



# Querying the Unary Negation Fragment with Regular Path Expressions

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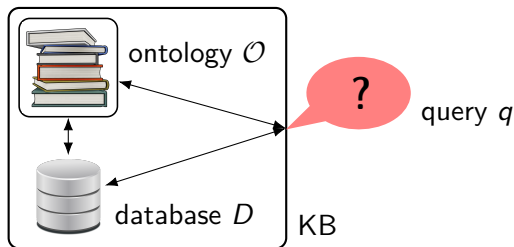
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ICDT 2018

27 March



# Ontology-mediated query answering



## Ontology-mediated query (OMQ):

triple  $Q = (\mathcal{O}, \Sigma, q)$  with  $\Sigma$  the data signature

## OMQ evaluation:

Given  $Q$  and  $D$  over  $\Sigma$ , does  $D \cup \mathcal{O} \models q$  hold?

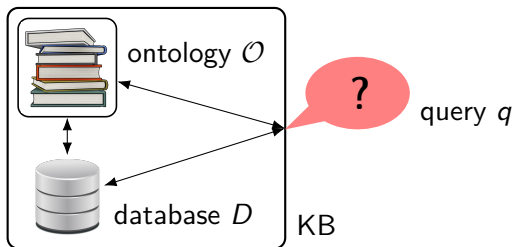
## OMQ containment $Q_1 \subseteq Q_2$ :

Given  $Q_1 = (\mathcal{O}_1, \Sigma, q_1)$  and  $Q_2 = (\mathcal{O}_2, \Sigma, q_2)$ ,

does  $D \cup \mathcal{O}_1 \models q_1$  imply  $D \cup \mathcal{O}_2 \models q_2$  for all  $D$  over  $\Sigma$ ?



# Ontology-mediated query answering



## Typical ontology languages:

- Description logics (DLs)
- Languages based on existential rules (aka Datalog+/-)

## Typical query languages: CQs, UCQs

OMQ evaluation in 2ExpTime (data complexity: coNP)



# Unary Negation and regular expressions

**We study:** an expressive language that subsumes

- popular ontology languages  
(including transitive roles and/or regular expressions on roles)
- popular query languages  
(U)CQs, (U)C2RPQs



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**UNFO<sup>reg</sup>** = UNFO + regular path expressions on binary relations

$$\varphi ::= P(\bar{x}) \mid x = y \mid \varphi \wedge \varphi \mid \varphi \vee \varphi \mid \exists x \varphi \mid \neg \varphi(x)$$



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$$E ::= R \mid R^- \mid E \cup E \mid E \cdot E \mid E^* \mid \varphi(x)?$$



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**UC2RPQ** = UCQ with atoms  $E(x, y)$  as above (UC2RPQs as tests)  
“union of conjunctive 2-way regular path queries”



# UNFO<sup>reg</sup>: a powerful language

UNFO<sup>reg</sup> can express ...

- many popular MLs and DLs  
(including transitive roles and/or regular expressions on roles)
- C2RPQs  $\rightsquigarrow$  queries are for free  
OMQ evaluation and containment reduce to (un)satisfiability:

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OMQ evaluation and containment reduce to (un)satisfiability:

- $D \cup \mathcal{O} \models q$  iff  $\mathcal{O} \wedge D \wedge \neg q$  is unsatisfiable
- $(\mathcal{O}, \Sigma_{\text{full}}, q_1) \subseteq (\mathcal{O}, \Sigma_{\text{full}}, q_2)$  iff  $\mathcal{O} \wedge q_1 \wedge \neg q_2$  is unsatisfiable

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# Our results

## Theorem 1

- (1) Satisfiability in  $\text{UNFO}^{\text{reg}}$  is 2ExpTime-complete.
- (2) Model checking is  $\text{P}^{\text{NP}[O(\log^2 n)]}$ -complete.

Same complexity as for UNFO [ten Cate & Segoufin, LMCS'13].



# Our results

## Theorem 1

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## Theorem 2

For OMQs with with  $\mathcal{O}$  in  $\text{UNFO}^{\text{reg}}$  and  $q$  UC2RPQ,

- (3) evaluation is  $2\text{ExpTime}$ -compl. (combined),  $\text{coNP}$ -compl. (data);
- (4) containment w.r.t.  $\Sigma_{\text{full}}$  is  $2\text{ExpTime}$ -complete.

$2\text{ExpTime}$  upper bounds follow from Theorem 1 (1).

All lower bounds inherited from  $(\mathcal{ALCT}, \text{CQ})$ .

