

Ontologies with Data or: the death of the AI dream

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São Paulo, September 2015

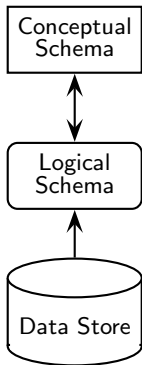
Summary

- ▶ Defining the problem of dealing with data together with an ontology
- ▶ The problem is not trivial
- ▶ A novel framework to solve the problem
- ▶ The *purpose* of ontologies...

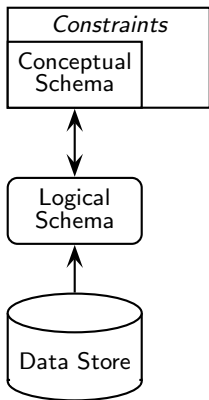
Ontologies and Constraints

- ▶ An ontology is a formal conceptualisation of the world: a **conceptual schema**.
- ▶ An ontology specifies a set of **constraints**, which declare what should necessarily hold in any possible world.
- ▶ Any possible world should conform to the constraints expressed by the ontology.
- ▶ Given an ontology, a *legal world description* (or **legal database instance**) is a finite possible world satisfying the constraints.

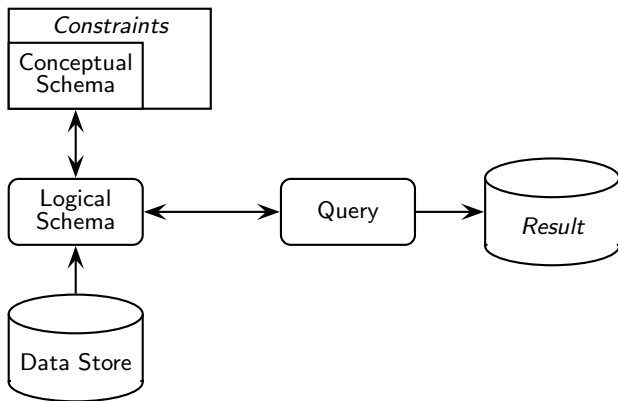
The role of a Conceptual Schema



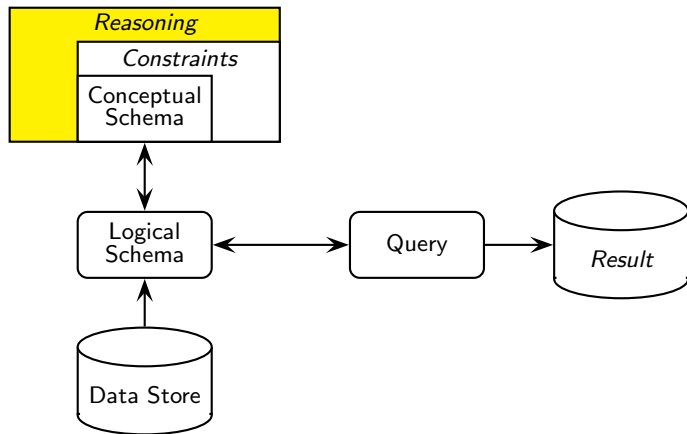
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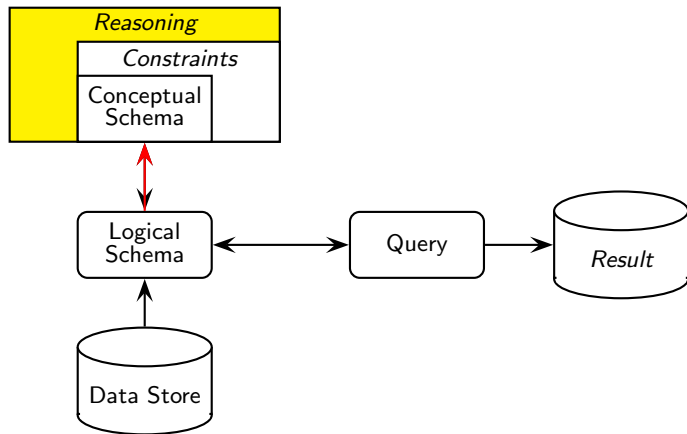
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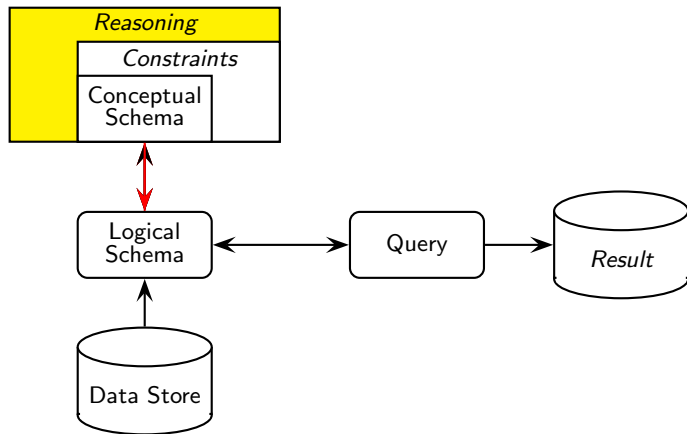
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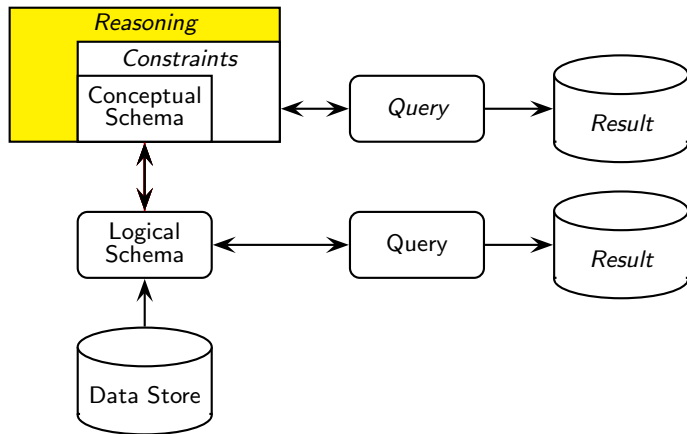
