

Static Analysis and Optimization of Semantic Web Queries

Andrés Letelier Jorge Pérez Reinhard Pichler Sebastian Skritek

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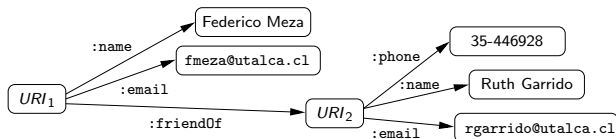
RDF data model for the Semantic Web

SPARQL query language for RDF (W3C initiatives)

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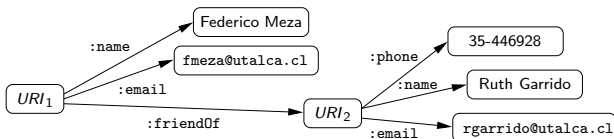


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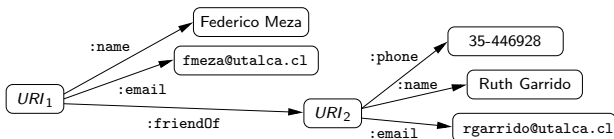
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SPARQL static query analysis

have been hardly considered so far

- ▶ Foundations of SPARQL have been laid
- ▶ Optimization rules have been proposed

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But we lack sound and complete SPARQL static analysis results in the spirit of *C&M-77* for CQs

Our goals:

- ▶ Static analysis of SPARQL
- ▶ Apply CQ tractable results to SPARQL

Main contributions

Conceptual contribution: *Pattern trees*

- ▶ Tree representation for a fragment of SPARQL graph patterns
- ▶ First step towards an algebra for SPARQL *query plans*

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Technical contributions:

- ▶ Homomorphism-based redundancy elimination and equivalence
- ▶ Complexity of testing equivalence (NP) and subsumption (Π_2^P)
- ▶ Tractable enumeration & complexity of counting

Static Analysis and Optimization of Semantic Web Queries

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Outline

Basics of SPARQL graph patterns

Pattern trees

- Transformation rules

- Normal forms

Subsumption & equivalence

Enumeration & counting

Conclusions

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In general, in a query we have:

$$H \leftarrow P$$

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- ▶ Body: pattern matching expression (graph patterns)

We focus on P

(i.e. we do not consider projection)

Graph patterns: interesting features of pattern matching on graphs

- ▶ Conjunctions

```
{ P1 .  
  P2 }
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- ▶ Grouping

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  P2 }  
  
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    P4 }  
  
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Graph patterns: interesting features of pattern matching on graphs

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- ▶ Grouping
- ▶ **Optional parts**

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{ { P1 .  
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  OPTIONAL { P5 } }  
  { P3 .  
    P4  
    OPTIONAL { P7 } }  
}
```

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```

UNION

```
{ P9 }
```

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- ▶ **Filtering**

```
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{ P9 FILTER ( R ) }
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Graph patterns: interesting features of pattern matching on graphs

- ▶ Conjunctions
- ▶ Grouping
- ▶ Optional parts
- ▶ Nesting of optionals
- ▶ Union of patterns
- ▶ Filtering
- ▶ ...
- ▶ new version: regular expressions, federated queries, sub-queries, etc.

```
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A standard algebraic syntax

- ▶ Triple patterns: just triples + variables ($?X, ?Y, \dots$)

```
?X :name "john"
```

```
(?X, name, john)
```

