A logical method for temporal knowledge representation and reasoning

Matei Popovici1

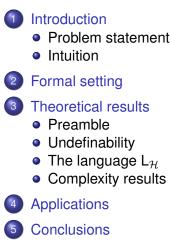
¹POLITEHNICA University of Bucharest Computer Science and Engineering Department

February 12, 2003

Matei Popovici Temporal reasoning using temporal graphs

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Outline

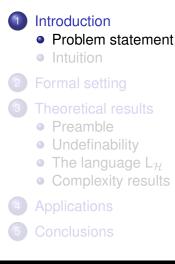


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Problem statement Intuition

Outline



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Problem statement Intuition

Problem statement

• Objective: Modelling domains that change in time

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Problem statement Intuition

Problem statement

- Objective: Modelling domains that change in time
- Example:

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Problem statement Intuition

Problem statement

- Objective: Modelling domains that change in time
- Example:

Bob is single



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Problem statement Intuition

Problem statement

- Objective: Modelling domains that change in time
- Example:



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Problem statement Intuition

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- Objective: Modelling domains that change in time
- Example:



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Problem statement Intuition

Problem statement

- Objective: Modelling domains that change in time
- Example:



Distinctive features of our domains:

• No timestamps for events are known.

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Problem statement Intuition

Problem statement

- Objective: Modelling domains that change in time
- Example:



Distinctive features of our domains:

- No timestamps for events are known.
- The occurrence of an event can be related to previous events (partial ordering)

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Problem statement Intuition

Problem statement

- Objective: Modelling domains that change in time
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Distinctive features of our domains:

- No timestamps for events are known.
- The occurrence of an event can be related to previous events (partial ordering)

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Problem statement Intuition

Problem statement

- Objective: Modelling domains that change in time
- Example:



Distinctive features of our domains:

- No timestamps for events are known.
- The occurrence of an event can be related to previous events (partial ordering)
- The domain's evolution is **non-Markovian**.

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Problem statement Intuition

Problem statement

How do we represent

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Problem statement Intuition

Problem statement

How do we represent and reason about changing domains

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Problem statement Intuition

Problem statement

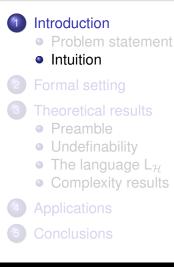
How do we **represent** and **reason** about changing domains in an **efficient** manner ?

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Problem statement Intuition

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Problem statement Intuition

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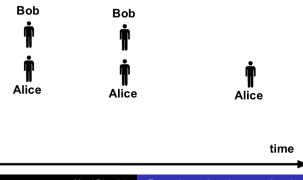




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Problem statement Intuition

Intuition

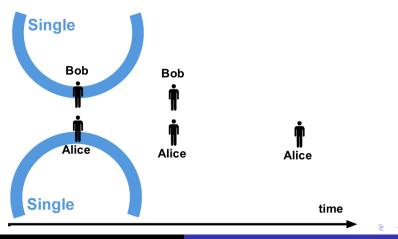


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Problem statement Intuition

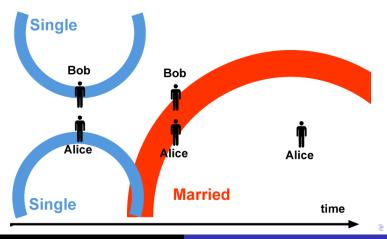
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Problem statement Intuition

Intuition

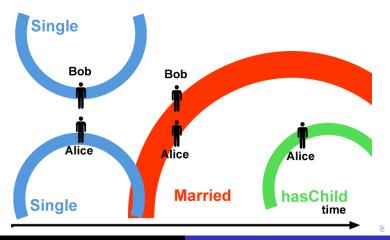


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Problem statement Intuition

Intuition

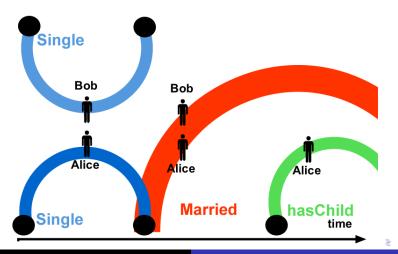


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Problem statement Intuition

Intuition



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Temporal reasoning using temporal graphs