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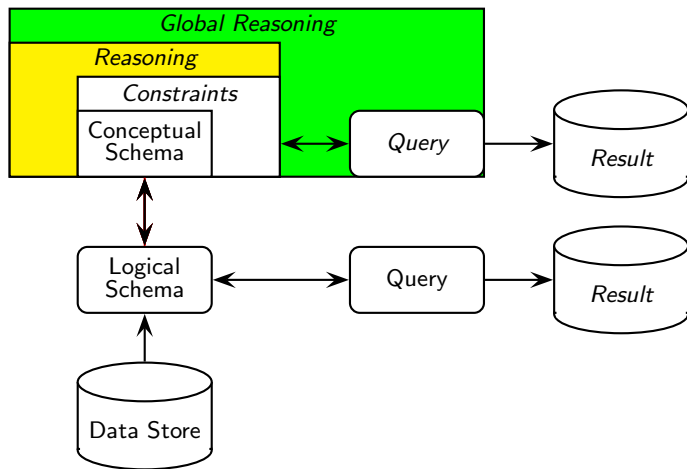
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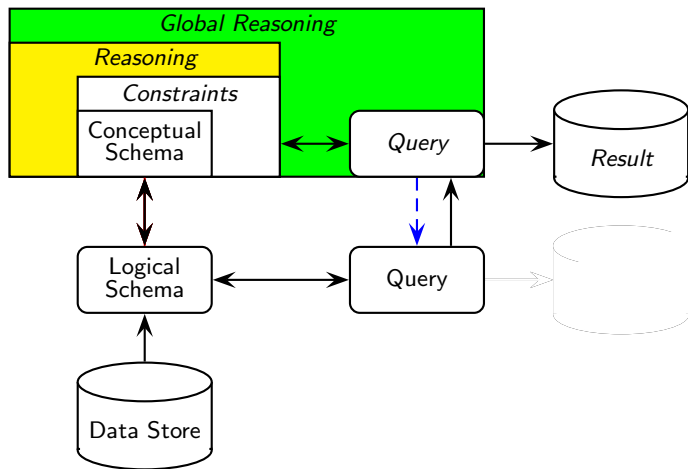
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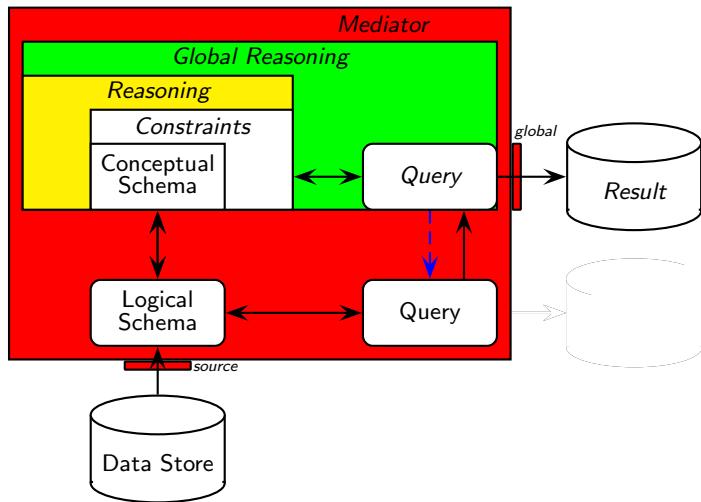
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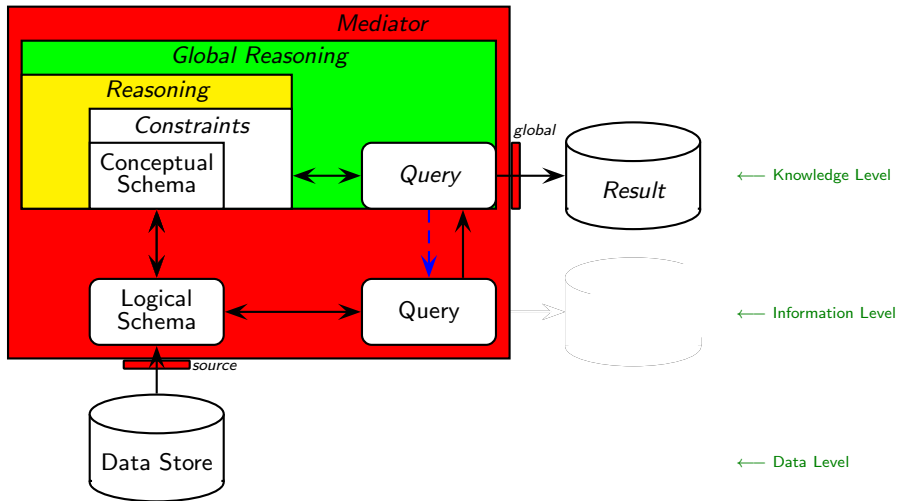
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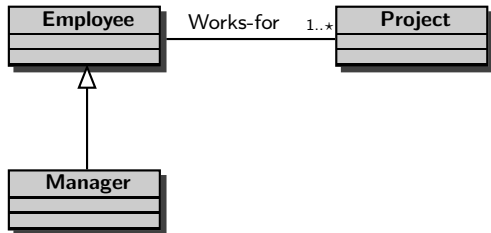
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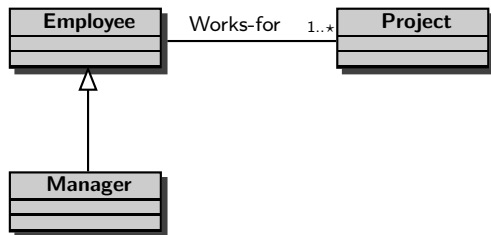
The role of a Conceptual Schema



