Ontology-based Data Access: Theory and Practice

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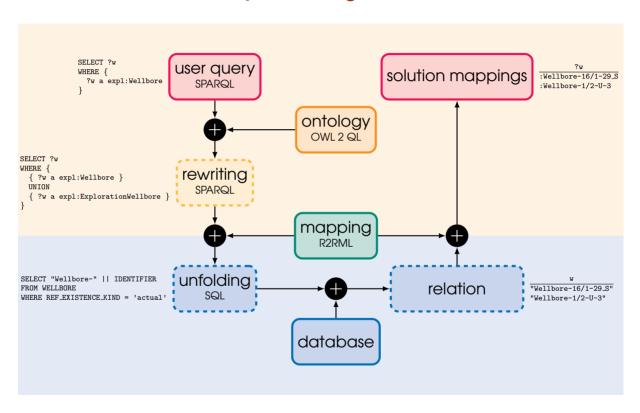
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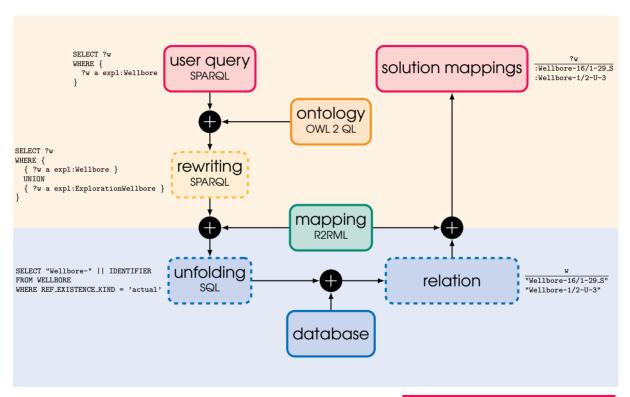
Birkbeck, University of London

http://ontop.inf.unibz.it/ijcai-2018-tutorial

Query Answering in OBDA



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an OBDA specification $\mathcal{P} = (\mathcal{O}, \mathcal{M}, \mathcal{S})$

 \mathcal{O} an ontology (class and property inclusions / tgds)

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 $\mathcal I$ is a model of $(\mathcal P,\mathcal D)$ if it satisfies all axioms in $\mathcal O$ and contains all $\mathcal M(\mathcal D)$

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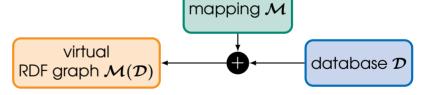
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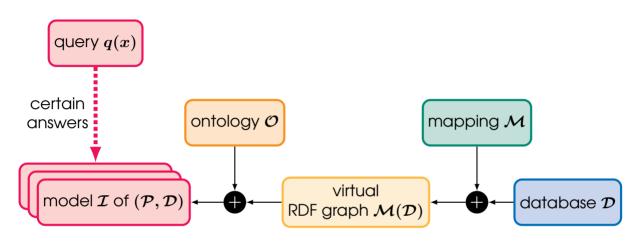
 $\mathcal{M}(\mathcal{D})$ is a set of atoms in the signature of \mathcal{O}

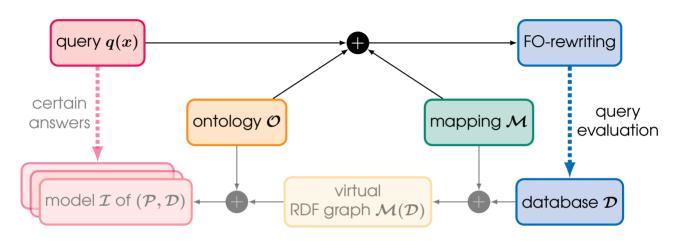


 $\mathcal I$ is a model of $(\mathcal P,\mathcal D)$ if it satisfies all axioms in $\mathcal O$ and contains all $\mathcal M(\mathcal D)$

a tuple a of constants in ${\mathcal D}$ is a **certain answer** to a query q(x) over $({\mathcal P},{\mathcal D})$ if

