

# On Decidability and Tractability of Querying in Temporal EL

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joint work with **Víctor Gutiérrez-Basulto and Jean Christoph Jung**  
(*Universität Bremen*)

## OBDA with Temporal Data

query  $q(x) = \text{RequiresBloodTest}(x, \text{today})$

ontology

$\text{Patient} \sqcap \bigcirc_P^5 \exists \text{vaccinated.LiveVirus} \sqsubseteq \text{ViableParticipant}$

$\text{Patient} \sqcap \text{RequiresBloodTest} \sqsubseteq \bigcirc_F^3 \text{RequiresBloodTest}$

ABox

$\text{Patient}(\text{john}, 21/04/16)$   
 $\text{RequiresBloodTest}(\text{john}, 18/04/16)$   
 $\text{vaccinated}(\text{john}, \text{measles}, 16/04/16)$   
 $\text{LiveVirus}(\text{measles}, 01/01/16)$   
...

mappings

timestamped data: vaccinations, blood tests, etc.

## Temporal $\mathcal{EL}$

concepts  $C, D ::= A \mid C \sqcap D \mid \exists r.C \mid \underbrace{\bigcirc_F C}_{\text{at the next moment}} \mid \underbrace{\bigcirc_P C}_{\text{at the previous moment}}$   
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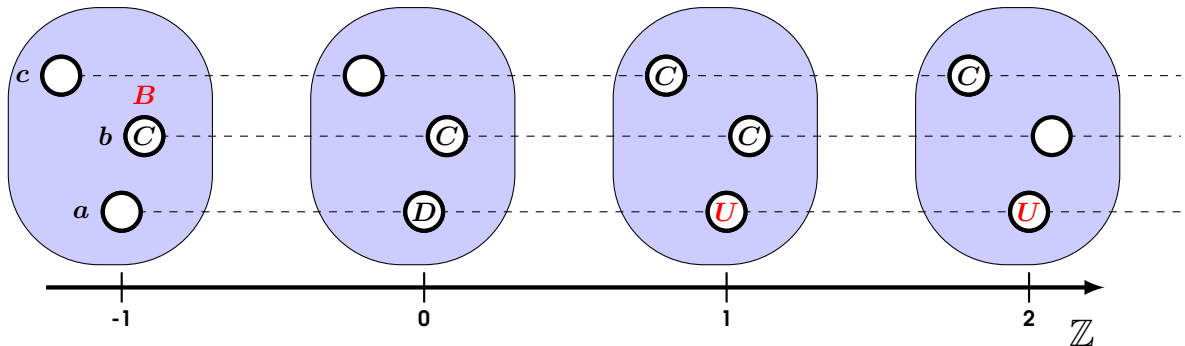
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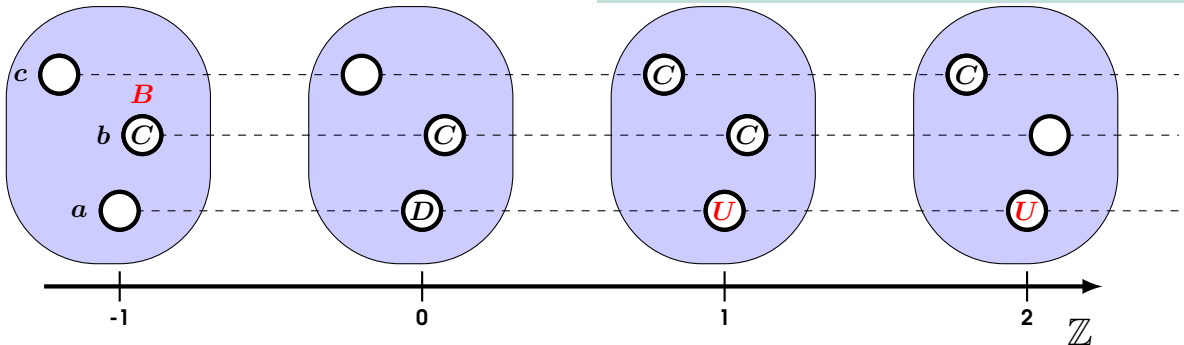
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**temporal atomic query**  $A(x, t)$       $A$  is a concept name

entailment for  $a \in \text{ind}(\mathcal{A})$  and  $i \in \mathbb{Z}$

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$$\mathcal{T}, \mathcal{A} \models A(a, i) \quad \text{iff} \quad \mathfrak{J} \models A(a, i), \quad \text{for all models } \mathfrak{J} \text{ of } \mathcal{T}, \mathcal{A}$$