Queries via Conceptual Schemas: the classical **DB** case



Queries via Conceptual Schemas: the classical **DB** case



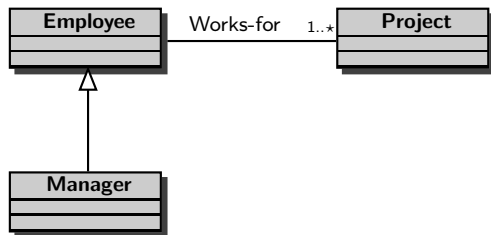
Employee = { John, Mary, Paul }

Manager = { John, Paul }

Works-for = { ⟨John, Prj-A⟩, ⟨Mary, Prj-B⟩ }

Project = { Prj-A, Prj-B }

Queries via Conceptual Schemas: the classical **DB** case



Employee = { John, Mary, Paul }

Manager = { John, Paul }

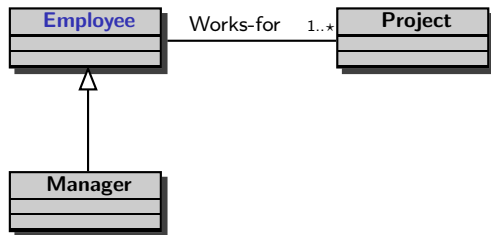
Works-for = { ⟨John, Prj-A⟩, ⟨Mary, Prj-B⟩ }

Project = { Prj-A, Prj-B }

$Q(X) :- \text{Manager}(X), \text{Works-for}(X,Y), \text{Project}(Y)$

$\implies \{ \text{John} \}$

Queries via Conceptual Schemas: the **DBox** case

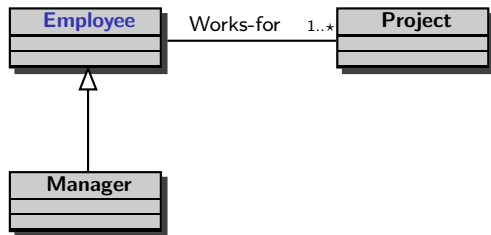


Manager = { John, Paul }

Works-for = { ⟨John, Prj-A⟩, ⟨Mary, Prj-B⟩ }

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Queries via Conceptual Schemas: the **DBox** case



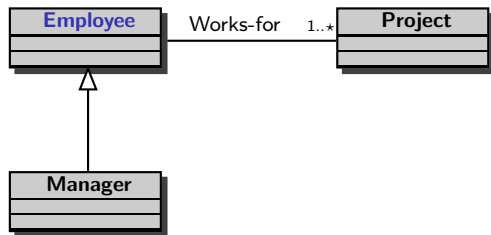
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$Q(X) :- \text{Employee}(X)$

Queries via Conceptual Schemas: the **DBox** case



Manager = { John, Paul }

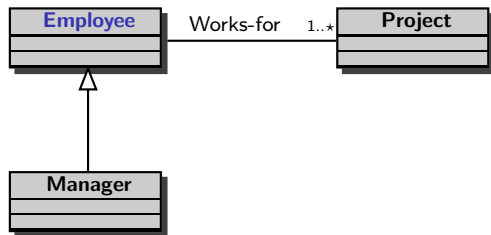
Works-for = { ⟨John, Prj-A⟩, ⟨Mary, Prj-B⟩ }

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Q(X) :- Employee(X)

⇒ { John, Paul, Mary }

Queries via Conceptual Schemas: the **DBox** case



Manager = { John, Paul }

Works-for = { ⟨John, Prj-A⟩, ⟨Mary, Prj-B⟩ }

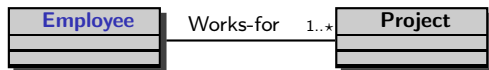
Project = { Prj-A, Prj-B }

$Q(X) :- \text{Employee}(X)$

$\Rightarrow \{ \text{John, Paul, Mary} \}$

$\Rightarrow Q'(X) :- \text{Manager}(X) \cup \text{Works-for}(X,Y)$

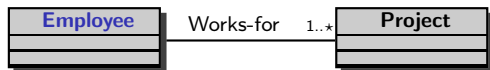
Queries via Conceptual Schemas: the **ABox** case



Works-for \supseteq { \langle John, Prj-A \rangle , \langle Mary, Prj-A \rangle }

Project \supseteq { Prj-A, Prj-B }

Queries via Conceptual Schemas: the **ABox** case

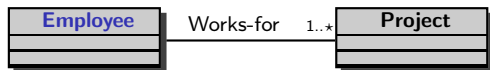


Works-for \supseteq { \langle John,Prj-A \rangle , \langle Mary,Prj-A \rangle }

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Q(X) :- Works-for(Y,X)