- ▶ Graph patterns: algebraic expressions over triple patterns

```
{ P1 . P2 }
```

```
( P1 AND P2 )
```

```
{ P1 OPTIONAL { P2 } }
```

```
( P1 OPT P2 )
```

```
{ P1 } UNION { P2 }
```

```
( P1 UNION P2 )
```

```
{ P1 FILTER ( R ) }
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```
( P1 FILTER R )
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original SPARQL syntax

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A standard algebraic syntax

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$(?X, \text{name}, \text{john})$

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`{ P1 . P2 }`

$(P_1 \text{ AND } P_2)$

`{ P1 OPTIONAL { P2 } }`

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`{ P1 FILTER (R) }`

$(P_1 \text{ FILTER } R)$

original SPARQL syntax

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Evaluating SPARQL patterns: a simple example

Evaluation formalized in terms of (*partial*) mappings

$$\mu : \text{Variables} \longrightarrow \text{RDF-Terms}$$

Example

$(R_1, \text{name}, \text{john})$

$(R_1, \text{email}, \text{J@ed.ex})$

$(R_2, \text{name}, \text{paul})$

$(R_3, \text{name}, \text{ringo})$

$(R_3, \text{email}, \text{R@ed.ex})$

$(R_3, \text{wPage}, \text{w3.rin.ed})$

$((?X, \text{name}, ?Y) \text{ OPT } (?X, \text{wPage}, ?W))$

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Optional parts lead to high complexity of evaluation

