

# Ontology-based Data Access: Theory and Practice

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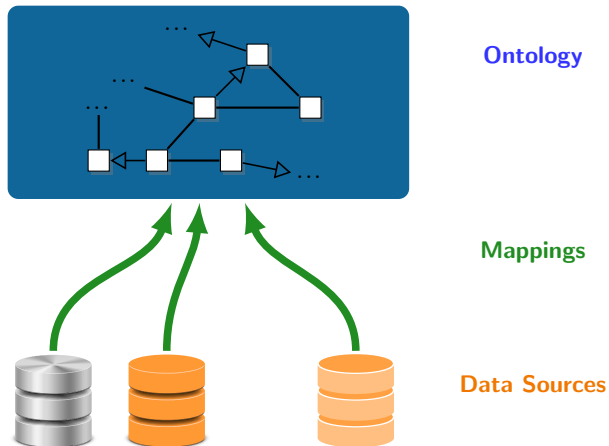
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*Department of Computer Science & Inf. Systems*

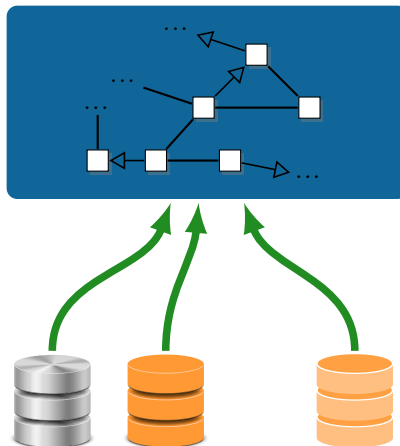
*Birkbeck, University of London*

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

# Ontology-based data integration (OBDI)



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## Ontology

*provides uniform  
common vocabulary  
and conceptual  
view of data*

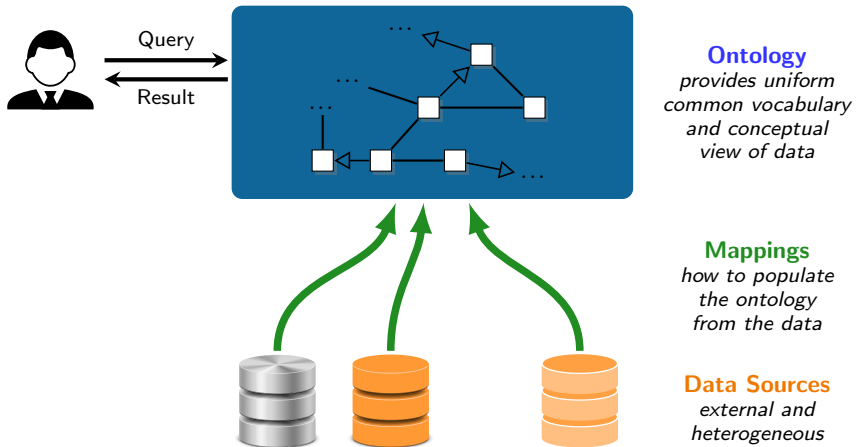
## Mappings

*how to populate  
the ontology  
from the data*

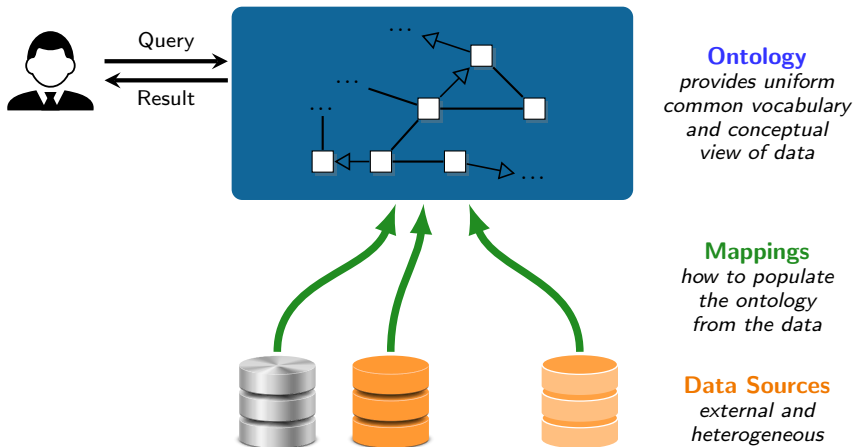
## Data Sources

*external and  
heterogeneous*

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- OBDI is an extension of OBDA in which data are in multiple datasources
- The conceptual architectures of OBDA and OBDI are the same
- Query execution relies on a database federation engine, e.g., Teiid, Exareme, Denodo

The information about one real-world entity can be distributed over several data sources.