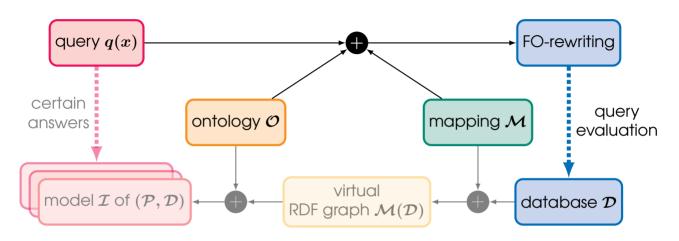
 $\mathcal{I} \models q(a)$ for every model \mathcal{I} of $(\mathcal{P}, \mathcal{D})$





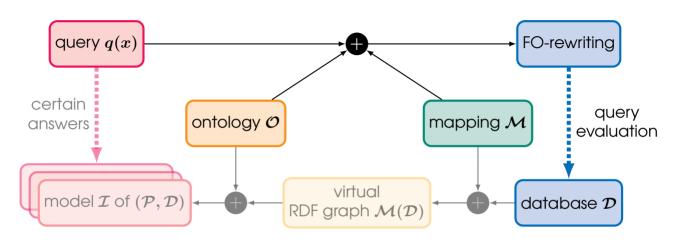
q'(x) is an <code>FO-rewriting</code> of q(x) with respect to ${\mathcal P}$ if, for every ${\mathcal D}$,

certain answers to q(x) over $(\mathcal{P},\mathcal{D})$ = answers to q'(x) over \mathcal{D}



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evaluating a fixed FO-query over databases \mathcal{D} is in AC^0 (data complexity)



q'(x) is an FO-rewriting of q(x) with respect to $\mathcal P$ if, for every $\mathcal D$, certain answers to q(x) over $(\mathcal P,\mathcal D)$ = answers to q'(x) over $\mathcal D$

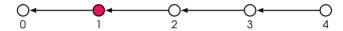
evaluating a fixed FO-query over databases \mathcal{D} is in AC⁰ (data complexity) so, the **certain answers problem** should also be in AC⁰ for data complexity

NB: AC⁰ = circuits of constant depth with AND/OR gates of unbounded fan-in

the **certain answers problem** should also be in AC⁰ for data complexity

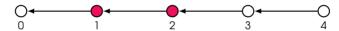
the **certain answers problem** should also be in AC⁰ for data complexity

1 ontology $\{\exists R.A \sqsubseteq A\} \Rightarrow \mathsf{NL} ext{-hard}$ certain answers problem for A(x) (in data complexity) R is a directed graph,



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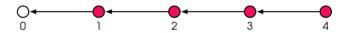
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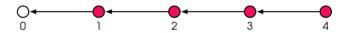
and A 'labels' all vertices inverse-reachable in R from other A-labelled vertices



2 ontology $\{\exists R_1.A \sqcap \exists R_2.A \sqsubseteq A\} \Rightarrow$ PTIME-hard certain answers problem for A(x) (in data complexity)

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ontology $\{\exists R.A \sqsubseteq A\} \Rightarrow \mathsf{NL} ext{-hard}$ certain answers problem for A(x) (in data complexity)

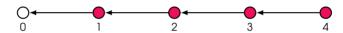


- 2 ontology $\{\exists R_1.A \sqcap \exists R_2.A \sqsubseteq A\} \Rightarrow$ PTIME-hard certain answers problem for A(x) (in data complexity) Circuit Value Problem or Path System Accessibility
- 3 ontology $\{A \sqsubseteq A_1 \sqcup A_2\} \Rightarrow {\sf CONP ext{-}hard}$ certain answers problem for q_{2+2} (in data complexity) Boolean Satisfiability (2+2CNF)

the **certain answers problem** should also be in AC⁰ for data complexity

ontology $\{\exists R.A \sqsubseteq A\} \Rightarrow \mathsf{NL} ext{-hard}$ certain answers problem for A(x) (in data complexity)