Evaluation for the AND-OPT fragment is PSPACE-complete

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↑

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[PAG09] evaluation for the well-designed fragment is *coNP*

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- Normal forms

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Extending CQs to capture SPARQL graph patterns

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Idea

Represent AND-OPT patterns as an extension of CQs:

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- ▶ nodes representing conjunctions of triple patterns (CQs)
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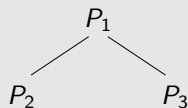
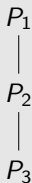
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Pattern Trees

Pattern tree example

Intuition



$$\left(P_1 \text{ OPT } (P_2 \text{ OPT } P_3) \right)$$

$$\left((P_1 \text{ OPT } P_2) \text{ OPT } P_3 \right)$$

Quasi-well designed pattern trees (QWDPTs)

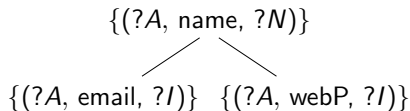
Definition

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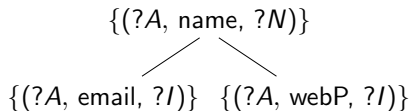


non QWDPT (because of $?I$)

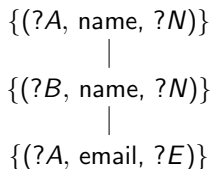
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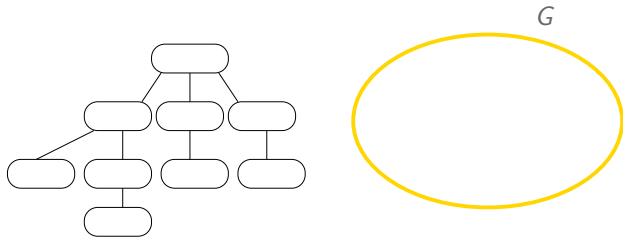


QWDPT

Top-down evaluation of pattern trees

QWDPTs allow for a *natural evaluation* from the root to the leaves:

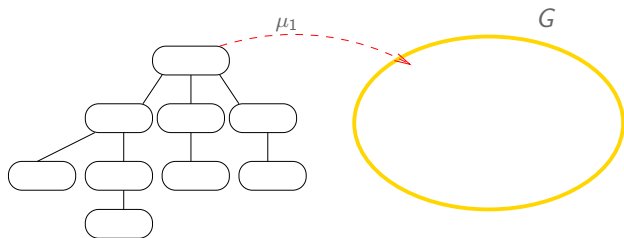
- ▶ compute a mapping for a given node
- ▶ then try to extend it with the evaluation of its children
- ▶ stop in a branch if no further extension is possible



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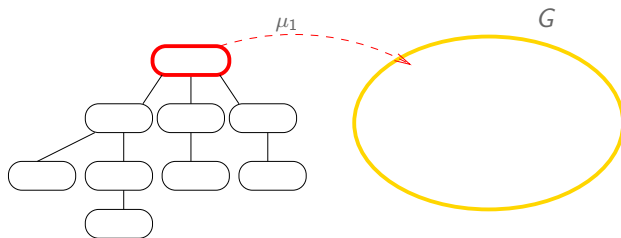
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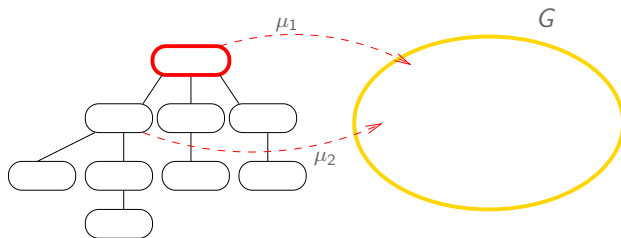
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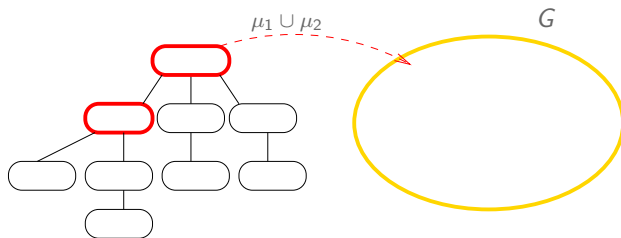
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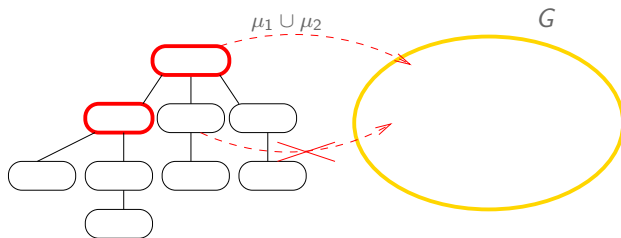
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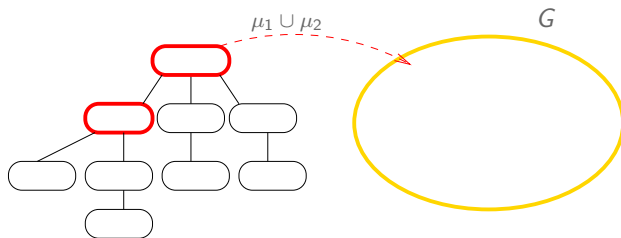
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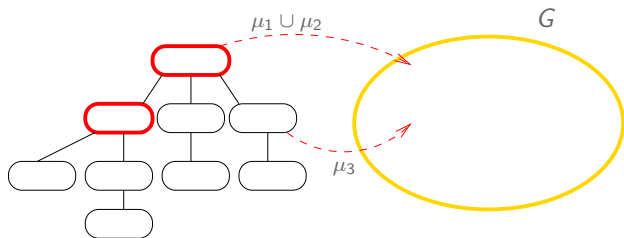
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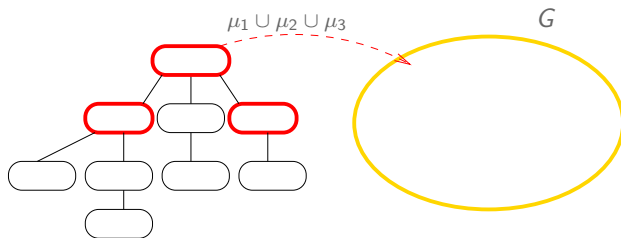
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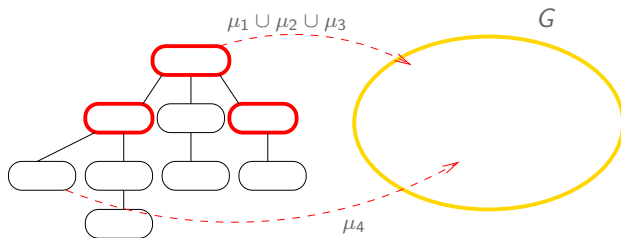
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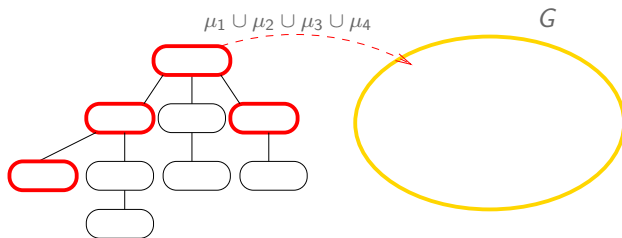
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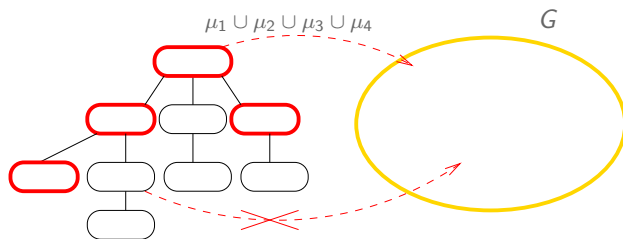
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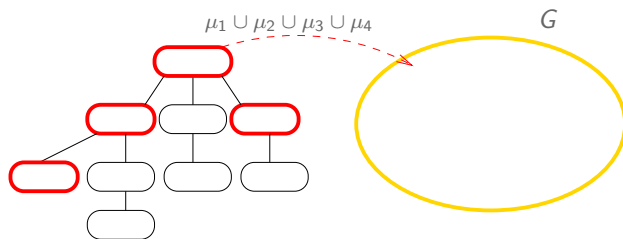
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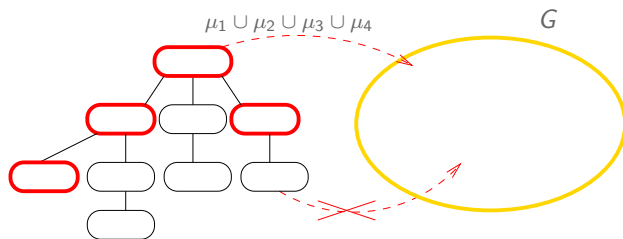
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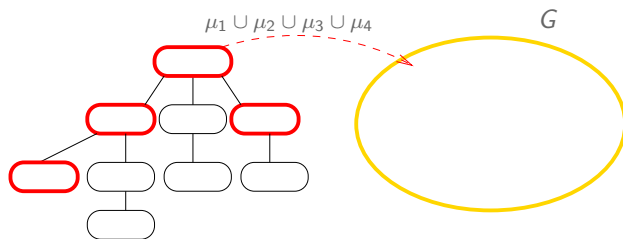