**certain answers**  $(a, n) \in \text{ind}(\mathcal{A}) \times \underbrace{\text{tem}(\mathcal{A})}_{\min \mathcal{A} \leq n \leq \max \mathcal{A}}$  such that  $\mathcal{T}, \mathcal{A} \models A(a, n)$

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**Theorem** TAQ answering over full  $\mathcal{T}\mathcal{EL}$  is undecidable

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$\mathcal{TEL}^\circ$  is  $\mathcal{TEL}$  without  $\diamond_*$

**Theorem** TAQ answering over  $\mathcal{TEL}^\circ$  with functional roles  
is undecidable for data complexity

**Theorem** TAQ answering over  $\mathcal{TEL}^\circ$  with inverse roles  
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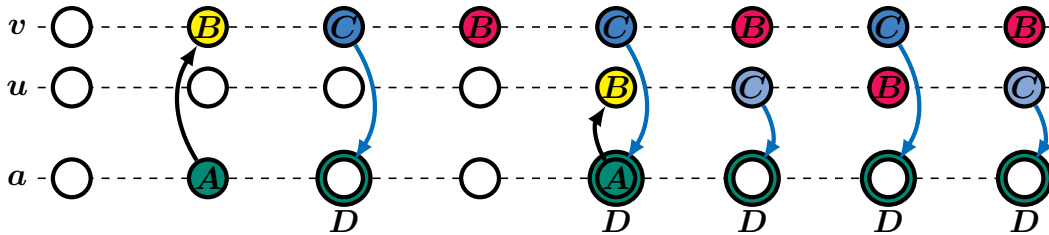
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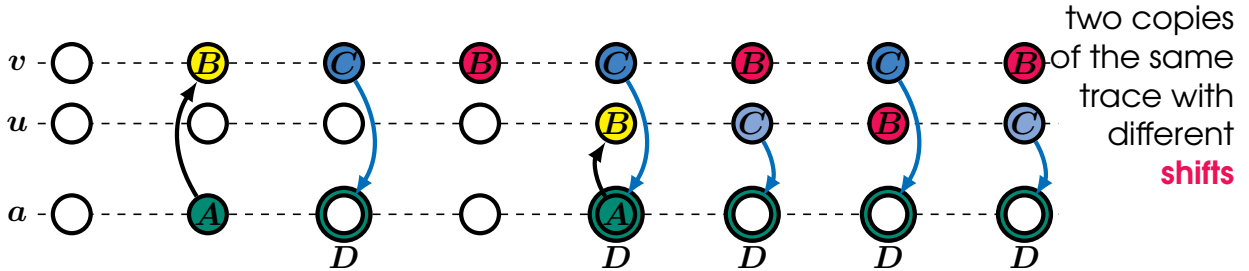
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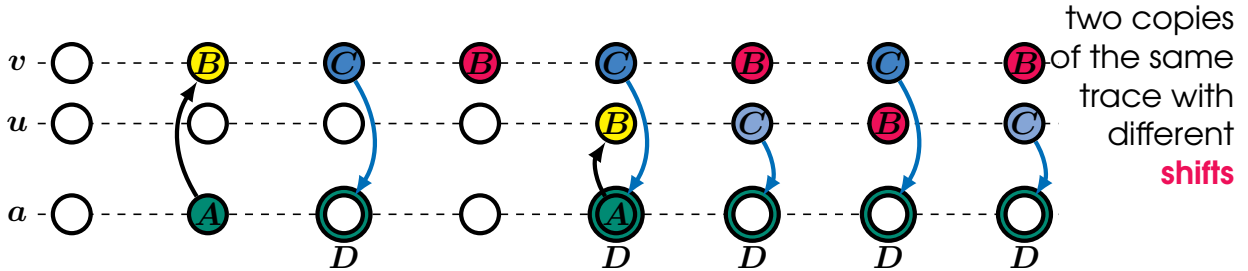


a trace is a map  $\pi: \mathbb{Z} \rightarrow \text{CN}$  that respects all  $A \sqcap A' \sqsubseteq B$  and  $\bigcirc_* B \sqsubseteq A$