Queries via Conceptual Schemas: the **ABox** case



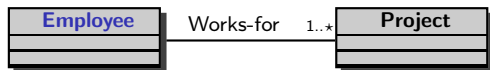
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\implies { Prj-A, Prj-B }

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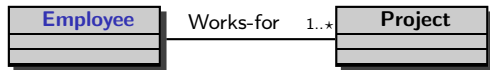
Project \supseteq { Prj-A, Prj-B }

$Q(X) :-$ Works-for(Y,X)

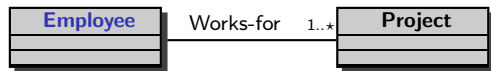
\implies { Prj-A, Prj-B }

$\implies Q'(X) :-$ Project(X) \cup Works-for(Y,X)

A DBox is stronger than an ABox



A DBox is stronger than an ABox

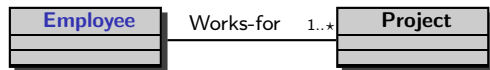


ABox:

Works-for \supseteq { \langle John,Prj-A \rangle , \langle Mary,Prj-A \rangle }

Project \supseteq { Prj-A, Prj-B }

A DBox is stronger than an ABox



ABox:

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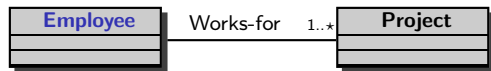
Project \supseteq { Prj-A, Prj-B }

DBox:

Works-for = { \langle John,Prj-A \rangle , \langle Mary,Prj-A \rangle }

Project = { Prj-A, Prj-B }

A DBox is stronger than an ABox



ABox:

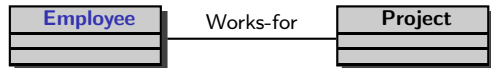
Works-for \supseteq { \langle John,Prj-A \rangle , \langle Mary,Prj-A \rangle }
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Works-for = { \langle John,Prj-A \rangle , \langle Mary,Prj-A \rangle }
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\Rightarrow **INCONSISTENT**

An ABox is not faithful to the DB



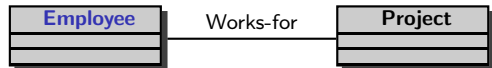
- ▶ Additional constraint as a standard view over the data:

$\text{Bad-Project} = \text{Project} \setminus \pi_2 \text{Works-for}$

$\forall x. \text{Bad-Project}(x) \leftrightarrow \text{Project}(x) \wedge \neg \exists y. \text{Works-for}(y, x)$

$\text{Bad-Project} = \text{Project} \sqcap \neg \exists \text{Works-for}^- . \top$

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- ▶ DBox:

$\text{Works-for} = \{ \langle \text{John}, \text{Prj-A} \rangle, \langle \text{Mary}, \text{Prj-A} \rangle \}$

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- ▶ $Q(X) :- \text{Bad-Project}(X)$

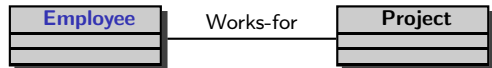
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$$\implies \{ \text{Prj-B} \}$$

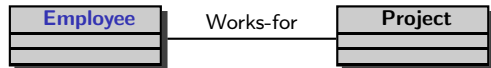
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- ▶ DBox:

$$\text{Works-for} = \{ \langle \text{John}, \text{Prj-A} \rangle, \langle \text{Mary}, \text{Prj-A} \rangle \}$$

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- ▶ $Q(X) :- \text{Bad-Project}(X)$

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- ▶ ABox:

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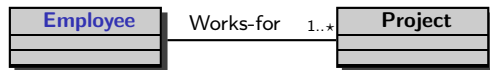
$$\text{Project} \supseteq \{ \text{Prj-A}, \text{Prj-B} \}$$

- ▶ $Q(X) :- \text{Bad-Project}(X)$

$$\implies \{ \}$$

does not scale down to standard DB answer!

