#### Completeness Statements about RDF Data Sources and Their Use for Query Answering

+ Research Story

#### Fariz Darari

Werner Nutt Giuseppe Pirrò Simon Razniewski



Freie Universität Bozen Libera Università di Bolzano

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EMCL Workshop 2014, Vienna

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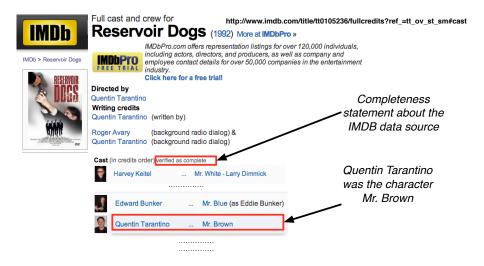
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# Slides about Research Story (Meta-Research)

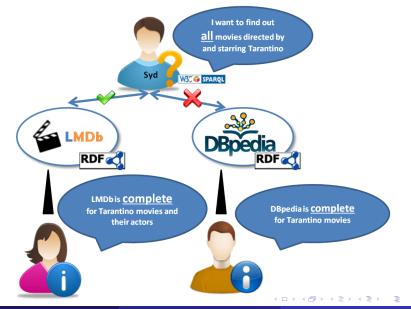
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- I want to do a project and a thesis.
- I like Semantic Web.
- What can be a good research topic? Finding a good research topic (and good supervisor) is also part of research!
- Werner: "Hi, we are doing research about completeness reasoning on databases"
- Me: "Why not also on the Semantic Web?"

## **Motivation**



#### **Motivation**

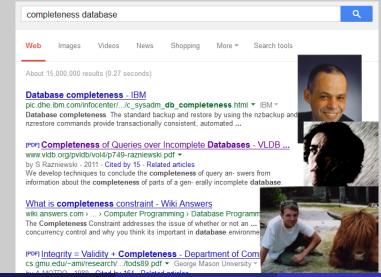


Fariz Darari (EMCL Workshop 2014) Completeness Reasoning @ Linked Data

- Hmm..for realizing my goal, what should I learn?
- Aha, I need to learn Semantic Web, I think the Semantic Web Technologies course offered by FUB would be useful for me
- Aha, I also need to learn existing work on completeness reasoning for databases, I guess this paper<sup>1</sup> is worth to read!

<sup>1</sup>Completeness of Queries over Incomplete Databases by Simon and Werner

# Story: Google (and your supervisors) are your Googles, ask them!



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# Story: Start Doing Real Research – Problem Understanding

- Completeness reasoning on databases has been investigated
- Hmm..but databases are different than Linked Data, what should be adjusted?
- Well, in Linked Data, instead of databases, we have RDF data sources
- Well, in Linked Data, instead of SQL, we have SPARQL as a query language
- Well, Linked Data also is more open, more heterogeneous and federated
- Well, Linked Data also has ontologies
- Then, I have to discuss these issues with my supervisors!

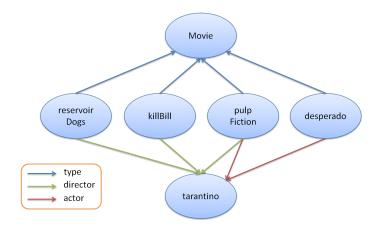
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#### Quentin Tarantino is missing..

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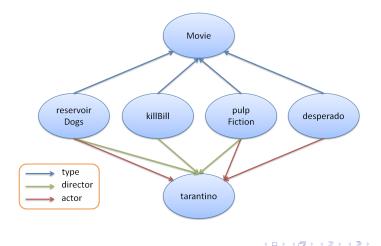
#### An incomplete data source of Tarantino movies, $\mathcal{G}_{dbp} = (G^{a}_{dbp}, G^{i}_{dbp})$ :



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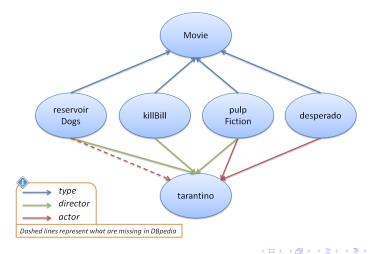
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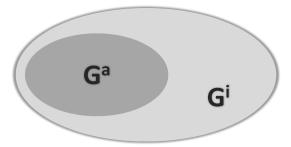


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#### An incomplete data source of Tarantino movies, $\mathcal{G}_{dbp} = (G^{a}_{dbp}, G^{i}_{dbp})$ :



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#### Incomplete Data Source

An incomplete data source is a pair of two graphs,

$$\mathcal{G} = (G^a, G^i)$$
, where  $G^a \subseteq G^i$ .