Formal setting

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Formal setting

• elements of a set *I* = {*Bob*, *Alice*}, called **universe**



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Formal setting

- elements of a set *I* = {*Bob*, *Alice*}, called **universe**
- relation symbols from a vocabulary
 - $\sigma = \{$ *Single*, *Married*, *hasChild* $\}$

Single Married hasChild

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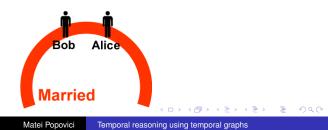
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- (*I*, *Single^I*, *Married^I*, *hasChild^I*) is a **labelling domain**



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- (*I*, *Single^I*, *Married^I*, *hasChild^I*) is a **labelling domain**
- (labelled) quality edges that span (labelled) action nodes



Temporal graphs

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Temporal graphs



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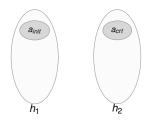
• A set A of action nodes

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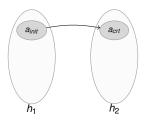
- A set A of action nodes
- A set H of hypernodes and $T : A \rightarrow H$

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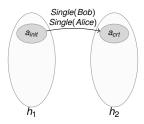




- A set A of action nodes
- A set *H* of **hypernodes** and $\mathcal{T} : A \to H$
- A set $E \subseteq A^2$ of quality edges

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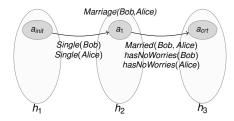
Temporal graphs



- A set A of action nodes
- A set H of **hypernodes** and $T : A \rightarrow H$
- A set E ⊆ A² of quality edges, labelled with relation instances from a labeling domain

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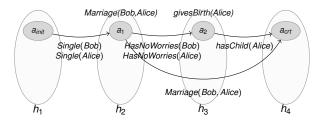
Temporal graphs



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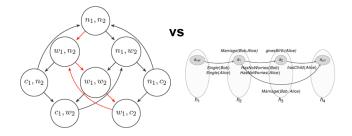
Temporal graphs



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Temporal graphs and Kripke Structures



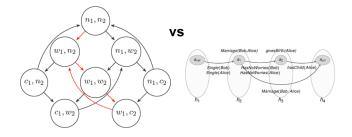
Temporal graphs versus Kripke Structures:

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Temporal graphs and Kripke Structures

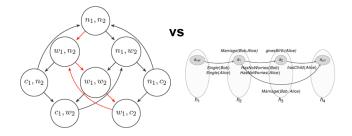


Temporal graphs versus Kripke Structures: • Kripke Structures (KS) are computational structures

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Temporal graphs and Kripke Structures



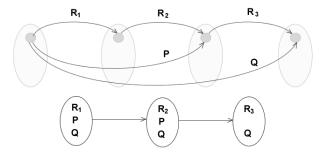
Temporal graphs versus Kripke Structures:

- Kripke Structures (KS) are computational structures
- temporal graphs are behavioural structures (similar to paths from a KS

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Temporal graphs and Kripke Structures

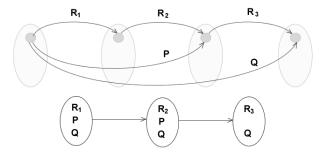


Temporal graphs versus Kripke Structures:

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Temporal graphs and Kripke Structures

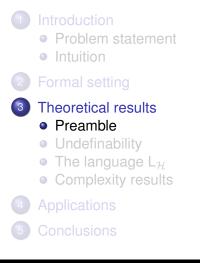


Temporal graphs versus Kripke Structures: • explosion of the number of labellings (scalability problem)

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Preamble Undefinability The language L_H Complexity results

Outline



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Why is theory important for our endeavour:

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Why is theory important for our endeavour:

 It shows whether or not we can achieve tractable implementations

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Why is theory important for our endeavour:

- It shows whether or not we can achieve tractable implementations
- It provides answers to questions such as:

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Why is theory important for our endeavour:

- It shows whether or not we can achieve tractable implementations
- It provides answers to questions such as:
 - Why not First-Order Logics ?