An ABox doesn't preserve compositionality

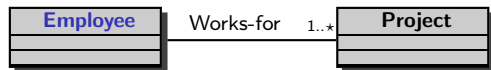


► ABox:

Works-for \supseteq { \langle John, Prj-A \rangle }

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▶ ABox:

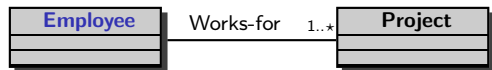
Works-for \supseteq { \langle John, Prj-A \rangle }

Project \supseteq { Prj-A, Prj-B }

▶ Query as a standard view over the data:

$Q(X) \text{ :- Works-for}(Y,X) \quad Q = \pi_2 \text{Works-for}$

An ABox doesn't preserve compositionality



- ▶ ABox:

Works-for \supseteq { \langle John, Prj-A \rangle }

Project \supseteq { Prj-A, Prj-B }

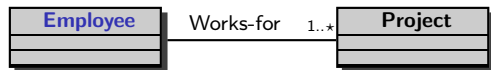
- ▶ Query as a standard view over the data:

$Q(X) \text{ :- Works-for}(Y, X)$ $Q = \pi_2 \text{Works-for}$

- ▶ $Q = \text{EVAL}(\pi_2 \text{Works-for})$

- ▶ $Q = \pi_2(\text{EVAL}(\text{Works-for}))$

An ABox doesn't preserve compositionality



- ▶ ABox:

Works-for \supseteq { \langle John, Prj-A \rangle }

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- ▶ Query as a standard view over the data:

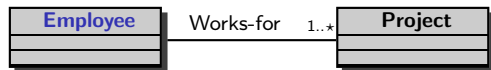
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- ▶ $Q = \text{EVAL}(\pi_2 \text{Works-for})$

\implies { Prj-A, Prj-B }

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An ABox doesn't preserve compositionality



► ABox:

Works-for \supseteq { \langle John, Prj-A \rangle }

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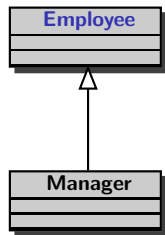
\implies { Prj-A, Prj-B }

► $Q = \pi_2(\text{EVAL}(\text{Works-for}))$

\implies { Prj-A }

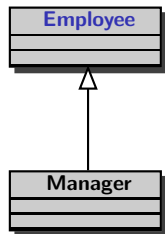
Queries are not compositional with an ABox

Queries with an incomplete answer



Manager = { John, Paul }

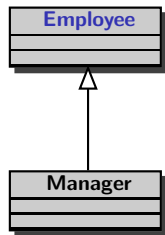
Queries with an incomplete answer



`Manager = { John, Paul }`

`Q(X) :- Employee(X)`

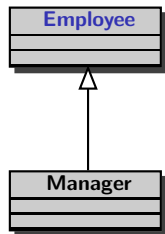
Queries with an incomplete answer



Manager = { John, Paul }

$Q(X) :- \text{Employee}(X) \implies \{ \text{John}, \text{Paul} \}$

Queries with an incomplete answer

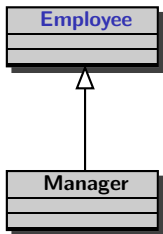


Manager = { John, Paul }

$Q(X) :- \text{Employee}(X) \implies \{ \text{John}, \text{Paul} \}$

So are Managers and Employees the same?