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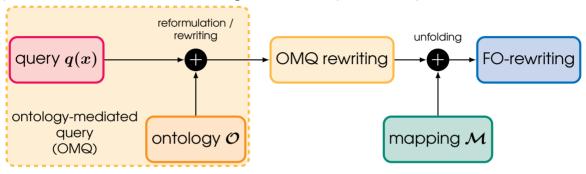


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- 3 ontology $\{A \sqsubseteq A_1 \sqcup A_2\} \Rightarrow \text{CONP-hard}$ certain answers problem for q_{2+2} (in data complexity)
- 4 sameAs(a,b) \Rightarrow **L-hard** certain answers problem for A(x) (in data complexity)

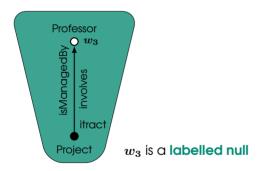
 ${\sf NB}{:}\;{\sf AC}^{\bf 0}\subsetneq {\sf L}\subseteq {\sf NL}\subseteq {\sf PTIME}\subseteq {\sf CONP}$

OBDA Query Answering in Practice

split construction of FO-rewritings into two separate steps:



if $\mathcal D$ contains Project(itract), then **any model** of $(\mathcal O,\mathcal D)$ will have a fragment similar to



let \mathcal{O} contain RA \square \exists worksOn.Project

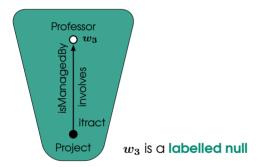
Project □ ∃isManagedBy.Professor

worksOn[−] □ involves isManagedBy

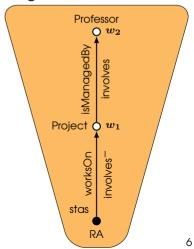
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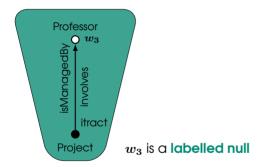
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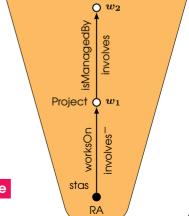
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Professor

if \mathcal{O} is Horn (does not contain any disjunctions), then

certain answers to q(x) over $(\mathcal{O}, \mathcal{D})$ =

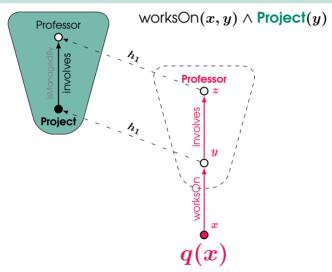
answers to q(x) over $\mathfrak{C}_{\mathcal{O}}(\mathcal{D})$

the canonical model / chase

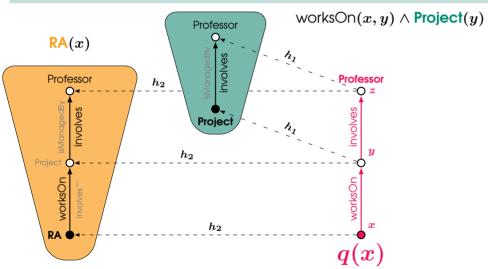
 $q(x) = \exists y, z \, (\text{worksOn}(x,y) \, \land \, \text{involves}(y,z) \, \land \, \text{Professor}(z))$

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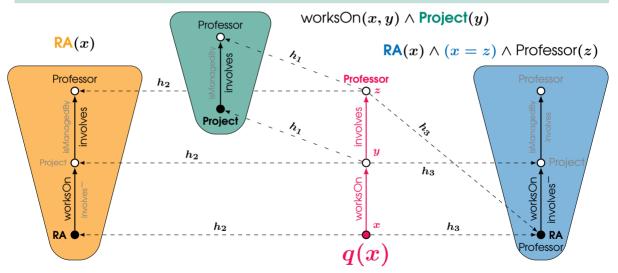
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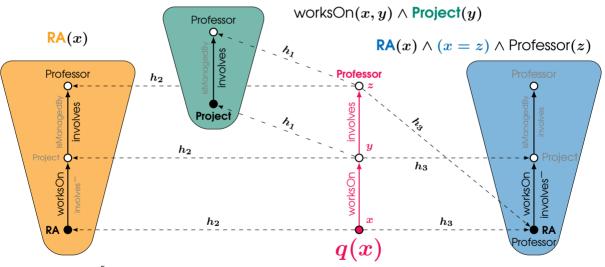