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Why is theory important for our endeavour:

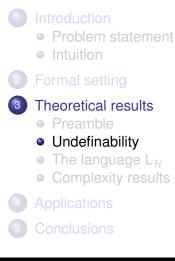
- It shows whether or not we can achieve tractable implementations
- It provides answers to questions such as:
 - Why not First-Order Logics ?
 - Why not Description Logics ?

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Temporal graphs and FOL undefinability

There exists no formula from First Order Logic (FOL) which can **express**:

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Temporal graphs and FOL undefinability

There exists no formula from First Order Logic (FOL) which can express: connectivity

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Temporal graphs and FOL undefinability

There exists no formula from First Order Logic (FOL) which can **express**: **connectivity** or the **existence of a path** between two components of a temporal graph

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The Ehrenfeucht-Fraïssé method (connectivity)

fix a natural number k



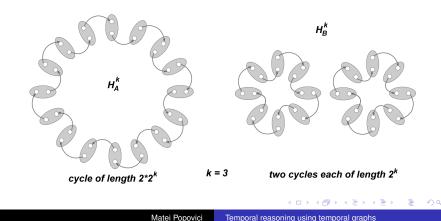
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The Ehrenfeucht-Fraïssé method (connectivity)

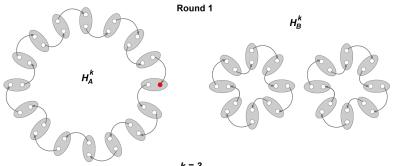
build two temporal graphs \mathcal{H}^k_A and \mathcal{H}^k_B



Undefinability

The Ehrenfeucht-Fraïssé method (connectivity)

play a k-round, two-player game: red vs blue



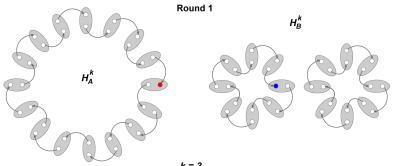
k = 3

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Undefinability

The Ehrenfeucht-Fraïssé method (connectivity)

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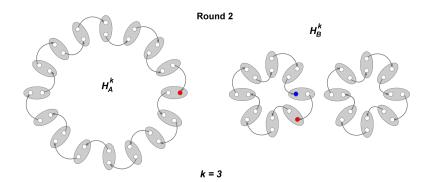
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The Ehrenfeucht-Fraïssé method (connectivity)

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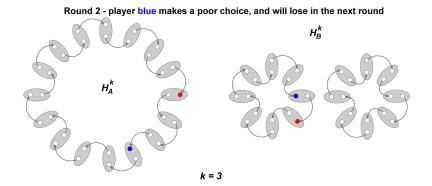


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The Ehrenfeucht-Fraïssé method (connectivity)

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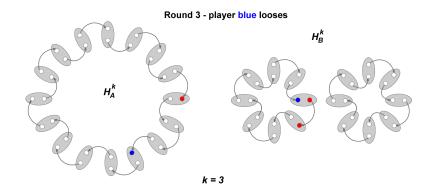
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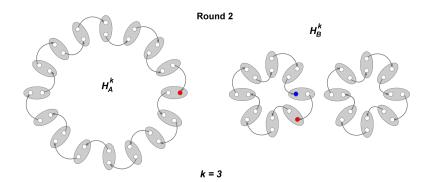


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The Ehrenfeucht-Fraïssé method (connectivity)

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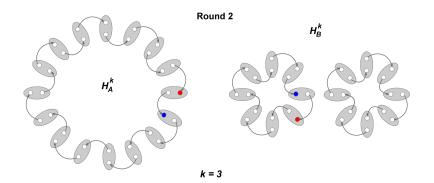


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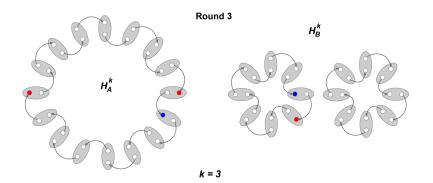


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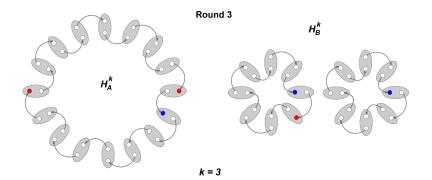


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The Ehrenfeucht-Fraïssé method (connectivity)