[Lutz IJCAR'08; Calvanese et al. KR'06]



# Overview

- 1 Results for Satisfiability
- 2 Results for OMQ Evaluation & Containment
- 3 Conclusion and Outlook



# Next ...

- 1 Results for Satisfiability
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# Schedule

**We want to show:**

Lemma 3

Satisfiability in  $\text{UNFO}^{\text{reg}}$  is in  $2\text{ExpTime}$ .

## Previous approach for UNFO

Reduction to  $\mu$ -calculus [ten Cate & Segoufin, LMCS'13]

✗ Does not transfer to  $\text{UNFO}^{\text{reg}}$

## Our approach

- show tree-like model property:  $\text{treewidth} \leq \text{width}(\varphi)$
- represent tree-like models via labelled trees
- characterise satisfaction of C2RPQs in labelled trees via tree-shaped witnesses
- build automata that accept the tree-like models of the input fma.



# Normal form

UNFO<sup>reg</sup> formulas in **normal form**:

- connected C2RPQs with = 1 free variable and normal UNFO<sup>reg</sup> formulas  $\psi(x)$ ? as tests
- $\neg\varphi(x)$   $\varphi(x) \vee \psi(x)$   $\exists x \varphi(x)$

## Lemma 4

Every UNFO<sup>reg</sup> sentence can be transformed into an equivalent normal UNFO<sup>reg</sup> sentence  $\varphi'$  in exponential time.

- $|\varphi'|$  is exponential in  $|\varphi|$
- **Width** of  $\varphi'$  (max. number of variables in a sub-C2RPQ): linear!





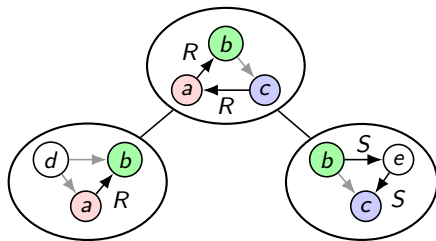
# Tree-like structures

**Tree-like structure of width  $m$ :** pair  $\mathfrak{T} = (T, \text{bag})$  where

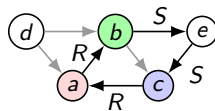
- $T$  is a tree
- $\text{bag}(w)$ ,  $w \in T$ : finite structure of domain size  $\leq m$  such that for every element  $a$ , the set of nodes containing  $a$  is connected

## Example

$\mathfrak{T}$  of width  $m = 3$ :



corresponding struc.  $\mathfrak{A}_{\mathfrak{T}}$ :



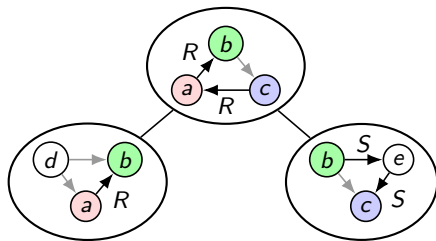
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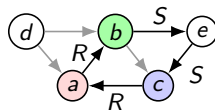
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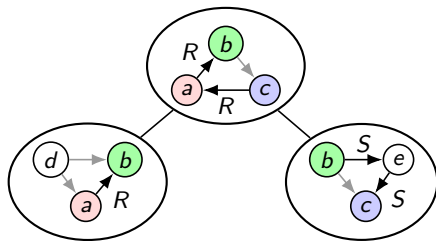
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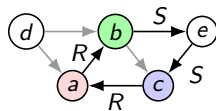
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because

$$\mathfrak{A}_{\mathfrak{T}} \models RS^*R(a, a)$$



# Type-decorated tree-like structures

Fix  $\text{UNFO}^{\text{reg}}$  formula  $\varphi_0$ .

Replace regular atoms  $E(x, y)$  with atoms  $\mathcal{A}(x, y)$ ,  $\mathcal{A}$  an NFA.

**Type-decorated tree-like structure (TDTLS) for  $\varphi_0$ :** pair  $(\mathfrak{T}, \tau)$  s.t.

- $\mathfrak{T}$  is a tree-like structure
- $\tau$  assigns a 1-type  $t(x) \subseteq \text{cl}(\varphi_0)$  to each element in  $\mathfrak{A}_{\mathfrak{T}}$

Satisfaction for regular atoms  $(\mathfrak{T}, \tau) \models \mathcal{A}(a, b)$  is defined via “looking up” tests  $\varphi(a)$ ? directly in  $\tau(a)$



# Proper TDTLSs

Labelling  $\tau$  must be “globally” consistent with all  $\exists$ - and C2RPQ-subformulas of  $\varphi_0$ :

**A TDTLS is proper if**

- (1)  $\exists x \varphi(x) \in \tau(a)$  are witnessed by  $\varphi(x) \in \tau(b)$  for some  $b$
- (2) C2RPQs in  $\tau(a)$  are witnessed by homomorphisms into  $(\mathcal{T}, \tau)$



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Let  $\varphi_0$  be a normal UNFO<sup>reg</sup> sentence.