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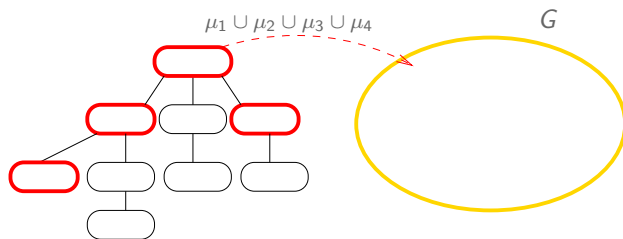
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$\mu_1 \cup \mu_2 \cup \mu_3 \cup \mu_4$ is a solution over G

QWDPTs represent well-designed SPARQL graph patterns

Theorem

*For every well-designed pattern P there exists a QWDPT \mathcal{T} s.t.
top-down evaluation of $\mathcal{T} \equiv$ algebraic evaluation of P*

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Moreover, we can go from one representation into the other in polynomial time

Outline

Basics of SPARQL graph patterns

Pattern trees

- Transformation rules

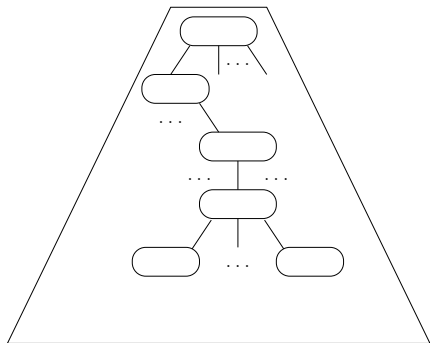
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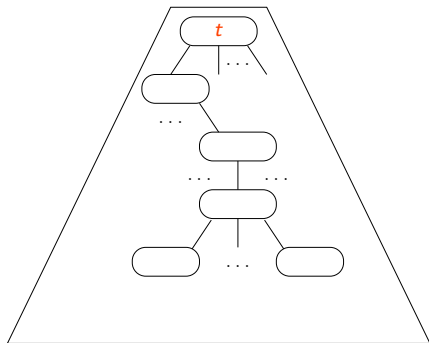
Conclusions

Transformation rules: deleting redundant triples



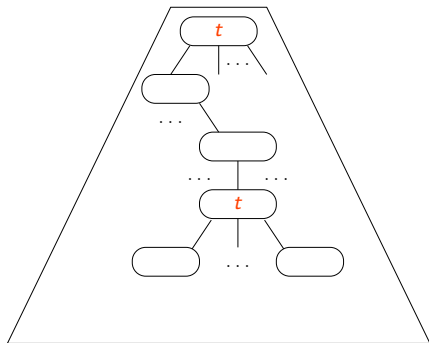
R1: If a triple pattern t belongs to node n

Transformation rules: deleting redundant triples



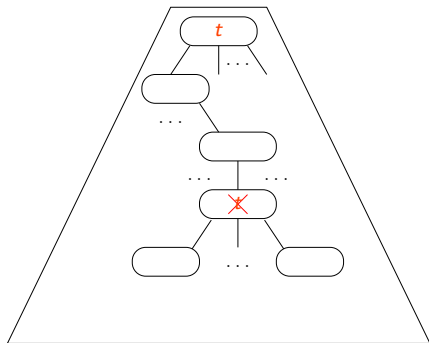
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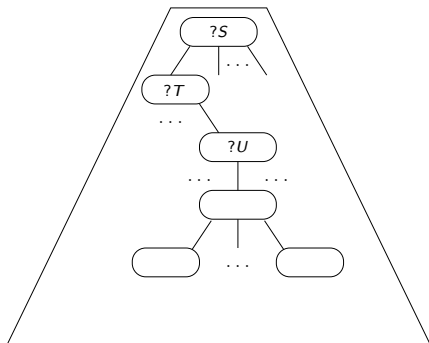
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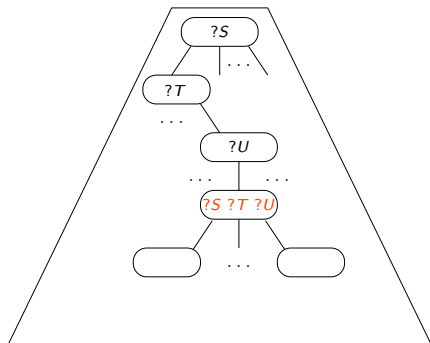
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Transformation rules: deleting redundant nodes



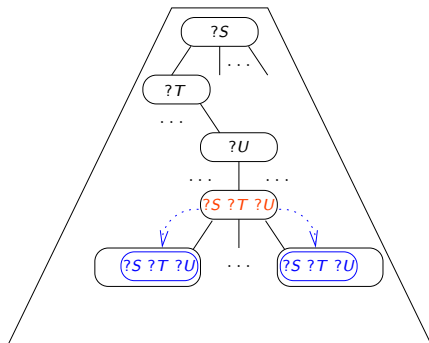
R2: If node n

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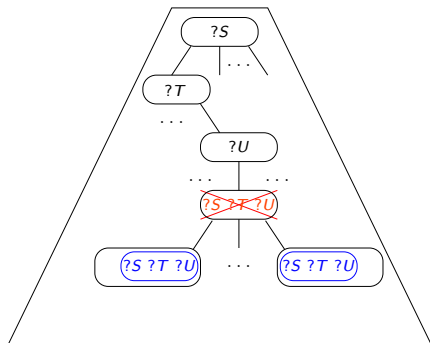