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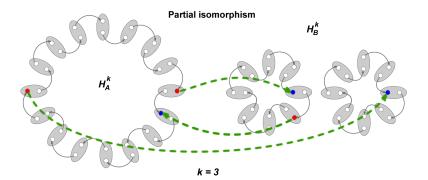


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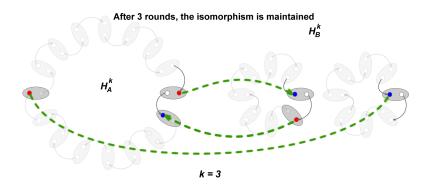
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The Ehrenfeucht-Fraïssé method (connectivity)

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The Ehrenfeucht-Fraïssé method (connectivity)

Theorem (Ehrenfeucht-Fraïssé):

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The Ehrenfeucht-Fraïssé method (connectivity)

Theorem (Ehrenfeucht-Fraïssé): If blue has a winning strategy

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The Ehrenfeucht-Fraïssé method (connectivity)

Theorem (Ehrenfeucht-Fraïssé): If blue has a winning strategy on a *k*-round game

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The Ehrenfeucht-Fraïssé method (connectivity)

Theorem (Ehrenfeucht-Fraïssé): If blue has a winning strategy on a *k*-round game, played over \mathcal{H}_A^k and \mathcal{H}_B^k

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The Ehrenfeucht-Fraïssé method (connectivity)

Theorem (Ehrenfeucht-Fraïssé): If blue has a winning strategy on a *k*-round game, played over \mathcal{H}_{A}^{k} and \mathcal{H}_{B}^{k} then there exists **no formula** from FO[k]

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The Ehrenfeucht-Fraïssé method (connectivity)

Theorem (Ehrenfeucht-Fraïssé): If blue has a winning strategy on a *k*-round game, played over \mathcal{H}_{A}^{k} and \mathcal{H}_{B}^{k} then there exists **no formula** from FO[k] which is true in \mathcal{H}_{A}^{k} and false \mathcal{H}_{B}^{k}

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The Ehrenfeucht-Fraïssé method (connectivity)

Importance of our result:

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The Ehrenfeucht-Fraïssé method (connectivity)

Importance of our result:

 SQL cannot be used for querying about temporal graph properties

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The Ehrenfeucht-Fraïssé method (connectivity)

Importance of our result:

- SQL cannot be used for querying about temporal graph properties
- Description Logics (without cyclic TBoxes) cannot be used to reason about temporal graphs

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 $\begin{array}{l} \mbox{Preamble} \\ \mbox{Undefinability} \\ \mbox{The language } L_{\mathcal{H}} \\ \mbox{Complexity results} \end{array}$

The Ehrenfeucht-Fraïssé method (connectivity)

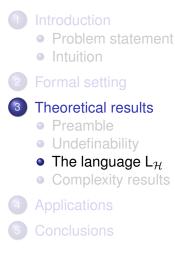
Importance of our result:

- SQL cannot be used for querying about temporal graph properties
- Description Logics (without cyclic TBoxes) cannot be used to reason about temporal graphs
- A **language** which is suitable for reasoning about temporal graphs is *outside* FOL

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Preamble Undefinability The language L_H Complexity results

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Preamble Undefinability The language L_H Complexity results

$L_{\mathcal{H}}$ Syntax

Let \mathbb{V} ars be a set of variables, \mathcal{A} be a $\sigma_E \cup \sigma_A$ -structure and \mathcal{H}_A be a \mathcal{A} -labelled t-graph. Also, let $X \in \{E, A\}$, and $\dagger_E \in \mathfrak{C}_Q$ and $\dagger_A \in \mathfrak{C}_A$. The syntax of a X-formula is recursively defined with respect to \mathcal{A} , as follows:

- if $R \in \sigma_X$ with arity(R) = n and $\overline{t} \in (\mathbb{V} \text{ars} \cup I)^n$, then $R(\overline{t})$ is an **atomic** *Q*-formula (or an atom).
- if ϕ is a X-formula then (ϕ) is also a X-formula;
- if φ, ψ are X-formulae then φ †_X ψ and φ¬ †_X ψ are also X-formulae. We call †_X a **positive** relation and _X a **negative/negated** relation.
- Let R ∈ σ_X, φ, ψ, ω be X-formulae and †_X, †'_X designate positive or negated relations. If φ has any of the following forms: (i) φ = R(t̄), (ii) φ = R(t̄) †_X ψ or (iii) φ = (R(t̄) †_X ω) †'_X ψ, then it is *R*-compatible.

