

Reasoning on Web Data Semantics

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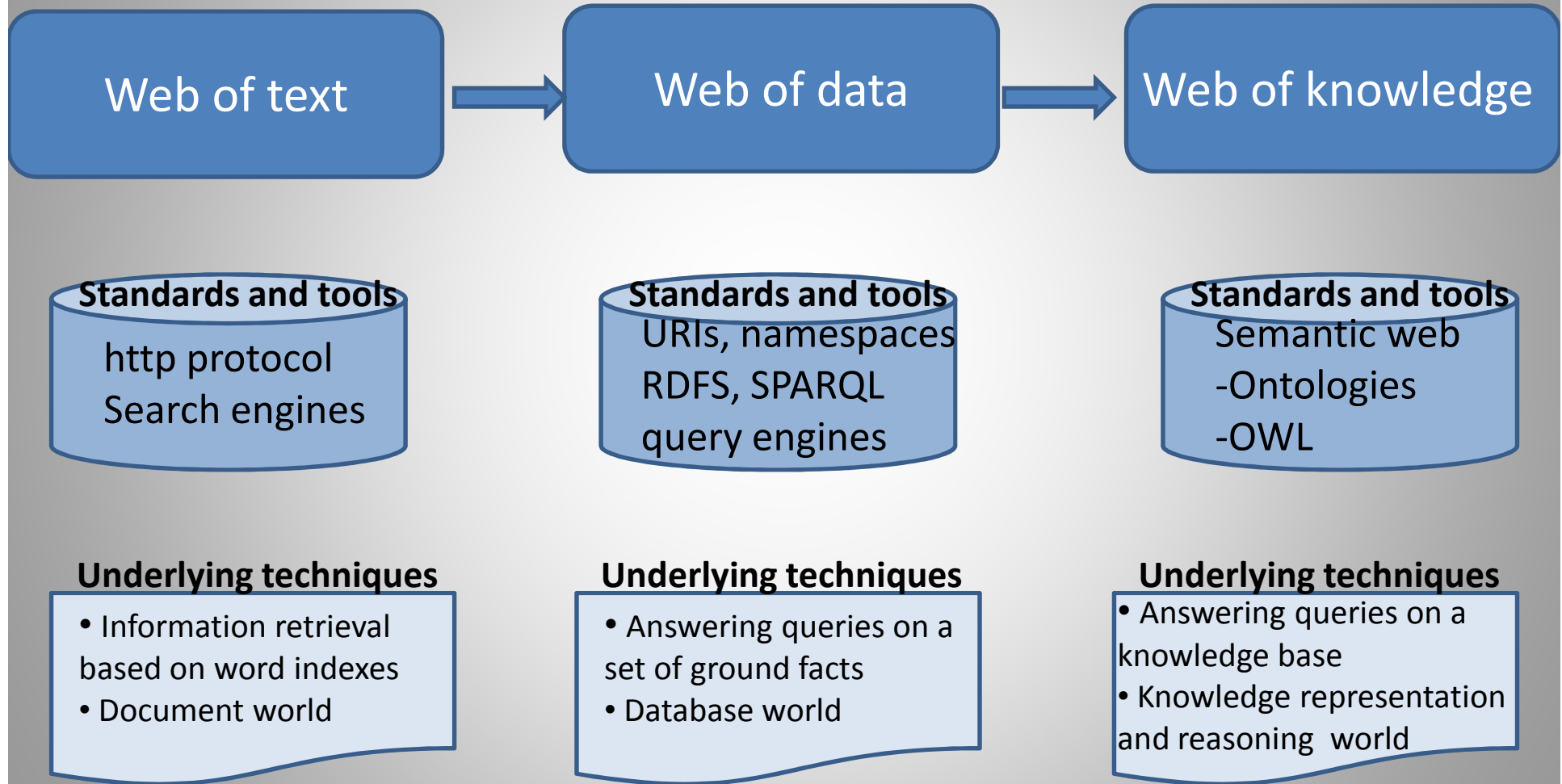
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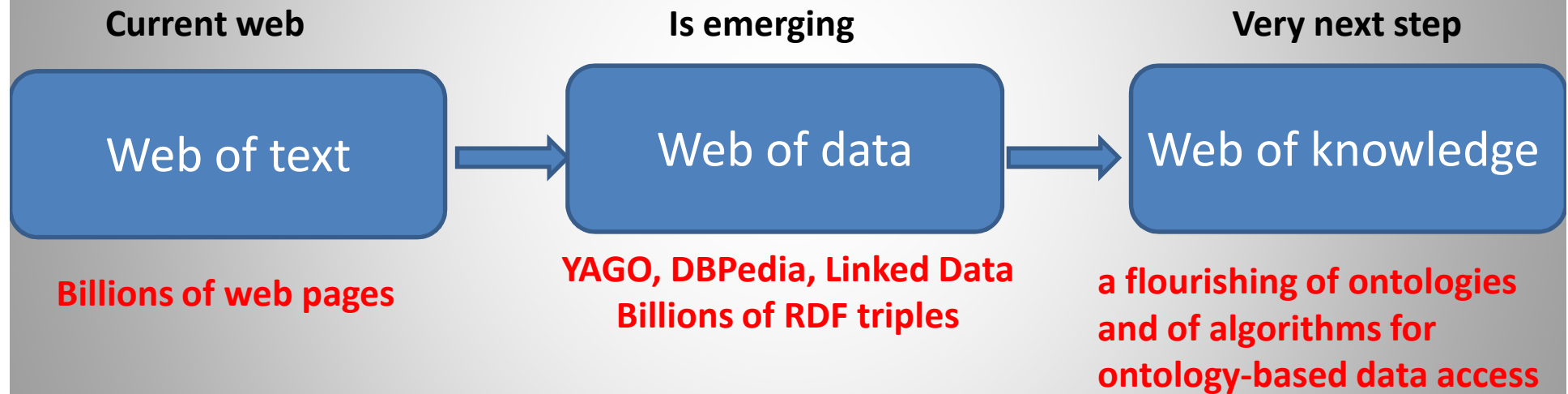
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Evolution of the Web