R2: If node n does not introduce any new variable w.r.t. its ancestors,

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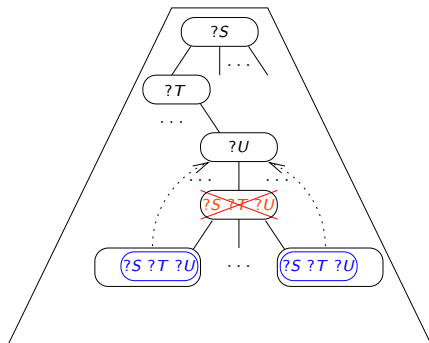
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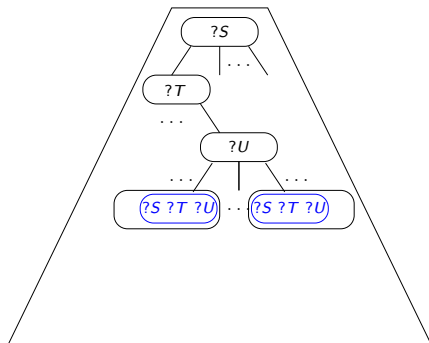
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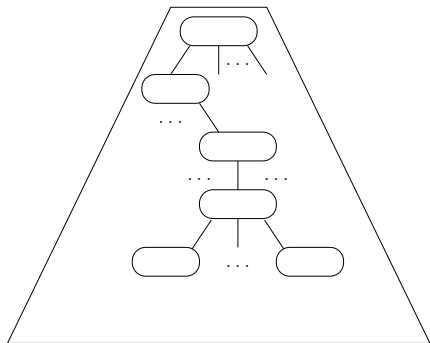
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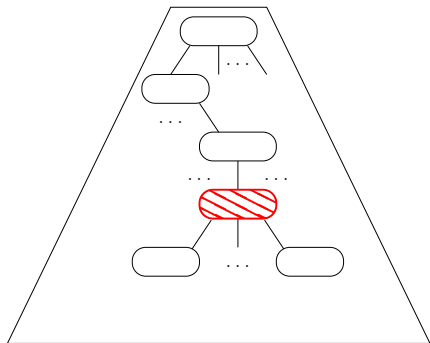
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Transformation rules: homomorphism upwards



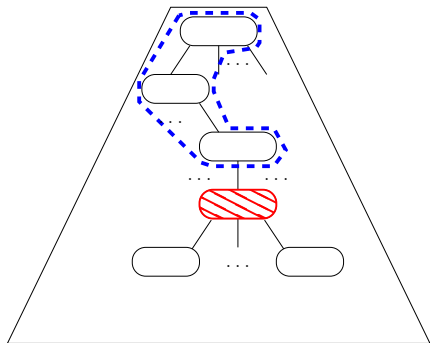
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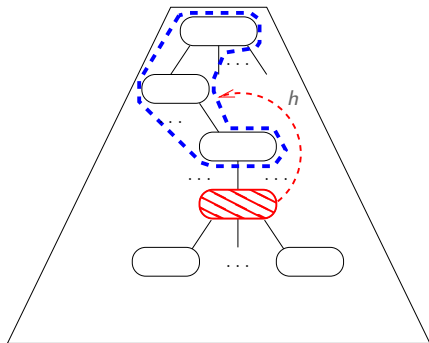
R3: If there is a *homomorphism* from node n

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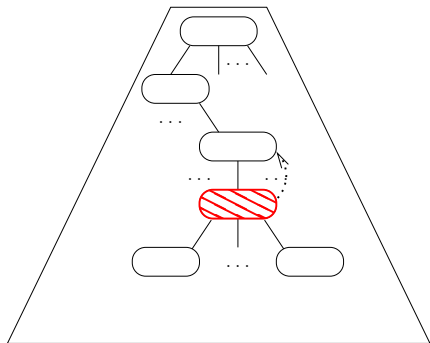
R3: If there is a *homomorphism* from node n to the branch of ancestors of n ,

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Normal forms

NR-normal-form: Apply R1 and R2 in any order

R3-normal-form: Apply R3 to pattern trees in NR-normal-form

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Impact for optimization

Rules application *eliminate optional parts*

Also useful when testing equivalence of QWDPT

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Subsumption

Definition

Mapping μ_1 is *subsumed* by μ_2 , denoted by $\mu_1 \sqsubseteq \mu_2$, if μ_2 extends μ_1 with more variable bindings