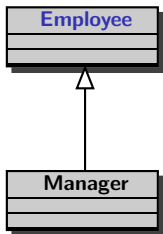
Queries with an incomplete answer



Manager = { John, Paul }

$Q(X) :- \text{Employee}(X) \implies \{ \text{John, Paul} \}$

Queries with an incomplete answer



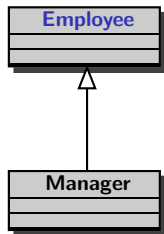
Manager = { John, Paul }

$Q(X) :- \text{Employee}(X) \implies \{ \text{John}, \text{Paul} \}$

$Q^1 :- \neg \text{Manager}(\text{George})$

$Q^2 :- \neg \text{Employee}(\text{George})$

Queries with an incomplete answer



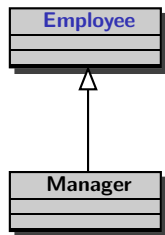
Manager = { John, Paul }

$Q(X) :- \text{Employee}(X) \implies \{ \text{John}, \text{Paul} \}$

$Q^1 :- \neg \text{Manager}(\text{George}) \implies \text{TRUE}$

$Q^2 :- \neg \text{Employee}(\text{George})$

Queries with an incomplete answer



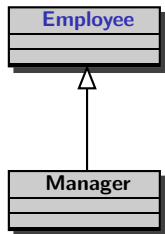
Manager = { John, Paul }

$Q(X) :- \text{Employee}(X) \implies \{ \text{John}, \text{Paul} \}$

$Q^1 :- \neg \text{Manager}(\text{George}) \implies \text{TRUE}$

$Q^2 :- \neg \text{Employee}(\text{George}) \implies \text{FALSE}$

Queries with an incomplete answer



Manager = { John, Paul }

$Q(X) :- \text{Employee}(X) \implies \{ \text{John}, \text{Paul} \}$

$Q^1 :- \neg \text{Manager}(\text{George}) \implies \text{TRUE}$

$Q^2 :- \neg \text{Employee}(\text{George}) \implies \text{FALSE}$

The result of the query can not be stored (as a view)

\implies *queries with an incomplete answer are not compositional*

Determinacy - or implicit definability

Given a conceptual schema and a DBox, a query which only gives complete answers is called **implicitly definable** or **determined by the DBox**.

If a query is implicitly definable, then its evaluation depends only on the database, and vice-versa; therefore implicitly definable queries characterise exactly **views**.

Beth (1953) constructively proved that there is a way to check whether an arbitrary query is determined by a DBox given a conceptual schema.

Example: implicit definability



$$M = \{j\}$$

$$E = \{j, m\}$$

C

Rewriting - or explicit definability

If a query is **implicitly definable**, **Beth (1953)** constructively proved that possible to rewrite the query using only the vocabulary of the DBox (and therefore independent on the conceptual schema, since the extension of the DBox is fixed).

This is its **explicit definition**.

Example: explicit definability

$$C \equiv E \setminus M$$

Task: query rewriting

For simplicity, let's focus on atomic queries.

Our goals are

1. to check whether the answers to a given query under a conceptual schema are *solely* **determined** by the DBox and, if so,
2. to find an equivalent (first-order/SQL) **rewriting** of the query in terms of the DBox predicates to allow the use of standard database technology for answering the query.
3. Indeed, this means we benefit from the low computational complexity – logarithmic space in the size of the data – of answering first-order queries on relational databases.
4. It is possible to pre-compute all the rewritings of all the determined predicates as relational views, and to allow arbitrary SQL queries on top of them.

Problem: “unsafe” rewritings

Conceptual schema: $\text{Male} \doteq \neg \text{Female}$

DBox: $\text{Female} = \{\text{mary}\}$

Query: $Q :- \neg \exists x. \text{Male}(x)$

Rewriting of the query: $\forall x. \text{Female}(x)$

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- ▶ Answer to the query: **NO**
- ▶ But if we fix the domain to include *only* the individual mary (namely, the **active domain**), then the answer would be **YES**

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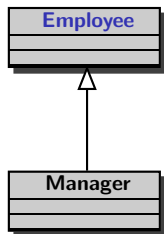
The query is not **domain independent**.

Domain independent rewritings

Theorem (- et al.)

If a conceptual schema is domain independent, then the rewriting of determined domain independent queries is also domain independent.

Abduction

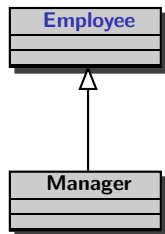


Manager = { John, Paul }

$Q(X) :- \text{Employee}(X)$

Rewriting of Q:

Abduction

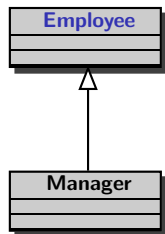


Manager = { John, Paul }

$Q(X) :- \text{Employee}(X)$

Rewriting of Q: impossible.