Evolution of the Web



Main differences illustrated by example

scientists born in Europe who received a Nobel Prize ?

Keywords : « scientists, born in Europe , Nobel Prize »

SPARQL query

```
select x where <y, hasName , x>
<y, hasWonPrize, NobelPrize>
<y, type, Scientist>, <y, bornIn, Europe>
```

Web of text

Web of data

Web of knowledge

a ranked set of web pages likely to contain elements of answer for the user's query

The Royal Swedish Academy of **Sciences** awards the **Nobel Prize** in Physics, the ...
listen (help·info)) was **born** on 21 October 1833 in Stockholm, Sweden, into a The heavy focus on **European** and Swedish authors has been a subject of ...

RDFS store (e.g. YAGO)

```
<http://.../marie-curie, hasName, « Marie Curie »>
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<http://.../einstein, type, Physicist>
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+ Extraction of named entities

« Alfred Nobel », « Albert Einstein », « Albert Camus »,
« Marie Curie »

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scientists born in Europe who received a Nobel Prize ?

{y → http://.../marie-curie,
x → « Marie Curie »}

Keywords : « scientists, born in Europe , Nobel Prize »

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SPARQL Evaluation

RDFS store (e.g. YAGO)

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« Marie Curie »

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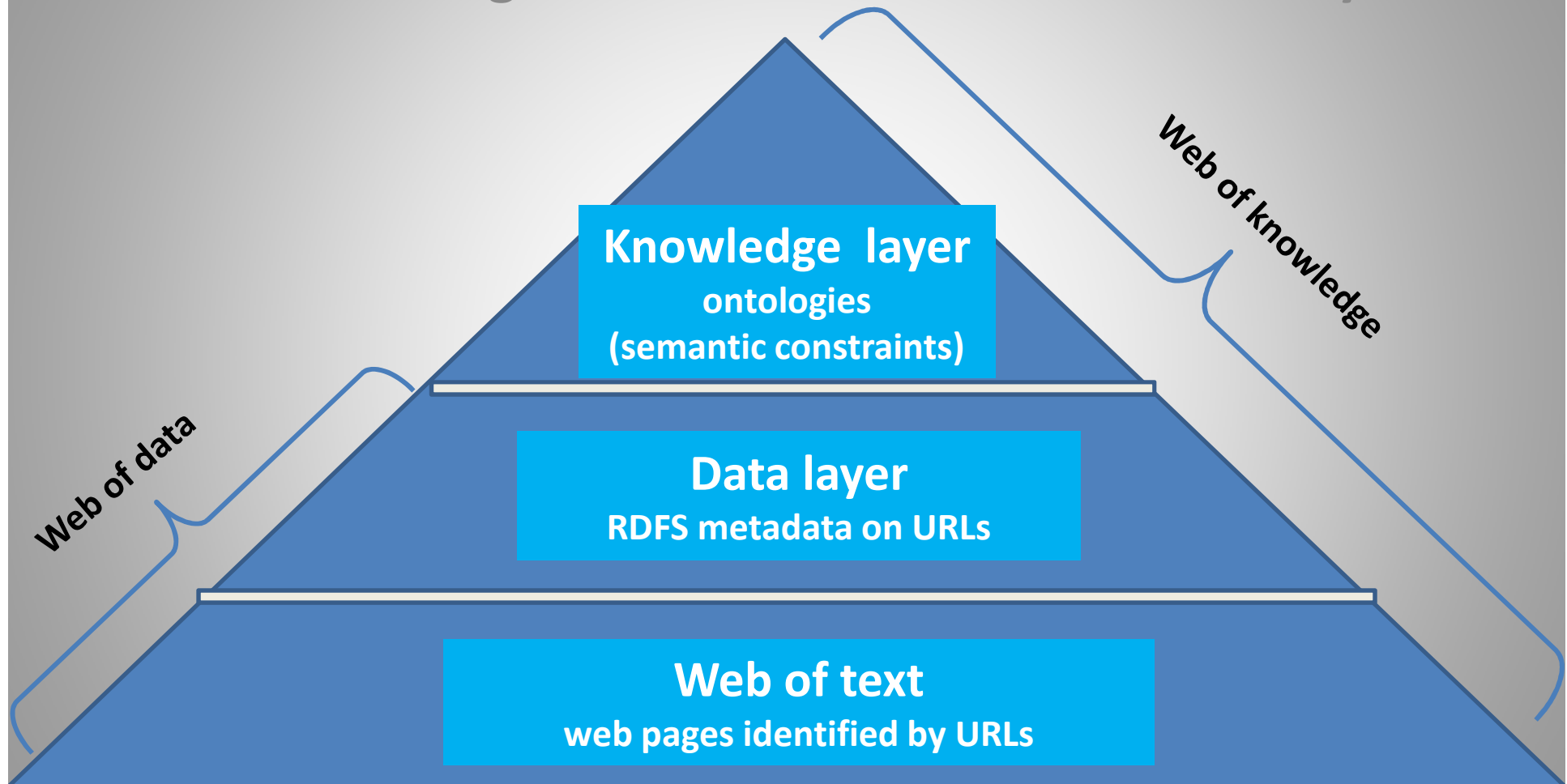
SPARQL Evaluation + reasoning

« Marie Curie »

« Marie Curie », « Albert Einstein »

The real picture

The web is evolving from a web of text to a web of knowledge in a coherent and a smooth way



Lesson learnt from the example

- Answering queries over the web of knowledge requires reasoning

- Ontological statements can be used to infer new facts and deduce answers that could not be obtained otherwise
- They are constraints used as **deductive rules** that infer new facts
- Subtlety: **some inferred facts can be partially known**

From the constraint “a professor teaches at least one master course”

$\forall x (\text{Professor}(x) \Rightarrow \exists y \text{Teaches}(x,y), \text{MasterCourse}(y))$

and the fact:

Professor(dupond) (RDF syntax: `<dupond, type, Professor>`)

it can be inferred the two following incomplete “facts” :

Teaches(dupond, v) , MasterCourse(v)

i.e, in RDF notation, two RDF triples with blank nodes:

`<dupond, Teaches, _v> , <_v, type, MasterCourse>`

Finding inconsistent information on the Web

- **Reasoning: a tool for checking consistency**

- Some ontological statements can be used as **integrity constraints**

“a professor cannot be a lecturer” ; “a course must have a responsible”

$\forall x (\text{Professor}(x) \Rightarrow \neg \text{Lecturer}(x))$

$\forall x (\text{Course}(x) \Rightarrow \exists y \text{ResponsibleFor}(y,x))$

“a master course is taught by a single teacher”

“only professors can be responsible of the courses they have to teach”