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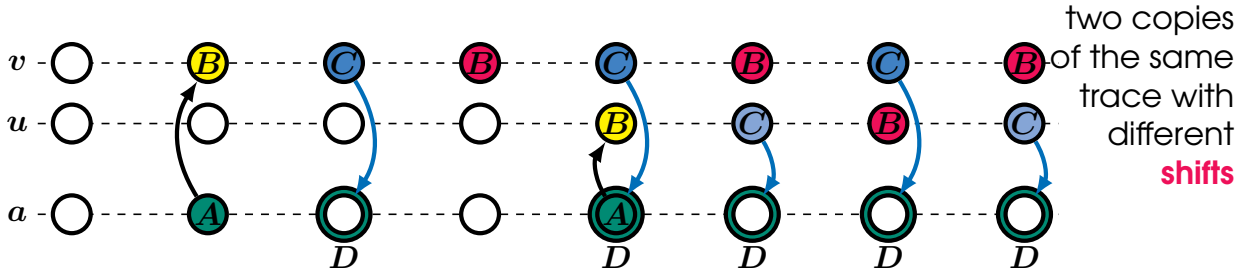
that contains the ABox  $\mathcal{A}$  in the  $\pi_a$  and  $B \in \pi_B(0)$

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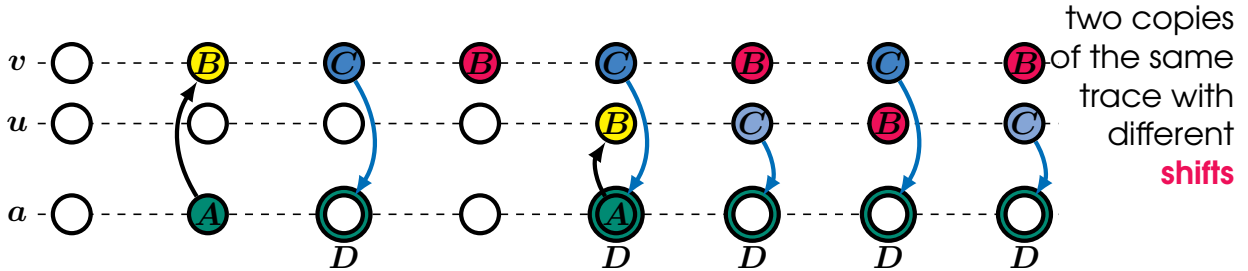
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**traces are infinite structures**

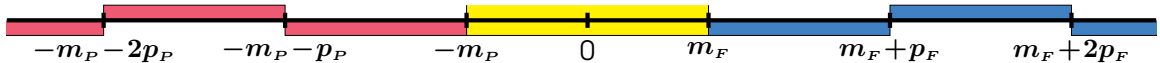
# Ultimate Periodicity

a quasimodel is **ultimately  $p$ -periodic** if

for each trace  $\pi$ , there are positive integers  $m_P, p_P, m_F, p_F \leq p$  such that

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rewriting into  $\text{DATALOG}_{1S}$   
 an extension of datalog with one successor function [Chomicki & Imielinski, 1988]

terms  $t + i$  and  $t - i$   
 for a 'temporal variable'  $t$  and  $i$  is a non-negative integer constant (encoded in unary)

$\text{DATALOG}_{1S}$  is **PSpace**-complete in data complexity  
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**are all  $\mathcal{TEL}^\circ$  TBoxes ultimately periodic?**

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**Theorem** TAQ answering over  $\mathcal{TEC}^0$  **without rigid roles** is  
**PSpace**-complete in combined and **PTime**-complete in data complexity  
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**Theorem** TAQ answering over  $\mathcal{TEC}^\circ$  **without rigid roles on the right of CIs** is  
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proof: rewriting into  $\text{DATALOG}_{1S}$

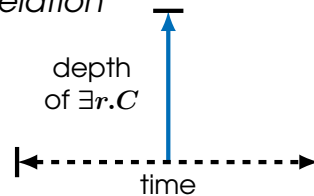
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acyclic TBoxes: definitions  $A \equiv C$  (the relation 'defined by' is acyclic)

**Theorem** TAQ answering over **acyclic**  $\mathcal{TEL}^0$  is in LOGTIME-uniform  $AC^0$  in data  
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proof: rewriting into FO with *one successor relation*

