## Graph temporalisation

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## Temporal graphs



Also known as

- time-dependent networks [Cooke, Halsey 1966],
- edge scheduled networks [Berman 1996], dynamic graphs [Harary, Gupta 1997], temporal networks [Kempe, Kleinberg,
Kumar 2002], evolving graphs [Bhadra, Ferreira 2003],
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- time-varying graphs [Casteigts, Flocchini, Quattrociocchi,

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- link streams [Latapy, Viard, Magnien 2018],...


## Temporal path



A path with increasing time labels.
Temporal paths are strict and waiting is allowed.
Reachable set $\mathcal{R}(u)$ : the set of nodes $v$ that $u$ can reach by
a temporal path (we let uRv denote $v \in \mathcal{R}(u)$ ).
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Given a multidigraph $M=(V, A)$ assign time labels to edges.

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## Undirected temporalisation and label connectivity

Label-connected graph : assign time labels to an undirected graph $(V, E)$ such that $\mathcal{R}(u)=V$ for all $u \in V$.

## Undirected setting : if uv is available at time $\dagger$, both ( $u, v$ )

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Undirected and directed settings differ on a path.

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Known results [Göbel, Cerdeira, Veldman 1991]:

- Deciding label-connectivity is NP-hard.
- A graph is label-connected iff it contains two edge-disjoint spanning tree-pairs and some 4-cycle condition.

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The trip of a vehicle produces a sequence of temporal edges.

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Temporal edges are grouped into walks called trips.

## Trip temporalisation

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## One-to-one reachability is hard

O20-RTT: given $u, v \in V$ decide if there exists a trip temporalisation such that uRv.

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3-SAT reduction :


## Consequence and work-around

Theorem For any $\varepsilon>0$, MRTT cannot be approximated within $O\left(n^{1-\varepsilon}\right)$ unless $P=N P$.

Idea: connect many sources to $\mathrm{v}_{1}$ and many sinks to $\mathrm{w}_{\mathrm{m}+1}$.

Theorem O20-RTT using at most $k$ trips can be solved in $2^{O(k)} \mathrm{m} \log T$ where $m=|E(M)|$ and $T$ is the number of trips.

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## Strong temporalisabilty

A trip network is strongly temporisable when for each pair $u, v \in V$, there exists a temporalisation such that uRv.

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Bounded reachability: $\sum_{u}|\mathcal{R}(u)|=O\left(n^{1.5}\right)(\sqrt{n}$ gap $)$.

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## Unapproximability of MRTT

Theorem MRTT cannot be approximated within $\sqrt{n} / 12$ unless $P=N P$ even in strongly temporisable trip networks.


Reduction from O2O-MRTT.

## Symmetricity



For every $\operatorname{trip}\left\langle\mathrm{v}_{1}, \ldots, \mathrm{v}_{\mathrm{k}}\right\rangle$, there is a reverse $\operatorname{trip}\left\langle\mathrm{v}_{\mathrm{k}}, \ldots, \mathrm{v}_{1}\right\rangle$.

## MRTT is hard in symmetric trip networks



## Approximability of symmetric trip networks

Fact A symmetric trip network is strongly temporisable iff $M$ is (strongly) connected.

> Theorem MRTT can be approximated within 9/2 in strongly temporisable symmetric trip networks.

Idea:

- group trips and reverse trips into pairs,
- compute a centroid pair C, and a partition $A,\{C\}, B$ of
trip pairs,
- schedule trips pairs in $A,\{C\}, B$ respectively so that - each node in $V(A \cup\{C\})$ can reach $V(\{C\} \cup B)$.


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## Going further

All results hold with arbitrary positive delays on edges,
and with fixed waiting times at stops.

Open : varying waiting times can be chosen in the temporalisation.

Open : each trip is duplicated K times.

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## Directed graph temporalisation

Define the temporal reachability of a temporal graph as the number of node pairs that are temporally connected.

Problem : given a strongly connected multi-digraph, assign one time label per edge so that temporal reachability is maximal.
or within a constant factor from maximal (approximation).

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## Undirected graph temporalisation is quite known

Given an undirected graph $G$, deciding whether there exists an assignment of one time label per edge such that all pairs are temporally connected is NP-complete. [Göbel, Cerdeira, Veldman 1991]

Approximation is obvious: take a spanning tree and assign time labels that connect $(n / 2)^{2}$ pairs.

Related (Gossip/telephone problem [Bumby 1981]) : The minimum number of time labels allowing to temporally connect all pairs is $2 n-2$, or $2 n-4$ if $G$ has a $C_{4}$ (one or two time labels per edge).

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## Directed graph temporalisation : what we know

Given a strong digraph $D$, deciding whether there exists an assignment of one time label per edge such that all pairs are temporally connected is NP-complete. [Unpublished, ask Filippo]
(The above is not implied by the undirected hardness.)
Approximation? : there exists strong digraphs where it is not possible to connect $(n / 2)^{2}$ pairs (but (n/3)(2n/3) is possible).

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## Edge-disjoint in-tree and out-tree : related work

Related problem: Find an in-tree and an out-tree with same root that are edge disjoint and have size $\Omega(\mathbf{n})$.

It is NP-hard to decide if a strong digraph has such a pair. [Bang-Jensen 1991]

Conjecture: There exist c such that any c-edge-connected digraph has such a pair.

Every strong digraph with stability $\alpha$ is spanned by the disjoint union of $\max \{1, \alpha-1\}$ paths. [Thomassé 2001]

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