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\mathcal{T}_1 is *subsumed* by \mathcal{T}_2 , denoted by $\mathcal{T}_1 \sqsubseteq \mathcal{T}_2$, if for ever G

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\sqsubseteq is a natural notion of *containment* for SPARQL

$(?X, \text{name}, ?N) \sqsubseteq ((?X, \text{name}, ?N) \text{ OPT } (?X, \text{email}, ?E))$

Subsumption is Π_2^P -complete

Theorem

$\mathcal{T}_1 \sqsubseteq \mathcal{T}_2$ iff for every subtree \mathcal{T}'_1 of \mathcal{T}_1 there exists a subtree \mathcal{T}'_2 of \mathcal{T}_2 , and a homomorphism from triples in \mathcal{T}'_2 to triples in \mathcal{T}'_1 (which is the identity over variables in \mathcal{T}'_1)

$\{(?A, \text{name}, ?N), (?A, \text{email}, ?E)\}$

$\{(?A, \text{webP}, ?W)\}$

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Checking subsumption of QWDPTs is Π_2^P -complete

Equivalence & subsumption

Pattern trees \mathcal{T}_1 and \mathcal{T}_2 are equivalent, denoted by $\mathcal{T}_1 \equiv \mathcal{T}_2$ if they give the same result evaluated over every RDF graph

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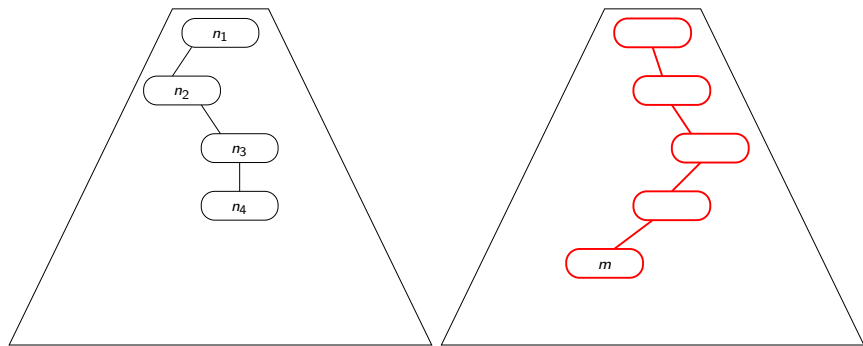
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This gives us with a Π_2^P equivalence test, but we can do better!

Strong homomorphisms: key concept for equivalence test