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a **tree witness** \approx a query fragment embeddable into a tree of labelled nulls such that only its 'boundary' (join) variables may be answer variables



 $q'(x) = \exists y, z \left[\mathsf{RA}(x) \lor \left(\mathsf{worksOn}(x,y) \land \mathsf{Project}(y) \right) \lor \left(\mathsf{RA}(x) \land (x=z) \land \mathsf{Professor}(z) \right) \lor \left(\mathsf{worksOn}(x,y) \land \left[\mathsf{involves}(y,z) \lor \mathsf{worksOn}(z,y) \lor \mathsf{isManagedBy}(y,z) \right] \land \mathsf{Professor}(z) \right) \right]$

idea: replace all the class and property names in the OMQ rewriting by their SQL definitions in the mapping

FormationPressure $(x) \land \mathsf{name}(x,y) \land \mathsf{hasDepth}(x,z)$

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```
FormationPressure(x) \land \mathsf{name}(x,y) \land \mathsf{hasDepth}(x,z)
```

```
Can be unfolded into SELECT "FP-" || P1.PRESSURE_S" AS x, "P2.IDENTIFIER" AS y,

"PressureMeasuredDepth-" || P3.PRESSURE_S AS z

FROM PRESSURE P1, PRESSURE P2, PRESSURE P3

WHERE ("FP-" || P1.PRESSURE_S) = ("FP-" || P2.PRESSURE_S)

AND ("FP-" || P1.PRESSURE_S) = ("FP-" || P3.PRESSURE_S)
```

idea: replace all the class and property names in the OMQ rewriting by their SQL definitions in the mapping

```
FormationPressure(x) \land \mathsf{name}(x,y) \land \mathsf{hasDepth}(x,z)
```

issues in such unfolded SQLs:

- joins over string concatenations (indexes cannot be used by DB engine)
- redundant self-joins (since PRESSURE. PRESSURE_s is the primary key)

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```
optimised unfolding:
```

```
SELECT "FP-" || P.PRESSURE_S" AS x, "P.IDENTIFIER" AS y,

"PressureMeasuredDepth-" || P.PRESSURE_S AS z

FROM PRESSURE P
```

Unfolding with R2RML

IRI templates in R2RML are 'functions,' and so, can encode GLAV mappings

 $arphi(x) \leadsto \psi(x)$, where both arphi(x) and $\psi(x)$ are CQs

(with existentially quantified variables)

(for details, see De Giacomo et al. [2018])

NB: the result heavily relies on the lack of UNA and functional properties

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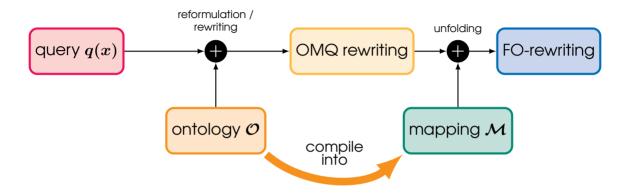
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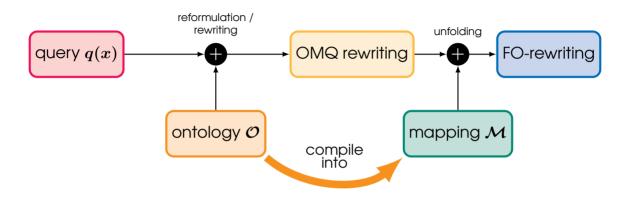
NB: the result heavily relies on the lack of UNA and functional properties

Theorem: every rewriting of an OMQ with an OWL 2 QL ontology can be unfolded with R2RML (equivalently, GLAV) mapping

idea: careful unification of query fragments with mappings

(see Calvanese et al. [2012])