$\forall x \forall y (\text{Course}(x), \text{ResponsibleFor}(y,x) \Rightarrow \text{Professor}(y), \text{Teaches}(y,x))$

- Subtlety: **showing data inconsistency may require intricate reasoning** on different rules, constraints and facts

The facts: **Lecturer(jim), Teaches(jim, ue431), MasterCourse(ue431)**

+ the above integrity constraints

+ the rule $\forall x (\text{MasterCourse}(x) \Rightarrow \text{Course}(x))$ leads to an inconsistency

Automatic Reasoning

- Not a novel problem
 - Many decidability and complexity results coming from decades of research in the KR&R community
 - Several inference algorithms and implemented reasoners
 - The key point
 - first-order-logic is appropriate for knowledge representation
 - but **full first-order-logic is not decidable**
 - no general algorithm that, applied to two any FOL formula, determines whether the first one implies the second one
- ⇒ the game is to find restrictions to design:
- **decidable fragments** of first-order-logic
 - expressive enough for modeling useful knowledge or constraints

Description Logics

- A family of class-based logical languages for which reasoning is decidable
 - Provides algorithms for reasoning on (possibly complex) logical constraints over unary and binary predicates
- This is exactly what is needed for handling ontologies
 - in fact, the OWL constructs come from Description Logics
- A fine-grained analysis of computational complexity with surprising complexity results
 - *ALC* is EXPTIME–complete
 - =>any sound and complete inference algorithm for reasoning on most of the subsets of constraints expressible in OWL may take an exponential time (in the worst-case)
 - “only professors or lecturers may teach to undergraduate students”
 - $\forall x \forall y (\text{TeachesTo}(x,y), \text{UndergraduateStudent}(y) \Rightarrow \text{Professor}(x) \vee \text{Lecturer}(x))$

$\exists \text{TeachesTo} . \text{UndergraduateStudent} \sqsubseteq \text{Professor} \sqcup \text{Lecturer}$

The same game again...

- Find restrictions on the logical constructs and/or the allowed axioms in order to:
 - design sublanguages for which reasoning is in P
 - EL, DL-Lite**
 - expressive enough for modeling useful constraints over data
- **DL-Lite: a good trade-off**
 - captures the main constraints used in databases and in software engineering
 - extends **RDFS** (the formal basis of OWL2 QL profile)
 - specially designed for answering queries over ontologies to be **FOL-reducible**

FOL-reducibility

Query answering and data consistency checking can be performed in two separate steps:

- a **query reformulation step**
 - reasoning on the ontology (and the queries)
 - independent of the data
- ⇒ a set a queries: the reformulations of the input query
- an **evaluation step**
 - of the (SPARQL) query reformulations on the (RDF) data
 - independent of the ontology
- ⇒ Main advantage
- makes possible to use an SQL or SPARQL engine
 - thus taking advantage of well-established query optimization strategies supported by standard relational DBMS

Illustration

query