$\varphi_0$  is satisfiable iff there is a proper TDTLS  $(\mathcal{T}, \tau)$  for  $\varphi_0$   
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**of outdegree  $O(n^2)$**  s.t.  $\varphi_0 \in \tau(a)$  for some  $a$ .



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**Lemma 5 (Tree-like model property of UNFO<sup>reg</sup>)**

Let  $\varphi_0$  be a normal UNFO<sup>reg</sup> sentence **of size  $n$  and width  $m$** .

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**of outdegree  $O(n^2)$  and width  $\leq m$**  s.t.  $\varphi_0 \in \tau(a)$  for some  $a$ .





# Automata-based decision procedure

Use 2-way alternating tree automata (**2ATAs**)

$\mathcal{A}$  accepts input  $(\mathfrak{T}, \tau)$  iff  $\mathfrak{T}$  proper and  $\varphi_0 \in \tau(a)$  for some  $a$

Then:  $\varphi_0$  satisfiable iff  $L(\mathcal{A}) \neq \emptyset$

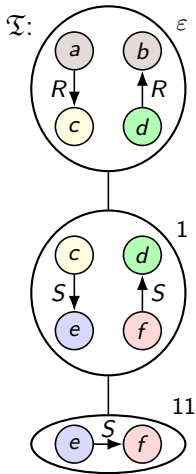
**Problem:** How can  $\mathcal{A}$  check Condition (2) of properness?

(2) C2RPQs in  $\tau(a)$  are witnessed by homomorphisms into  $(\mathfrak{T}, \tau)$   
**need not be local!**



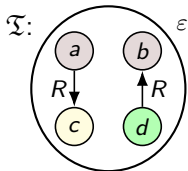
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Example: C2RPQ  $\mathcal{A}(x, y)$  with  $\mathcal{A} = \rightarrow q_0 \xrightarrow{R} q_1 \xrightarrow{R} q_2$

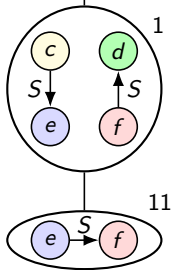


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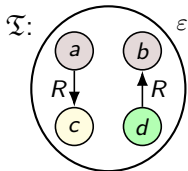


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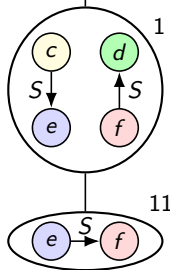
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$\mathcal{A}[q_0, q_1](a, c) \wedge \mathcal{A}[q_1, q_2](d, b) \wedge$

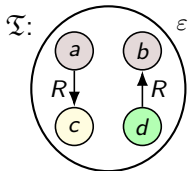
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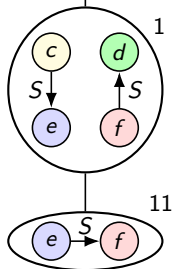
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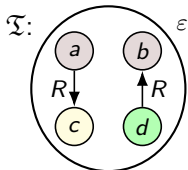


Subdivision into  $O(|\varphi_0|^2)$  atoms suffices



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(2) Split the resulting set of atoms

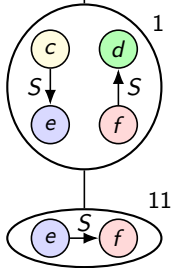
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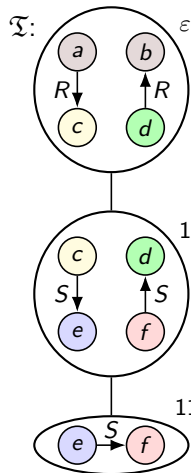
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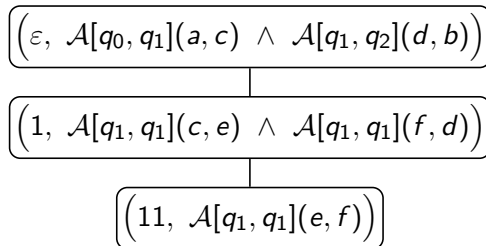
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**Resulting witness tree:**



# Automata-friendly properness condition

**Good news:**

**Lemma 6**

Subdivisions and splittings introduce at most exponentially many new sub-C2RPQs.