If ϕ and φ are both *R*-compatible, then $\phi \land \varphi$ and $\phi \lor \varphi$ are *X* formulae, and *R*-compatible as well.

If ϕ is a *E* or *A*-formula and \overline{x} are variables occurring in ϕ , then we also write $\phi(\overline{x})$, to highlight these variables.

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L_H Semantics

Let \mathcal{A} be a $\sigma_E \cup \sigma_A$ (labelling) structure, and \mathcal{H} be a \mathcal{A} -labelled t-graph. $\overline{i} \in \mathcal{A}, R \in \sigma_E \cup \sigma_A, a, a'$ denote action nodes from \mathcal{H} , and q, q' denote quality edges. We write $\phi_{[\overline{x} \setminus \overline{i}]}$, to refer to the formula obtained from ϕ by replacing all variables from \overline{x} with individuals from \overline{i} . Also, let $X \in \{E, A\}$. The semantics of X-formulae is defined as follows:

$$\begin{aligned} \| \phi(\overline{x}) \|_{\mathcal{H}}^{X} &= \bigcup_{\overline{i}} \{ q \in \| \phi_{[\overline{x} \setminus \overline{j}]} \|_{\mathcal{H}}^{Q} \}; \\ & 2 \quad \| R(\overline{i}) \|_{\mathcal{H}}^{X} &= \{ q : R(\overline{i}) \in \mathcal{L}_{X}(q) \}; \\ & 3 \quad \| (\phi) \dagger_{Q} \psi \|_{\mathcal{H}}^{Q} &= \{ q \in \| \phi \|_{\mathcal{H}}^{Q} : \exists q' \in \| \psi \|_{\mathcal{H}}^{Q} \text{ such that } \lambda_{\dagger_{Q}}(q,q') \} \\ & 3 \quad \| (\phi) \dagger_{A} \psi \|_{\mathcal{H}}^{A} &= \{ a \in \| \phi \|_{\mathcal{H}}^{A} : \exists a' \in \| \psi \|_{\mathcal{H}}^{A} \text{ such that } \lambda_{\dagger_{A}}(a,a') \} \\ & 5 \quad \| \phi \neg \dagger_{X} \psi \|_{\mathcal{H}}^{X} &= \| (\phi) \neg \dagger_{X} \psi \|_{\mathcal{H}}^{X} &= \| \phi \|_{\mathcal{H}}^{X} \setminus \| \phi \dagger_{X} \psi \|_{\mathcal{H}}^{X}; \\ & 5 \quad \| \phi \dagger_{X} (\psi) \|_{\mathcal{H}}^{X} &= \| \phi \dagger_{X} \psi \|_{\mathcal{H}}^{X} \\ & 7 \quad \| R(\overline{i}) \dagger_{X} \psi \|_{\mathcal{H}}^{X} &= \| (R(\overline{i})) \dagger_{X} \psi \|_{\mathcal{H}}^{X}; \\ & 8 \quad \| \phi \lor \psi \|_{\mathcal{H}}^{X} &= \| \phi \|_{\mathcal{H}}^{X} \cup \| \psi \|_{\mathcal{H}}^{X}; \\ & 8 \quad \| \phi \land \psi \|_{\mathcal{H}}^{X} &= \| \phi \|_{\mathcal{H}}^{X} \cap \| \psi \|_{\mathcal{H}}^{X}; \end{aligned}$$

Preamble Undefinability The language L_H Complexity results

The language $L_{\mathcal{H}}$

Let $\varphi \in L_{\mathcal{H}}$ be a formula



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Preamble Undefinability The language L_H Complexity results

The language $L_{\mathcal{H}}$

Let $\varphi \in L_{\mathcal{H}}$ be a formula and \mathcal{H} be a temporal graph.