```
select x where <y, hasName , x>  
<y, hasWonPrize, NobelPrize>  
<y, type, Scientist>, <y, bornIn, Europe>
```

ontological constraints

```
<y, type, z>, <z, subclassOf, w> ⇒ <y, type w>  
<y, birthPlace, z>, <z, LocatedIn, u>, <u, partOf, v> ⇒ <y, bornIn, v>  
.....
```

Query Reformulation

```
select x where <y, hasName , x> .....  
<y, hasWonPrize, NobelPrize>  
<y, type, chemist>, <chemist, subclassOf, scientist>  
<y, birthPlace, z>, <z, LocatedIn, u>, <u, partOf, Europe>
```

```
select x where <y, hasName , x> .....  
<y, hasWonPrize, NobelPrize>  
<y, type, physicist>, <physicist, subclassOf, scientist>  
<y, birthPlace, z>, <z, LocatedIn, u>, <u, partOf, Europe>
```

SPARQL evaluation

RDFS store (e.g. YAGO)

```
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<http://.../marie-curie, type, Scientist>  
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<Physicist, subclassOf, Scientist>  
<Ulm, locatedIn, Germany>,  
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```


DL-Lite by example

Professor $\sqsubseteq \exists$ Teaches

$$\forall x (\text{Professor}(x) \Rightarrow \exists y \text{Teaches}(x,y))$$

\exists Teaches \sqsubseteq Course

$$\forall x \forall y (\text{Teaches}(x,y) \Rightarrow \text{Course}(y))$$

ResponsibleFor \sqsubseteq Teaches

$$\forall x \forall y (\text{ResponsibleFor}(x,y) \Rightarrow \text{Teaches}(x,y))$$

(funct ResponsibleFor)

$$\forall x \forall y \forall z (\text{ResponsibleFor}(y,x) \wedge \text{ResponsibleFor}(z,x) \Rightarrow y=z)$$

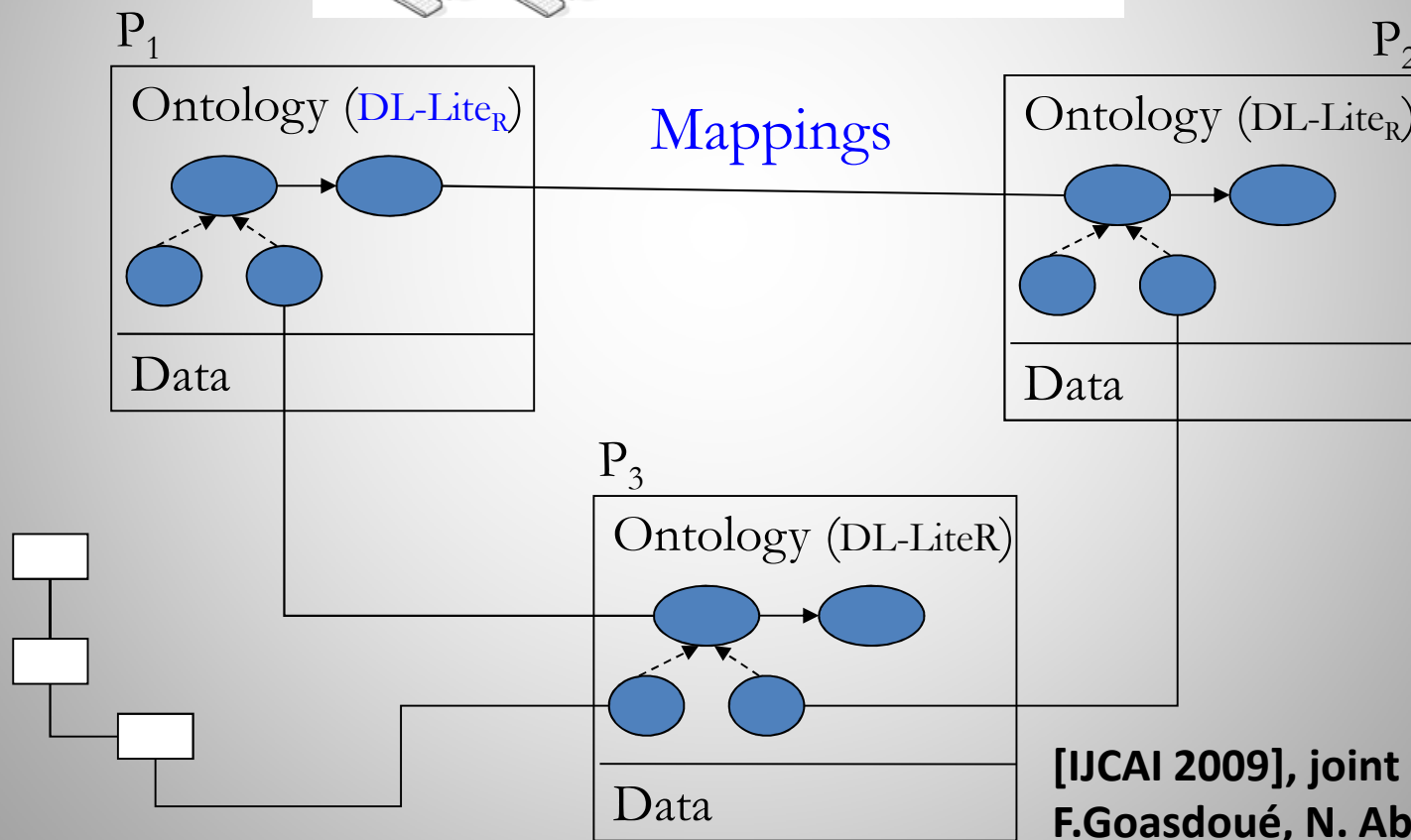
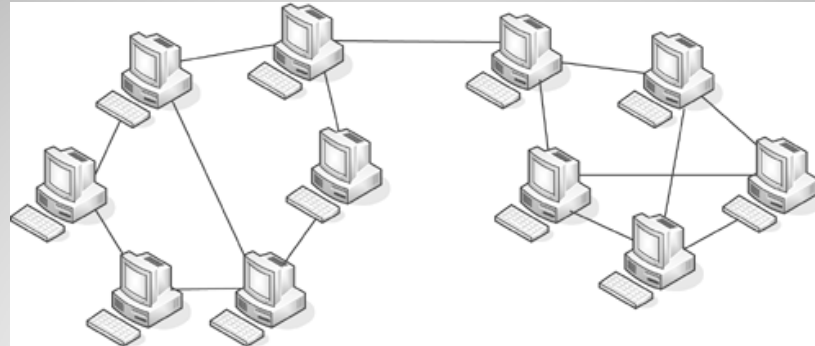
Lecturer $\sqsubseteq \neg (\exists \text{ResponsibleFor})$