Condition (2) of properness is equivalent to:

**(2')** C2RPQs in  $\tau(a)$  are witnessed by witness trees in  $(\mathcal{T}, \tau)$

$\leadsto$  construct 2ATA with exponentially many states





# Next ...

- 1 Results for Satisfiability
- 2 Results for OMQ Evaluation & Containment**
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# Overview

We want to show:

Lemma 7

OMQ evaluation is in coNP (data complexity).

**Observation:**  $D \cup \mathcal{O} \models q$  iff  $\underbrace{D \text{ is unsatisfiable with } \mathcal{O} \wedge \neg q}$

Lemma 8

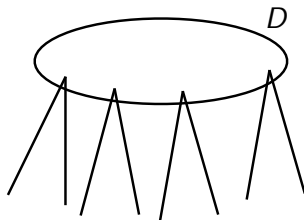
Satisfiability of databases with UNFO<sup>reg</sup> sentences is in NP.



# Database satisfiability in NP

Fix  $\text{UNFO}^{\text{reg}}$  sentence  $\varphi_0$  and database  $D$

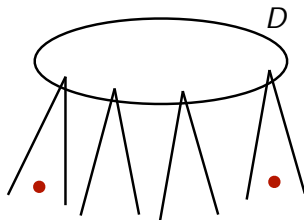
**Idea:** guess & check consistent decoration of  $\text{dom}(D)$  with 1-types



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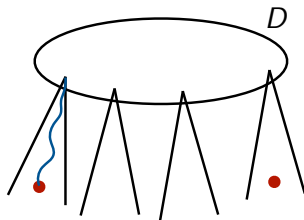
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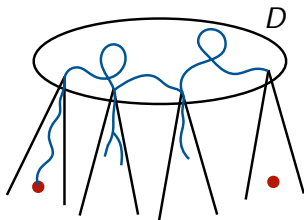
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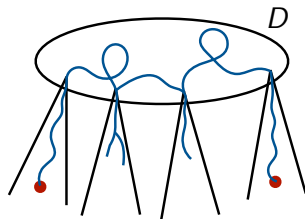
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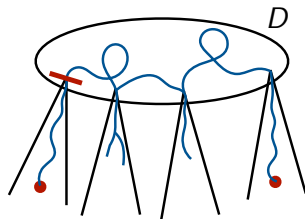
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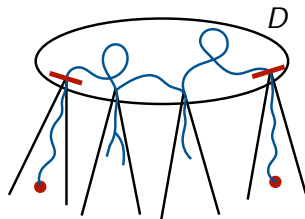




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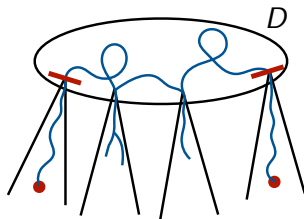
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$\leadsto$  3-subdivisions of regular atoms  $\mathcal{A}(x, y)$  suffice



# Database satisfiability in NP

Type decoration  $\tau$  is **proper** if

- each  $\tau(a)$  is satisfiable
- similar conditions as (1) and (2) for proper TDTLSs

## Lemma 9

$D$  is satisfiable with  $\varphi_0$  iff  $D$  has a proper type decoration  $\tau$  with  $\varphi_0 \in \tau(a)$  for some  $a \in \text{dom}(D)$ .

$\rightsquigarrow$  **NP decision procedure:**

- Guess candidate decoration
- Precompute satisfaction of all regular atoms
- Verify properness



# Next ...

- 1 Results for Satisfiability
- 2 Results for OMQ Evaluation & Containment
- 3 Conclusion and Outlook**



# Conclusion



**UNFO<sup>reg</sup> is computationally well-behaved:**

- SAT and model checking are not harder than in UNFO.
- OMQ evaluation and OMQ containment for (UNFO<sup>reg</sup>, C2RPQ) are not harder than for ( $\mathcal{ALCI}$ , CQ).



# Outlook



- Finite-model variants of SAT and OMQ evaluation
- Extensions:
  - Base case in regular path expressions with *any* UNFO<sup>reg</sup> formula  $\varphi(x, y)$  instead of  $R(x, y)$   $\rightsquigarrow$  contains ICPDL
  - Replace C2RPQs with linear Datalog
  - Add constants, fixed points, role inclusions . . . (“DL world”)
- OMQ containment, general case:  $(\mathcal{O}_1, \Sigma, q_1) \stackrel{?}{\subseteq} (\mathcal{O}_2, \Sigma, q_2)$



# Outlook



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# Thank you.

