





# THÉORIE DES BASES DE CONNAISSANCES HMIN312M

Marie-Laure MUGNIER (Univ. Montpellier)
Jean-François BAGET (Inria)

**Equipe GraphIK (LIRMM & Inria)** 

https://team.inria.fr/graphik/

## KNOWLEDGE REPRESENTATION AND REASONING (KR)

- A field historically at the heart of Artificial Intelligence
- Study formalisms (or languages) to
  - represent various kinds of human knowledge
  - do reasoning on these representations
- along the tradeoff expressivity / tractability of reasoning
- → KR languages based on **computational logic**

Mainly first-order logic (FOL)

Major conferences: IJCAI, AAAI, KR



### KNOWLEDGE BASED SYSTEMS

Knowledge Base (KB)



Reasoning Services



 General knowledge on the application domain

« Cats are Mammals »

#### **Ontology**

Factual Knowledge
 Description of specific individuals, situations, ...

Félix is a Cat

Factbase, Database

#### **Fundamental tasks**

- Checking the consistency of the KB
- Computing answers to a query over the KB

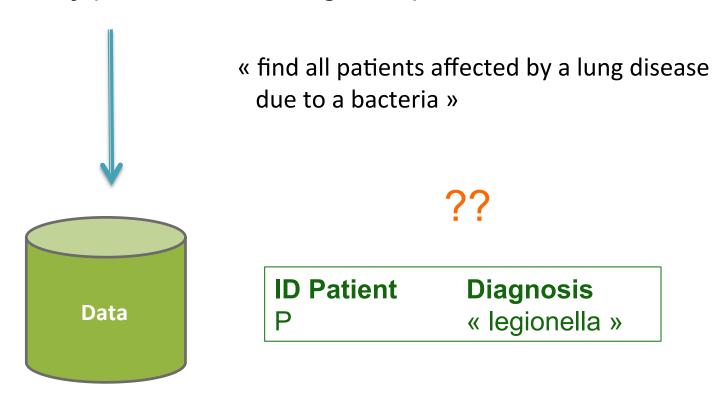
. . .

Reasoning algorithms associated with the KR language

Knowledge expressed in a KR language

## (EX: MEDICAL RECORDS)

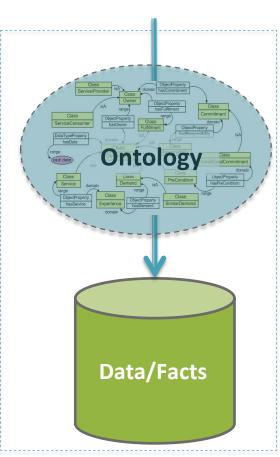
#### Query (SQL, SPARQL, MongoDB ...)



**Database** (relational, RDF, NoSQL, ...)

#### ADDING AN ONTOLOGICAL LAYER

#### Query



« find all patients affected by a lung disease due to a bacteria »

A legionella is bacterial pneumonia

A bacterial pneumonia is a pneumonia

A pneumonia is a lung disease

A lung disease is a disease

A bacterial pneumonia is a bacterial disease

A bacterial disease is caused by a bacteria

If x is caused by y then x is due to y

If the diagnosis of a patient x contains a disease y then

x is affected by y

ID Patient Diagnosis

P « legionella »

#### **Knowledge Base**

JIAF 2019

## ONTOLOGY-MEDIATED QUERY ANSWERING

```
q(x) = \exists y \exists z (Patient(x) \land isAffectedBy(x,y) \land LungDisease(y) \land dueTo(y,z) \land Bacteria(z))
```

« find all patients affected by a lung disease due to a bacteria »

```
Factbase = { Patient(P), Diagnosis(P,M), Legionella(M) } 

« The diagnosis for the patient P is legionella »
```

 $\forall$  x (BacterialDisease(x)  $\rightarrow$   $\exists$  y (hasCausativeAgent(x,y)  $\land$  Bacteria(y))) hence hasCausativeAgent(M,b) and Bacteria(b)

```
\forall x \forall y \text{ (hasCausativeAgent(x,y)} \rightarrow \text{dueTo(x,y))}
hence dueTo(M,b)
```

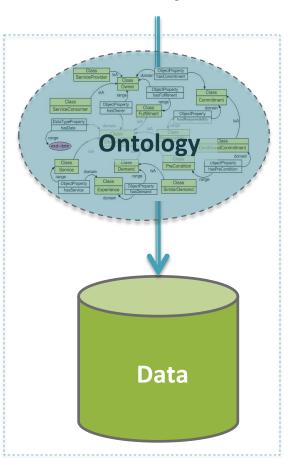
Answer : x = P

```
\forall x \forall y ((Diagnosis(x,y) \land Disease(y)) \rightarrow isAffectedBy(x,y))
hence isAffectedBy(P,M)
```

## ONTOLOGY-MEDIATED QUERY ANSWERING (OMQA)

### Adding an ontological layer on top of data

Query



1- Enrich the vocabulary

allowing to abstract from a specific data storage

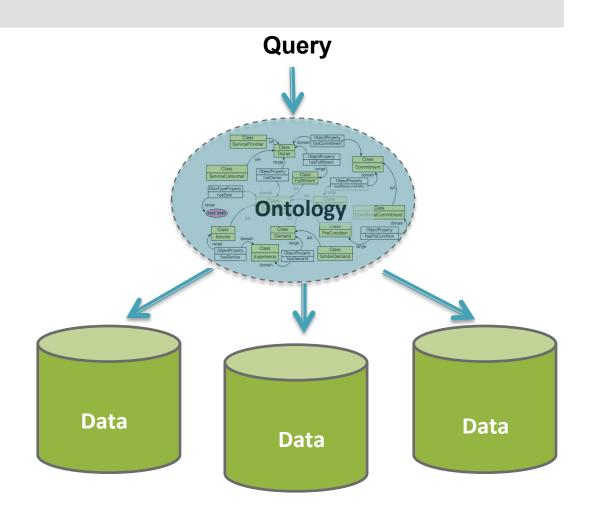
2 - Infer new facts, not explicitely stored,

allowing for **incomplete data** representation

**Knowledge base** 

## ONTOLOGY-MEDIATED QUERY ANSWERING (OMQA)

3 – provide a **unified view** of multiple sources



## ONTOLOGY-MEDIATED QUERY ANSWERING (OMQA)



Ontology **Factbase**  (Boolean) conjunctive query q

Set of formulas O in a suitable FOL fragment

Set of atoms (« facts ») F

Find all answers to q

that are *logically entailed* by (O, F)

**Knowledge base** 

#### Dans ce module

- Quels formalismes pour représenter ces connaissances ?
  - → langages à base de règles
    - qui sont des « fragments » de la logique du premier ordre classique règles à la Datalog, contraintes négatives règles existentielles
    - qui sortent de la logique classique

Datalog avec négation du monde clos Answer Set Programming (ASP) [ sémantiques tolérantes aux inconsistances ]

- Quelle est la complexité des raisonnements dans ces formalismes ?
- Quelles techniques algorithmiques ?