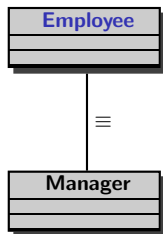
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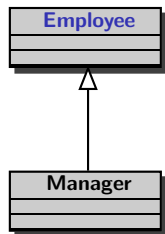


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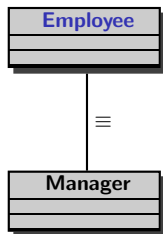
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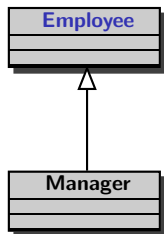


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Rewriting of Q: Manager(X)

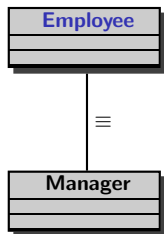
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Q(X) :- Employee(X)

Rewriting of Q: Manager(X)

The abduction is characterised by being the *least committing* extension of the ontology such that the query becomes implicitly definable.

Philosophical issue

with data

Do reusable ontologies exist?

NO

Conclusions

Conclusions

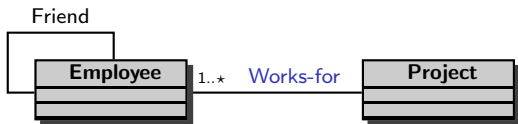
Do you want to exploit conceptual schema knowledge
(i.e., constraints or an ontology)
in your data intensive application?

Conclusions

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in your data intensive application?

Pay attention!

Complexity of DBoxes

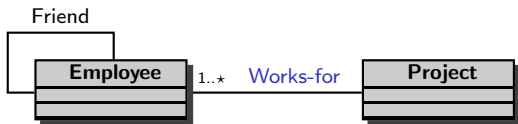


► DBox:

Friend = {⟨John, Mary⟩, ...}; Employee = {John, Mary, ...}

Project = { Prj-A, Prj-B, Prj-C }

Complexity of DBoxes



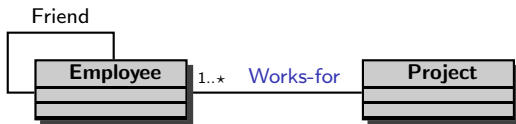
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Is it unavoidable that there are two friends working for the same project?

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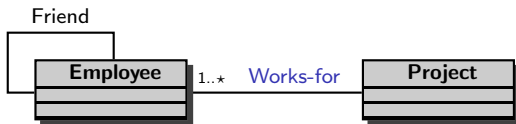
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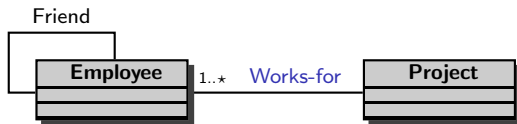
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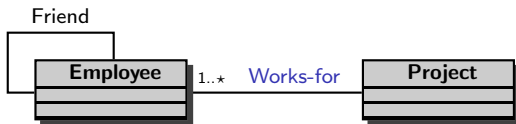
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- With *ABox semantics* the answer is always **NO**, since there is at least a legal database instance with *enough* distinct projects so that no two friends work for the same project.

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Query answering with DBoxes has exponential complexity (3-colorability of maps), and it is harder than with ABoxes

Encoding a DBox in a \mathcal{DL} with nominals

$$\mathcal{DL} \cup DBox \simeq \mathcal{DL} \cup \text{nominals}$$

(\Rightarrow) Add completion and closure axioms:

- ▶ for every assertions involving A in the DBox $A(a_1), \dots, A(a_n)$, add the axiom $A \equiv (\{a_1\} \sqcup \dots \sqcup \{a_n\})$
- ▶ for every assertions involving R and a in the DBox $R(a, b_1), \dots, R(a, b_n)$, add the axioms $\{a\} \sqsubseteq \exists R.\{b_1\} \sqcap \dots \sqcap \exists R.\{b_n\}$ and $\{a\} \sqsubseteq \forall R.(\{b_1\} \sqcup \dots \sqcup \{b_n\})$
- ▶ ...

(\Leftarrow) For every nominal $\{a\}$, add to the DBox the assertion $A(a)$, where A is a new DBox concept name, and replace the occurrences of $\{a\}$ with A .