We call  $G^a$  the **available** graph and  $G^i$  the **ideal** graph.

To express that a source is complete for all the triples about movies directed by Tarantino, we use the statement

 $C_{dir} = Compl((?m, type, Movie), (?m, director, tarantino) | \emptyset),$ 

To express that a source is complete for all the triples about movies directed by Tarantino, we use the statement

 $C_{dir} = Compl((?m, type, Movie), (?m, director, tarantino) | \emptyset),$ 

To express that a source is complete for all triples about actors in movies directed by Tarantino, we use

$$C_{act} =$$

Compl((?m, actor, ?a) | (?m, type, Movie), (?m, director, tara))

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Let  $P_1$  be a non-empty BGP (Basic Graph Pattern) and  $P_2$  a BGP. A **completeness statement** is defined as

 $Compl(P_1 \mid P_2)$ 

where we call  $P_1$  the **pattern** and  $P_2$  the **condition** of the statement.

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## Satisfaction of Completeness Statements

To the statement

 $C = Compl(P_1 \mid P_2),$ 

we associate the CONSTRUCT query

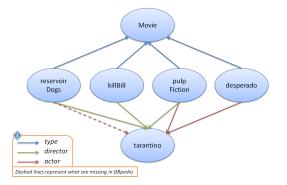
$$Q_{\mathcal{C}}=(P_1,P_1\cup P_2).$$

Then, we say:

*C* is **satisfied** by an IDS  $\mathcal{G} = (G^a, G^i)$ , written  $\mathcal{G} \models C$ , if  $\llbracket Q_C \rrbracket_{G^i} \subseteq G^a$ .

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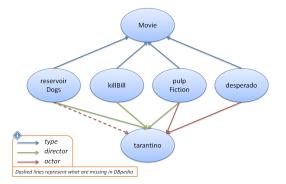
 $C_{dir} = Compl((?m, type, Movie), (?m, director, tarantino) | \emptyset)$ 



Question:  $\mathcal{G}_{dbp} \models C_{dir}$ ?

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 $C_{dir} = Compl((?m, type, Movie), (?m, director, tarantino) | \emptyset)$ 

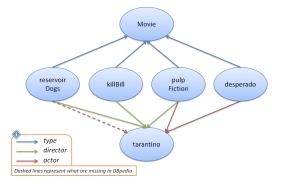


Question: 
$$\mathcal{G}_{dbp} \models C_{dir}$$
?  
Yes, because  $\llbracket Q_{C_{dir}} \rrbracket_{G^{i}_{dbp}} \subseteq G^{a}_{dbp}$ .

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#### **Completeness Statements**

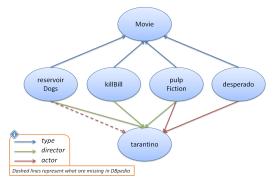
 $C_{act} = Compl((?m, actor, ?a) | (?m, type, Movie), (?m, director, tara))$ 



#### Question: $\mathcal{G}_{dbp} \models C_{act}$ ?

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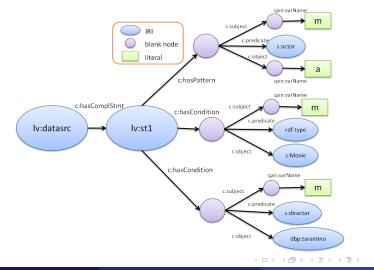
 $C_{act} = Compl((?m, actor, ?a) | (?m, type, Movie), (?m, director, tara))$ 



Question:  $\mathcal{G}_{dbp} \models C_{act}$ ? No, because among the results of  $[\![Q_{C_{act}}]\!]_{G^{i}_{dbp}}$ , there is (*reservoirDogs*, *actor*, *tarantino*) not in  $G^{a}_{dbp}$ .

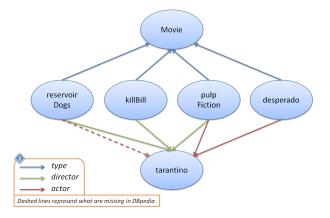
#### **Completeness Statements in RDF**

 $C_{act} = Compl((?m, actor, ?a) | (?m, type, Movie), (?m, director, tara))$ 



#### Query Completeness: Example

 $Q_{dir} = (\{?m\}, \{(?m, type, Movie), (?m, director, tarantino)\})$ 

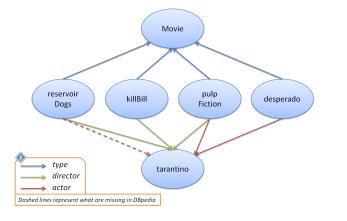


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## Query Completeness: Example

 $Q_{dir} = (\{?m\}, \{(?m, type, Movie), (?m, director, tarantino)\})$ 



Then, 
$$\llbracket Q_{dir} \rrbracket_{G^{i}_{dbp}} = \llbracket Q_{dir} \rrbracket_{G^{a}_{dbp}}$$
, and therefore  $\mathcal{G}_{dbp} \models Compl(Q_{dir})$ .