## Entity resolution

Understand which records actually represent the same real world entity.

We assume that this information is available and/or known to the integration system designer.

## Integrated querying

Answer queries that require to integrate data items representing the same entity, but coming from different data sources.

**This is the topic .**

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Consider two databases `nat` and `corp` with one table each (keys in blue):

nat.wellbore		
name	wbField	opPurpose
2-1	BLANE	WILDCAT
3-1		WILDCAT
3-10	OSELVAR	APPRAISAL
4-2	EKOFISK	WILDCAT

corp.drillingops		
name	driStDt	reason
NO-2-1	20-03-1989	WILDCAT
NO-3-1	06-07-1968	WILDCAT
NO-3-A	22-07-2011	PRODUCTION
NO-4-2	18-09-1969	

## Mapping assertions

- 1 SELECT name, wbField, opPurpose FROM nat.wellbore  
 $\leadsto$  :NatWB/{name} :inField {wbField} ; :purpose {opPurp} .
- 2 SELECT name, driStDt, reason FROM corp.drillingops  
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Some triples in the ABox defined by the DBs and mapping

```

:NatWB/2-1      :inField      BLANE .
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```

Intuitively, 2-1 in nat and NO-2-1 in corp represent the same wellbore.  
Hence the SPARQL query

```
SELECT * WHERE { ?w :inField ?f.  ?w :drillingStarted ?d . }
```

should return an answer, e.g.,

$$\{?w \mapsto \text{:NatWB/2-1}, \quad ?f \mapsto \text{BLANE}, \quad ?d \mapsto \text{20-3-1989}\}.$$

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```
{ ?w ↦ :NatWB/2-1,  ?f ↦ BLANE,  ?d ↦ 20-3-1989 }.
```

### Example owl:sameAs mapping

central.masterTable		
id	natName	corpName
2	2-1	NO-2-1
3	3-1	NO-3-1
4	4-2	NO-4-2
5		NO-3-A
6	3-10	

- `SELECT natName, corpName  
FROM central.masterTable  
↷ :NatWB/{natName} owl:sameAs  
:CorpWB/{corpName} .`
- Mapping for owl:sameAs can rely on master tables, but may use arbitrary SQL queries to ordinary tables.

- sameAs is the standard way of dealing with identity resolution in OWL.
- We assume that there is no sameAs relation within a datasource ↷ the length of sameAs chain is bounded by the number of datasources
- Semantics of sameAs may cause an exponential number of query results:
  - detrimental for performance
  - redundancy makes query answers difficult to understand

↷ *Not feasible or desirable in practice!*

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- Idea: for the entities with different IRI, assign a canonical one
- Now the mapping  $\mathcal{M}$  includes **assertions**  $\mathcal{M}^c$  **populating** `canIriOf`.
- Such mappings should satisfy some properties:  
e.g., each IRI has at most one canonical IRI

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- ```
SELECT id, natName
FROM central.masterTable
↪ :WB/{id} canIriOf :NatWB/{natName} .
```
- ```
SELECT id, corpName
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```
- ```
SELECT id, corpName
FROM central.masterTable
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```

- We propose a practical method based on compiling the consequences of canonical IRI semantics into mappings  $\rightsquigarrow$  **Mapping rewriting**
- We replace individuals and IRI-templates in the mapping by their canonical representation.
- Again, this is inspired by the mapping saturation algorithm.

# Mapping rewriting – Example

## Mapping $\mathcal{M}^t$

- 1 SELECT name, wbField, opPurpose FROM nat.wellbore  
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## Mapping $\mathcal{M}^c$

- 1 SELECT id, natName FROM central.masterTable  
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## Canonical-iri rewriting

- 1 SELECT wlbFld, opPurp, id  
FROM nat.wellbore, central.masterTable WHERE name = natName  
 $\rightsquigarrow$  :WB/{id} :inField {wlbField} ; :purpose {opPurp} .
- 2 SELECT driStDt, reason, id  
FROM corp.drillingops, central.masterTable WHERE name = corpName  
 $\rightsquigarrow$  :WB/{id} :drillingStarted {driStDt} ; :purpose {reason} .

- Calvanese, D., M. Giese, D. Hovland, and M. Rezk (2015). “Ontology-based Integration of Cross-linked Datasets”. In: *Proc. of ISWC*. Vol. 9366. LNCS. Springer, pp. 199–216.
- Xiao, G., D. Hovland, D. Bilidas, M. Rezk, M. Giese, and D. Calvanese (2018). “Efficient Ontology-Based Data Integration with Canonical IRIs”. In: *Proc. of ESWC*. Springer.