$$\forall x \forall y (\text{Lecturer}(x) \wedge \text{ResponsibleFor}(x,y) \Rightarrow \perp)$$

DL-Lite: a frontier for FOL reducibility

- The **reasoning step** is **polynomial** in the size of the ontology
- The **evaluation step** has the same **data complexity** as standard evaluation of conjunctive queries over relational databases
 - in **ACo** (strictly contained in LogSpace and thus in P)
- The interaction between relation inclusion constraints and functionality constraints makes reasoning in DL-Lite **P-complete in data complexity**
 - **DL-Lite_A is FOL-reducible**
 - **full DL-Lite is not FOL-reducible**
 - reformulating a query may require recursion (Datalog)

Decentralized ontology-based data access



Conclusion

- The scalability of reasoning on Web data requires **light-weight ontologies**
 - RDFS is not expressive enough to express useful constraints
 - Forget about (most of fragments) of OWL
- ⇒ **extend RDFS with constraints expressible in a logic for which data management is FOL reducible**
- **DL-Lite_A** is an example of such a logic
 - (some fragments of) **Datalog⁺⁻** too

References

Web data management,

Abiteboul, Manolescu, Rigaux, Rousset, Senellart

webdam.inria.fr/Jorge

Decentralized reasoning in DL-Lite

Abdallah, Goasdoué, Rousset

IJCAI 2009

Reasoning for reference reconciliation

Sais, Pernelle, Rousset

IJCAI 2007

Trust for resource finding in semantic P2P networks

Atencia, Euzenat, Pirro, Rousset

ISWC 2011

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