

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Input: Two STGs $\mathcal{G}_{1}$ and $\mathcal{G}_{2}$
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Remark: Also feasible using Babai \& Luks machinery (1983)

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Claim: $\operatorname{Aut}(\mathcal{G})=\langle$ isomorphisms + automorphisms $\rangle$
$\rightarrow$ Generators for $\operatorname{Aut}(\mathcal{G})$ can be computed in polynomial time!

Enumeration up to equivalence
(motivated by conjecture refutation on spanners)

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Principle: One level = one time unit
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$\rightarrow$ Enumerate matchings of eligible non-edges whose multisets of orbits are distinct


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

## Using the generator

How to use

```
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Do simple temporal cliques admit spanners of size $2 n-3$ ?
$\rightarrow$ 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... :-)