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Preamble Undefinability The language L_H Complexity results

The language $L_{\mathcal{H}}$

Let $\varphi \in L_{\mathcal{H}}$ be a formula and \mathcal{H} be a temporal graph. • $\|\varphi\|_{\mathcal{H}}^{\mathcal{E}}$ is the **set** of quality edges that satisfy φ

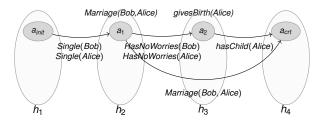


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Preamble Undefinability The language L_H Complexity results

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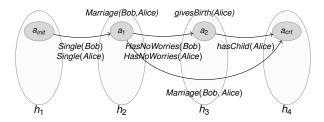
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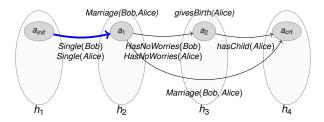
 $\|\text{Single}(x)\|_{\mathcal{H}}^{\mathcal{E}}$

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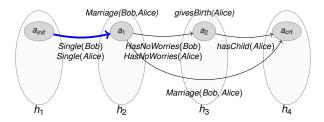
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Preamble Undefinability The language L_H Complexity results

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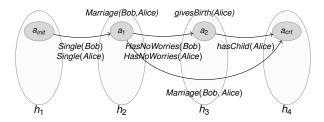
 $\|\text{Single}(x)\|_{\mathcal{H}}^{\mathcal{E}} = \{(a_{init}, a_1)\}$

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Preamble Undefinability The language L_H Complexity results

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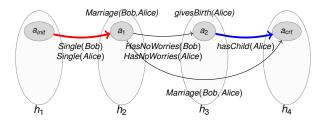
 $\|$ HasChild(x) after Single(x) $\|_{\mathcal{H}}^{E}$

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Preamble Undefinability The language L_H Complexity results

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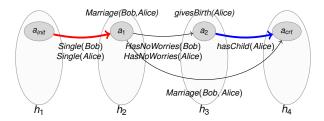
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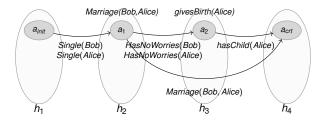
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Preamble Undefinability The language L_H Complexity results

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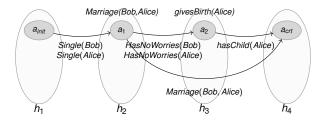
 $\|$ *HasNoWorries*(x) **after** *Single*(x) \land *HasNoWorries*(x) **before** *HasChild*(x) $\|_{\mathcal{H}}^{E}$

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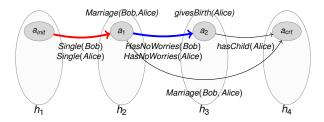
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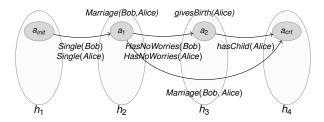
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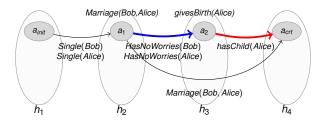
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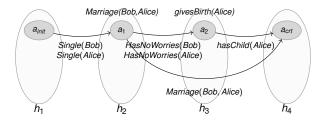
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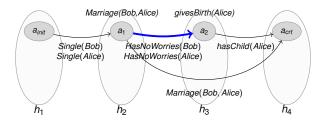
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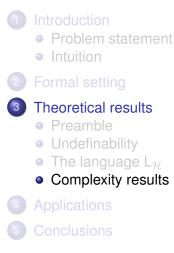


 $\|$ *HasNoWorries*(x) **after** *Single*(x) \land *HasNoWorries*(x) **before** *HasChild*(x) $\|_{\mathcal{H}}^{E} = \{(a_{1}, a_{2})\}$

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Preamble Undefinability The language L_H Complexity results

Complexity results

Computing $\|\varphi\|_{\mathcal{H}}^{\mathcal{E}}$



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Complexity results

Computing $\|\varphi\|_{\mathcal{H}}^{E} \equiv$ model checking the formula φ (w.r.t. a temporal graph \mathcal{H})



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Preamble Undefinability The language L_H Complexity results

Complexity results

Computing $\|\varphi\|_{\mathcal{H}}^{\mathcal{E}} \equiv$ **model checking** the formula φ (w.r.t. a temporal graph \mathcal{H}) The $L_{\mathcal{H}}$ **model checking** problem is:

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• NP-complete, for the full language $\mathcal{L}_{\mathcal{H}}$;

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Preamble Undefinability The language L_H Complexity results

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Methodology:

Matei Popovici Temporal reasoning using temporal graphs

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Preamble Undefinability The language L_H Complexity results

Complexity results

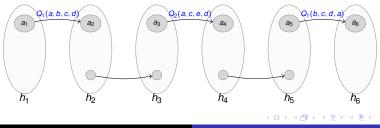
Computing $\|\varphi\|_{\mathcal{H}}^{E} \equiv$ model checking the formula φ (w.r.t. a temporal graph \mathcal{H})

The $L_{\mathcal{H}}$ model checking problem is:

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Methodology:

Make labellings trivial:



Matei Popovici Temporal reasoning using temporal graphs

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Complexity results

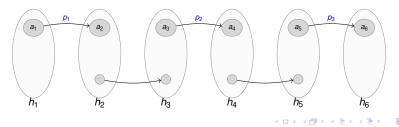
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Methodology:

Make labellings trivial: L^{*}_H



Matei Popovici Temporal reasoning using temporal graphs

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Complexity results

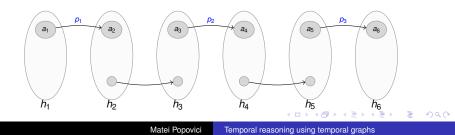
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Methodology:

• Make labellings trivial: L* PTIME model-checking



Preamble Undefinability The language L_H Complexity results

Complexity results

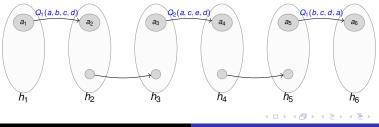
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Methodology:

• Assume $\langle H, \rangle$ is known:



Matei Popovici Temporal reasoning using temporal graphs

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Complexity results

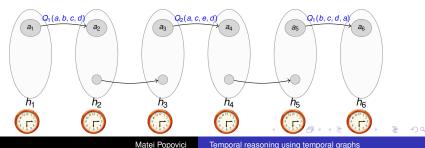
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Methodology:

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Preamble Undefinability The language L_H Complexity results

Complexity results

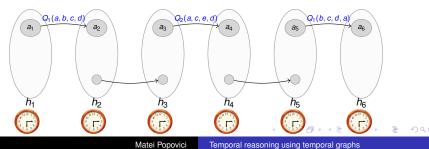
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Methodology:

• Assume $\langle H, \rangle$ is known: $L_{\mathcal{H}}^{\leq}$ NP-complete model-checking



Preamble Undefinability The language L_H Complexity results

Complexity results

Comparing $L_{\mathcal{H}}$ model checking with other approaches:

 $\begin{array}{c} \textbf{Method} \\ \text{The TEDL} \ \mathcal{HS} \\ \text{The TEDL} \ \mathcal{ALCT} \\ \text{The DL} \ \mathcal{ALC}(\text{cyclic TBoxes}) \\ \text{The DL} \ \mathcal{FL}_0(\text{cyclic TBoxes}) \\ \\ \mathcal{L}_{\mathcal{H}} \\ \mathcal{L}_{\mathcal{H}}^* \end{array}$

Reasoning problem

satisfiability satisfiability subsumption subsumption model-checking model-checking Complexity undecidable PSPACE – complete EXPTIME PSPACE – complete NP – complete PTIMF

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Applications of temporal graphs and $L_{\mathcal{H}}$

- Specifying time-dependent device behaviour in intelligent buildings
- Data mining logs from HPC systems
- Specifying optimal behaviour in MAS (Multi-Agent Systems)

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Applications of temporal graphs and $L_{\mathcal{H}}$

- Specifying time-dependent device behaviour in intelligent buildings
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Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