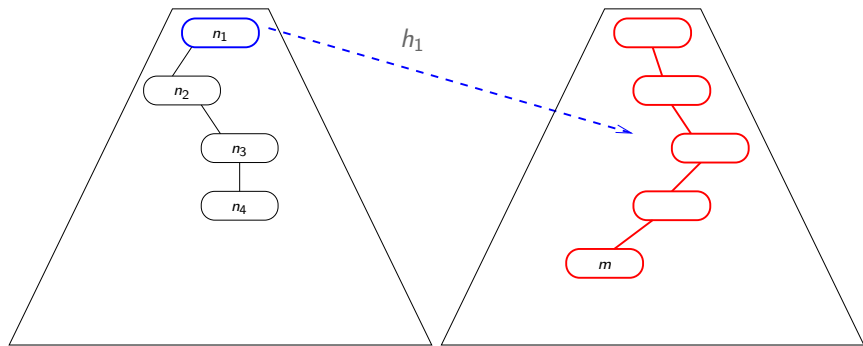
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h_i is the identity over variables not introduced in n_i

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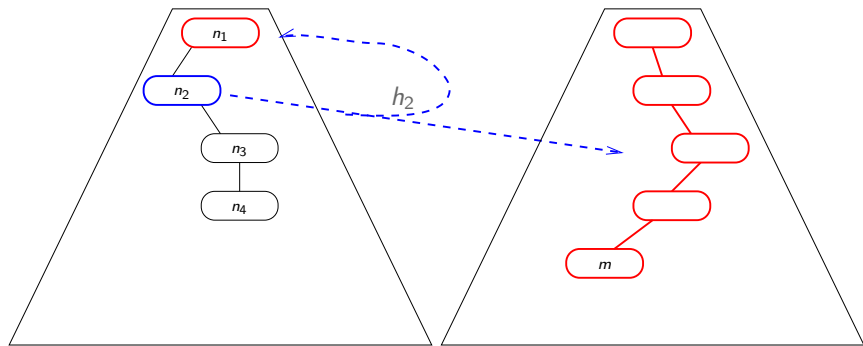
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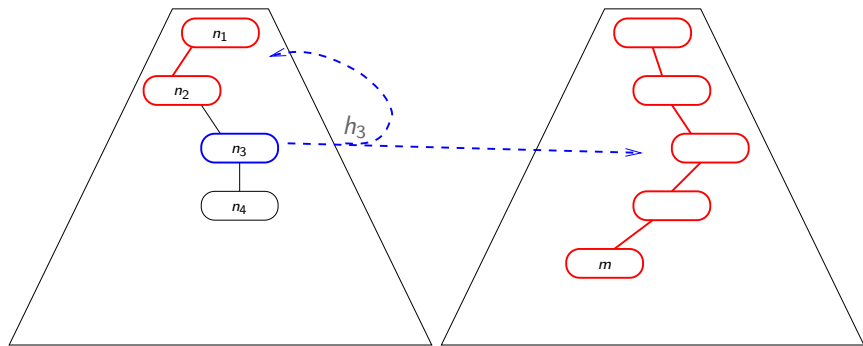
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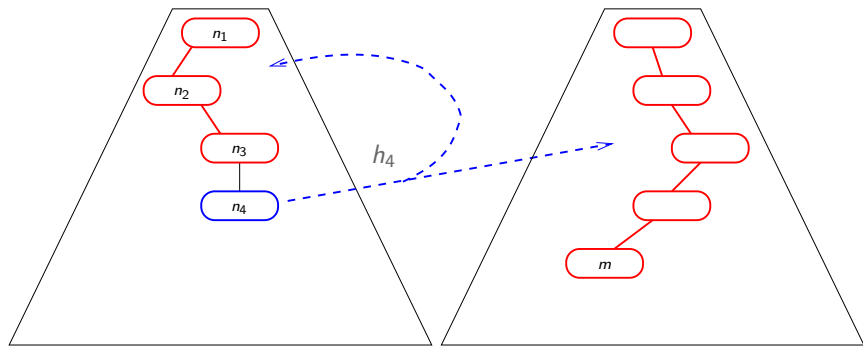
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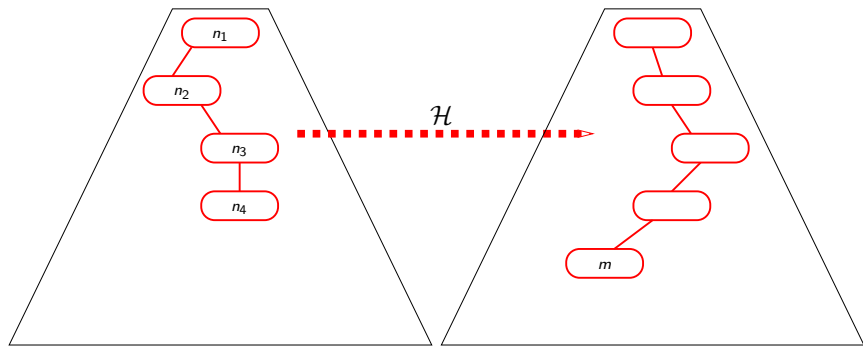
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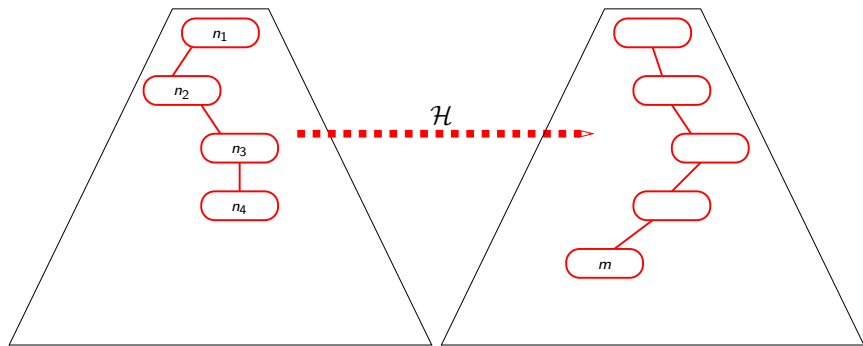


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Strong homomorphisms in both direction:

strongly homomorphically equivalent branches

Equivalence is NP-complete

Theorem

QWDPTs \mathcal{T}_1 and \mathcal{T}_2 in R3-normal form are equivalent iff

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- ▶ Counting: *no* :-(
 - #*coNP* in general
 - #*P*-hard even if every node is an acyclic CQ

Concluding remarks

Evaluation of SPARQL graph patterns via pattern trees

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Future work

- ▶ include more features (projection, union)
- ▶ more transformation rules
- ▶ tests and empirical results

Static Analysis and Optimization of Semantic Web Queries

Andrés Letelier Jorge Pérez Reinhard Pichler Sebastian Skritek

PUC Chile Universidad de Chile TU Vienna