Data analysis - What data and what to look for?

Input: Real-world data from mobile networks (e.g. CRAWDAD datasets)

Question: Can we detect basic temporal features?



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Examples of properties (seen previously):

- 1.  $\mathcal{J}^{1\forall}$ : At least one node can reach all the others through a journey (1  $\rightsquigarrow$  \*),
- 2. TC: All nodes can reach each other through journeys (\*  $\rightsquigarrow$  \*),
- 3.  $\mathcal{E}^{1orall}$ : At least one node shares at some point an edge with every other (1 \*),
- 4.  $\mathcal{K}$ : All pairs of nodes share at some point an edge (\* \*),
- 5.  $\mathcal{J}^{\forall 1}$ : At least one node can be reached by all others through a journey (\*  $\rightsquigarrow$  1),
- 6.  $\mathcal{J}^{1\forall>}$ : At least one node can reach all the others through a strict journey  $(1 \stackrel{st}{\rightsquigarrow} *)$ ,
- 7.  $TC^>$ : All nodes can reach each other through strict journeys (\*  $\stackrel{st}{\rightsquigarrow}$  \*).

Data analysis - Defining intermediate objects

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### Data analysis - Defining intermediate objects

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, with  $G_i = (V, E_i)$ .

#### (1) The footprint

The *footprint* of G is the (static) graph G = (V, E) such that  $E = \bigcup_i E_i$ . Here, we can assume that  $V_i$  does not vary.

For example: this temporal graph...

... has footprint



# Data analysis - Defining intermediate objects

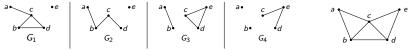
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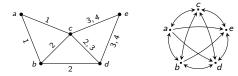


#### (2) The transitive closure of journeys

The *transitive closure* of the journeys is the <u>directed</u> graph  $\vec{G} = (V, \vec{E})$  such that  $(u, v) \in \vec{E}$  if and only if there is a journey from u to v in G. We distinguish between *strict* and *non-strict* transitive closures, depending on the type of journeys allowed.

For example, this temporal graph...

...has strict transitive closure



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### Data analysis - Using the intermediate objects

Now, we have the following equivalences:

- $\mathcal{J}^{1\forall} \iff$  The transitive closure contains an out-dominating set of size 1.
- $\mathcal{J}^{\forall 1} \iff$  The transitive closure contains an in-dominating set of size 1.
- $\mathcal{J}^{1\forall>} \iff$  The strict transitive closure contains an out-dominating set of size 1.
- $TC \iff$  The transitive closure is a complete graph.
- $TC^> \iff$  The strict transitive closure is a complete graph.
- ▶  $\mathcal{E}^{1\forall}$   $\iff$  The footprint contains a dominating set of size 1 (*a.k.a.* universal vertex).

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- $\blacktriangleright \ \mathcal{K} \iff \text{The footprint is a complete graph.}$
- $\rightarrow$  Queries can be answered trivially once the intermediate objects are computed!

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### Exercises: how to compute these objects?

### Solutions to the exercises

In all algorithms, the input G is given as a sequence  $\{G_1, ..., G_k\}$ , with  $G_i = (V, E_i)$ .

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# Algorithm 1 Computing the footprint

1:  $E \leftarrow \emptyset$  // edges of the footprint 2: for all  $G_i \in \mathcal{G}$  do 3: for all  $e \in E_i$  do 4:  $E \leftarrow E \cup e$ 5: return (V, E) // the footprint graph

#### Exercises: how to compute these objects?

#### Solutions to the exercises

In all algorithms, the input G is given as a sequence  $\{G_1, ..., G_k\}$ , with  $G_i = (V, E_i)$ .

#### Algorithm 3 Computing the footprint

1:  $E \leftarrow \emptyset$  // edges of the footprint 2: for all  $G_i \in \mathcal{G}$  do 3: for all  $e \in E_i$  do 4:  $E \leftarrow E \cup e$ 5: return (V, E) // the footprint graph

#### Algorithm 4 Computing the strict transitive closure

1:  $T \leftarrow (V, \emptyset) //$  initial transitive closure

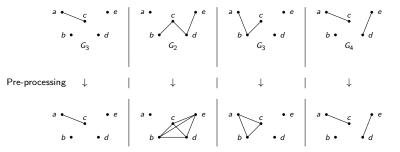
2: for all  $G_i \in \mathcal{G}$  do 3:  $T_{new} \leftarrow copy(T)$ 4: for all  $(u, v) \in E_i$  // manipulated as a directed graph do 5: for all w such that  $(w, u) \in E(T)$  do 6:  $E(T_{new}) \leftarrow E(T_{new}) \cup (w, v)$ 7:  $E(T_{new}) \leftarrow E(T_{new}) \cup (u, v)$ 

8: return T

# Solutions to exercises (2)

Algorithm 3 Computing the transitive closure for non-strict journeys

- $\rightarrow$  2 steps:
  - 1. Pre-process each graph of the sequence by saturating the connected components



2. Then runs the previous algorithm for *strict* transitive closure on this new sequence.  $\rightarrow$  There is an arc in the result if and only if there is a (possibly non-strict) journey in  $\mathcal{G}$ .