Setting: a finite set of players

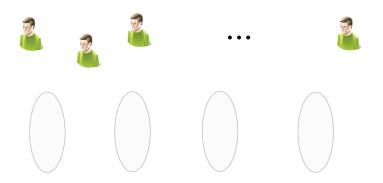


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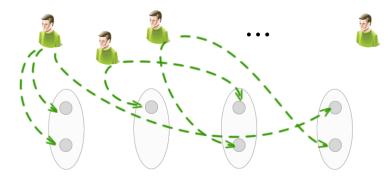
Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

a finite set of hypernodes



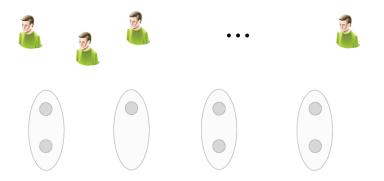
Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

possible actions, for each player



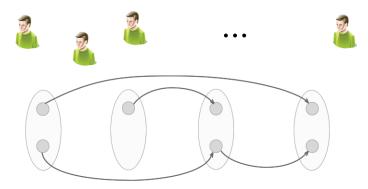
Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

an action ai consists of a set of labelled action nodes



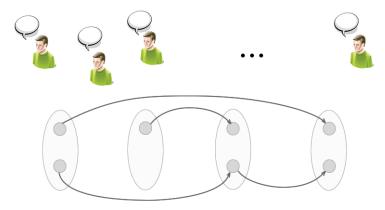
Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

quality edges created/destroyed by action nodes



Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

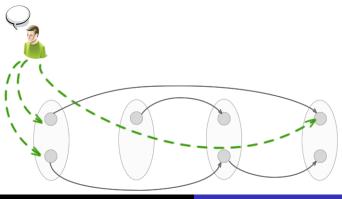
each player *i* has a **goal** φ_i . The goal is satisfied iff $\|\varphi_i\|_{\mathcal{H}}^{\mathcal{E}} \neq \emptyset$



Matei Popovici Temporal reasoning using temporal graphs

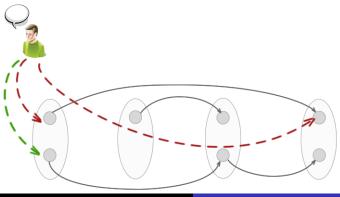
Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

Deviation: Is a player incentivised to **change** his action, given the actions of others ?



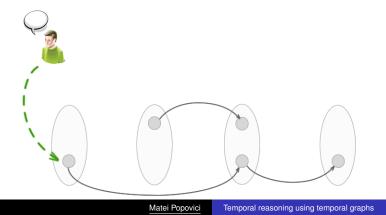
Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

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Temporal graphs and $L^*_{\mathcal{H}}$ in MAS

Deviation: Is a player incentivised to **change** his action, given the actions of others ?



Temporal graphs and $L_{\mathcal{H}}$ in MAS

- Remark: The goal satisfaction of a player is affected by what other players do
- *Question:* What is the **proper** action each player should take, in order to **satisfy his goal** ?

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Temporal graphs and $L_{\mathcal{H}}$ in MAS

An action profile (a_1, \ldots, a_n) is a:



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Temporal graphs and $L_{\mathcal{H}}$ in MAS

An action profile (a_1, \ldots, a_n) is a:

• Nash Equilibrium (NE) iff there is no individual player that can deviate

Temporal graphs and $L_{\mathcal{H}}$ in MAS

An action profile (a_1, \ldots, a_n) is a:

- Nash Equilibrium (NE) iff there is no individual player that can deviate
- Strong Nash Equilibrium (SNE) iff there is no coalition *C* of players that can jointly deviate

Temporal graphs and $L_{\mathcal{H}}$ in MAS

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Complexity results (for $L_{\mathcal{H}}$ with propositional symbols):

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• The verification problem:

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Temporal graphs and $L_{\mathcal{H}}$ in MAS

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Complexity results (for $L_{\mathcal{H}}$ with propositional symbols):

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- The synthesis problem: Σ_2 for NE and SNE

Applications of temporal graphs and $L_{\mathcal{H}}$

- Specifying time-dependent device behaviour in intelligent buildings
- Data mining logs from HPC systems
- Specifying optimal behaviour in MAS (Multi-Agent Systems)

Practical application: intelligent buildings

Specifying **time-dependent** device behaviour in intelligent buildings

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In it's initial phase, DSL was developed under the **FCINT POSCCE project** (Ontology-based Service Composition Framework for Syndicating Building Intelligence)



- **Temporal graphs** are suitable for storing information about the history of a domain
- The language $L_{\mathcal{H}}^*$ can be used to capture classes of system properties, that are involved in complex temporal relation.

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