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## Query Completeness: Definition

Definition Let Q be a SELECT query. We write Compl(Q)to say that Q is complete. An incomplete data source  $\mathcal{G} = (G^a, G^i)$  satisfies Compl(Q), written

 $\mathcal{G} \models Compl(Q)$  if and only if  $\llbracket Q \rrbracket_{G^i} = \llbracket Q \rrbracket_{G^a}$ .

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## Story: Defining Theorems to Prove

- Theorems are formal representations of goals you want to achieve (remember the first slides about motivation)
- In fact..all the definitions and framework introduced before are actually to well-define these theorems
- Hmm..I am sure these theorems should hold!
- Then, I have to discuss these issues with my supervisors!

Let C be a set of completeness statements and Q a SELECT query. We say that C entails the completeness of Q, written

 $\mathcal{C} \models Compl(Q)$ ,

if any incomplete data source satisfying C also satisfies Compl(Q).

#### **Transfer Operator**

For any set C of completeness statements and a graph G, we define the **transfer operator**  $T_C$ :

$$T_{\mathcal{C}}(G) = \bigcup_{C \in \mathcal{C}} \llbracket Q_C \rrbracket_G$$

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#### **Transfer Operator**

For any set C of completeness statements and a graph G, we define the **transfer operator**  $T_C$ :

$$T_{\mathcal{C}}(G) = \bigcup_{C \in \mathcal{C}} \llbracket Q_C \rrbracket_G$$

#### Prototypical Graph

Let Q = (W, P) be a SELECT query. The **prototypical graph**  $\tilde{P}$  is the graph resulting from the mapping of variables in *P* to fresh, unique IRIs.

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#### **Completeness of Basic Queries**

#### Theorem

Let C be a set of completeness statements and Q = (W, P) a basic query. Then,

 $\mathcal{C} \models Compl(Q)$  if and only if  $\tilde{P} = T_{\mathcal{C}}(\tilde{P})$ .

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## Story: Start Doing The Hardcore Part -Proving Theorems

- Argh, I got stuck
- This proving theorems stuff always haunts me!
- But:



#### Because you are Excellent Marvelous Champion Legendary (aka EMCL)

## Story: Start Doing The Hardcore Part -Proving Theorems (2)

- Get the proof idea first
- Generate some concrete examples of the problems with their solutions from the theorem you want to prove
- Discuss with your supervisors
- Now, start to prove in detail
- There is a problem on this, and that, then refine your proof idea, go back to the first point
- Start doing the above points until (hopefully :) you are able to prove it

Consider the set of completeness statements

$$\mathcal{C}_{\mathit{dir},\mathit{act}} = \{ \mathit{C}_{\mathit{dir}}, \mathit{C}_{\mathit{act}} \}$$

and the query

$$Q_{dir+act} = (\{?m\}, P_{dir+act})$$

where

$$P_{dir+act} =$$

{ (?m, type, Movie), (?m, director, tarantino), (?m, actor, tarantino) }

Consider the set of completeness statements

$$\mathcal{C}_{\mathit{dir},\mathit{act}} = \{ \mathit{C}_{\mathit{dir}}, \mathit{C}_{\mathit{act}} \}$$

and the query

$$Q_{dir+act} = (\{?m\}, P_{dir+act})$$

Then,

$$\tilde{P}_{dir+act} = \{ (c_{?m}, type, Movie), (c_{?m}, director, tarantino), (c_{?m}, actor, tarantino) \}$$