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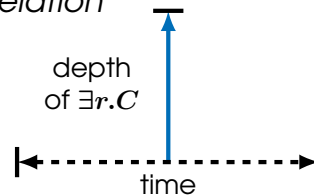
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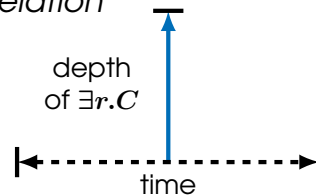
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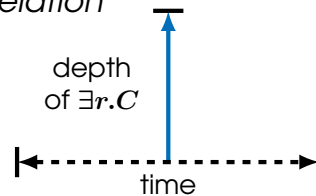
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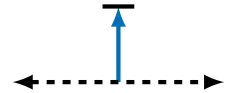
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**NB:** contains full  $\mathcal{EL}$



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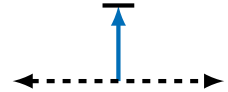
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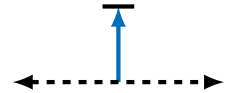
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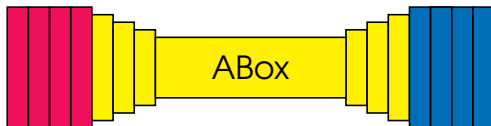
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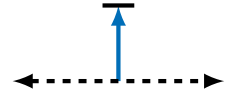
## Inflationary $\mathcal{TEL}$

$\mathcal{TEL}_{\text{infl}}^\diamond$  is  $\mathcal{TEL}$  without  $\circ_*$  but with  $\diamond_*$  on the **left-hand side** of CIs only  
similar to TQL for DL-Lite [Artale et al., 2013] and inflationary  $\text{DATALOG}_{1S}$  [Chomicki, 1990]

**Theorem** TAQ answering over  $\mathcal{TEL}_{\text{infl}}^\diamond$  is PTime-complete in both data and combined complexity



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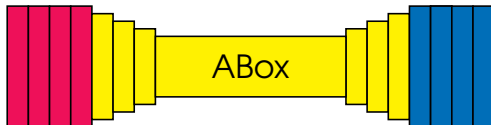
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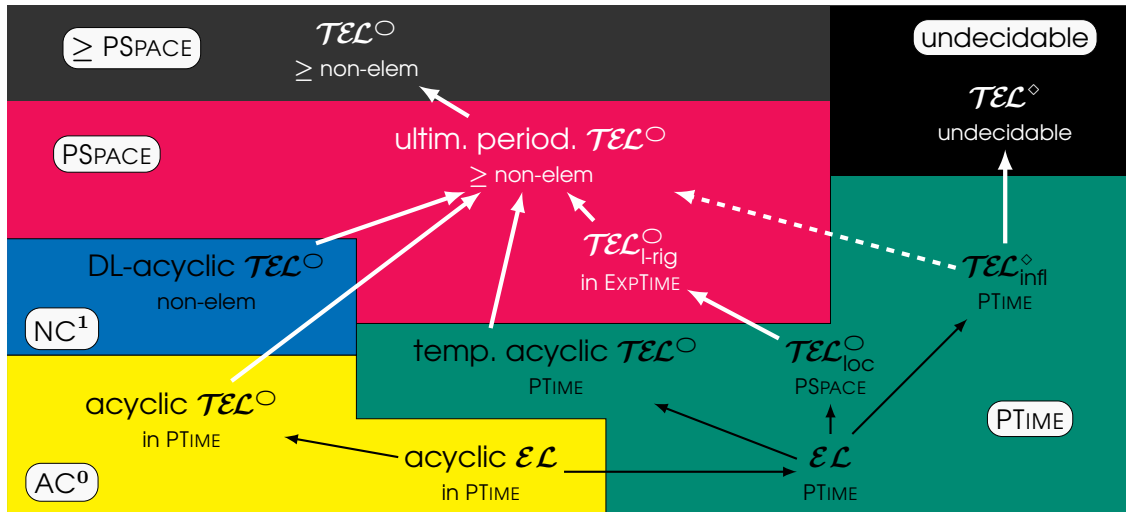
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**NB:** can express rigid concepts  $\diamond_P \diamond_F C \sqsubseteq C$

# Summary



- full  $\mathcal{TEL}^{\circ}$
- conjunctive queries
- binary representation of time instants / interval encoding, e.g.,  $A(a, [n_1, n_2])$