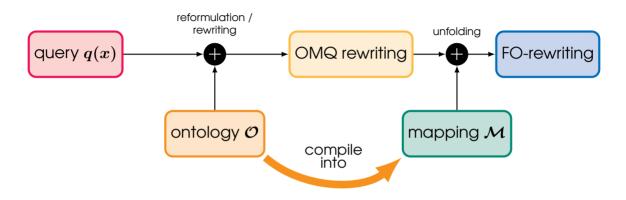
\exists hasFormationPressure $^ \sqsubseteq$ FormationPressure

```
SELECT WELLBORE.IDENTIFIER, PRESSURE.PRESSURE_S
FROM WELLBORE, PRESSURE
WHERE WELLBORE.REF_EXISTENCE_KIND = 'actual'
WELLBORE.WELLBORE_S = PRESSURE.FACILITY_S

\Rightarrow hasFormationPressure(iri("Wellbore-", IDENTIFIER), iri("FP-", PRESSURE_S))
```

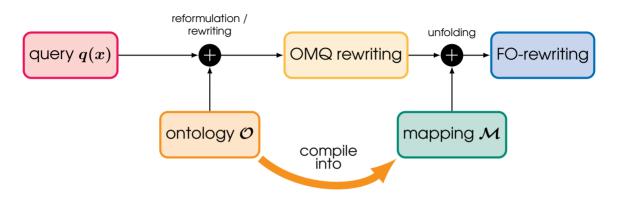
```
SELECT PRESSURE_S FROM PRESSURE

→ FormationPressure(iri("FP-", PRESSURE_S))
```



∃hasFormationPressure FormationPressure

→ FormationPressure(iri("FP-", PRESSURE_S))



redundant

→ FormationPressure(iri("FP-", PRESSURE_S))

SELECT PRESSURE_S FROM PRESSURE

→ FormationPressure(iri("FP-", PRESSURE_S))

applies to subclass
/ sub-property axioms
domain & range axioms

Optimising Saturated Mappings (1)

```
SELECT PRESSURE.PRESSURE_S
FROM WELLBORE, PRESSURE
WHERE WELLBORE.REF_EXISTENCE_KIND = 'actual'
WELLBORE.WELLBORE_S = PRESSURE.FACILITY_S

UNION
SELECT PRESSURE_S FROM PRESSURE

FormationPressure(iri("FP-", PRESSURE_S))
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Query Containment

SELECT PRESSURE.PRESSURE_S
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```



Query Containment

```
SELECT PRESSURE.PRESSURES
FROM WELLBORE, PRESSURE
WHERE WELLBORE.REF_EXISTENCE_KIND = 'actual'
WELLBORE.WELLBORE_S = PRESSURE.FACILITY_S
UNION

SELECT PRESSURE_S FROM PRESSURE

FormationPressure(iri("FP-", PRESSURE_S))
```

this optimisation need not be performed on EACH query it can be done only ONCE, offline, when the system starts

if, however, the mapping is not saturated, then **every** query containing expl:FormationPressure will have to go through the **expansion & reduction** due to query containment

Optimising Saturated Mappings (2)

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Query Containment with

ALTER TABLE wellbore_exploration_all

FOREIGN KEY (fldNpdidField)

REFERENCES field (fldNpdidField)

Optimising Saturated Mappings (3)

```
SELECT seaName FROM seis_acquisition
WHERE seaSurveyTypeMain = 'Grunnundersøkelser'

UNION
SELECT seaName FROM seis_acquisition
WHERE seaSurveyTypeMain = 'Ordinær seismisk undersøkelse'

UNION
...(5 more from subclasses of :Survey)

~> Survey(iri("survey/", seaName))
```

Optimising Saturated Mappings (3)

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WHERE seaSurveyTypeMain = 'Grunnundersøkelser'
UNION
SELECT seaName FROM seis_acquisition
WHERE seaSurveyTypeMain = 'Ordinær seismisk undersøkelse'
UNION
...(5 more from subclasses of :Survey)

$\sim \text{Survey(iri("survey/", seaName))}$
```



References

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