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$$\mathcal{C}_{\mathit{dir},\mathit{act}} = \{ \mathit{C}_{\mathit{dir}}, \mathit{C}_{\mathit{act}} \}$$

$$Q_{dir+act} = (\{?m\}, P_{dir+act})$$

Therefore,

$$\mathcal{T}_{\mathcal{C}_{\textit{dir},act}}( ilde{ extsf{P}}_{\textit{dir}+act})$$

$$\mathcal{C}_{\mathit{dir},\mathit{act}} = \set{C_{\mathit{dir}}, C_{\mathit{act}}}$$

$$Q_{dir+act} = (\{?m\}, P_{dir+act})$$

Therefore,

$$\mathcal{T}_{\mathcal{C}_{\textit{dir},\textit{act}}}( ilde{\mathcal{P}}_{\textit{dir}+\textit{act}}) = \llbracket \mathcal{Q}_{\mathcal{C}_{\textit{dir}}} 
rbrace_{ ilde{\mathcal{P}}_{\textit{dir}+\textit{act}}} \cup \llbracket \mathcal{Q}_{\mathcal{C}_{\textit{act}}} 
rbrace_{ ilde{\mathcal{P}}_{\textit{dir}+\textit{act}}}$$

$$\mathcal{C}_{\mathit{dir},\mathit{act}} = \{ \mathit{C}_{\mathit{dir}}, \mathit{C}_{\mathit{act}} \}$$

$$Q_{dir+act} = (\{?m\}, P_{dir+act})$$

Therefore,

$$\begin{aligned} \mathcal{T}_{\mathcal{C}_{dir,act}}(\tilde{P}_{dir+act}) \\ &= \llbracket Q_{\mathcal{C}_{dir}} \rrbracket_{\tilde{P}_{dir+act}} \cup \llbracket Q_{\mathcal{C}_{act}} \rrbracket_{\tilde{P}_{dir+act}} \\ &= \{ (\textbf{c}_{?m}, \textit{type}, \textit{Movie}), (\textbf{c}_{?m}, \textit{director}, \textit{tara}), \end{aligned}$$

$$\mathcal{C}_{\mathit{dir},\mathit{act}} = \{ \mathit{C}_{\mathit{dir}}, \mathit{C}_{\mathit{act}} \}$$

$$Q_{dir+act} = (\{?m\}, P_{dir+act})$$

Therefore,

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$$\mathcal{C}_{\mathit{dir},\mathit{act}} = \{ \mathit{C}_{\mathit{dir}}, \mathit{C}_{\mathit{act}} \}$$

$$Q_{dir+act} = (\{?m\}, P_{dir+act})$$

Therefore,

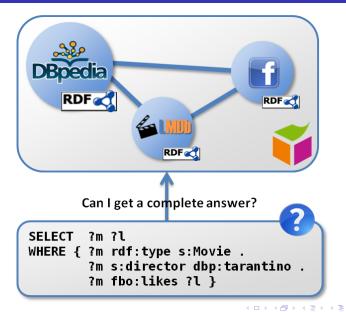
$$\begin{aligned} \mathcal{T}_{\mathcal{C}_{dir,act}}(\tilde{P}_{dir+act}) \\ &= \llbracket Q_{\mathcal{C}_{dir}} \rrbracket_{\tilde{P}_{dir+act}} \cup \llbracket Q_{\mathcal{C}_{act}} \rrbracket_{\tilde{P}_{dir+act}} \\ &= \{ (\textbf{c}_{?m}, \textit{type}, \textit{Movie}), (\textbf{c}_{?m}, \textit{director}, \textit{tara}), (\textbf{c}_{?m}, \textit{actor}, \textit{tara}) \} \\ &= \tilde{P}_{dir+act}. \end{aligned}$$

Thus,  $C_{dir,act} \models Compl(Q_{dir+act})$ 

## The framework can also be applied to:

- DISTINCT Queries: with set semantics
- OPT Queries: eg. get all people and in case they are not single, get also their spouse
- Queries with RDFS Data Sources: incorporating ontologies

#### **Federated Framework**



#### CoRner: Completeness Reasoner

- Can check the completeness of a subset of SPARQL queries depending on the completeness statements of a single data source.
- Developed in Java using the Apache Jena library.
- Takes three inputs:
  - Completeness statements in RDF format
  - A SPARQL query
  - (optional) an RDFS ontology
- Available at http://rdfcorner.wordpress.com/.

- I have got all the results
- But, I haven't started writing the thesis yet
- Nooo, I will miss the deadline :(

## Story: Cooling Down - Alternative

- I have got all the results
- And, I have started writing the thesis since the very beginning (right after I have studied the literature)
- I think I can manage to meet the deadline :)
- Aha, I think our research results can be also useful if shown to the Semantic Web community, why not to try submit it at ISWC 2013? – Another research story :)

- We developed a theoretical framework for the expression of completeness statements about data sources, from which we can ensure query completeness.
- We provide a compact RDF representation of completeness statements, which can be embedded in VoID descriptions, and implemented the framework in CoRner.
- We are interested in studying completeness reasoning with more expressive queries and OWL 2.

## Terima kasih, grazie, danke!!



#### Link to References

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