









# Reasoning about Disclosure in Data Integration in the Presence of Source Constraints

DIG Seminar 21/11/19

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## ${\sf Schema} + {\sf Constraints}$



















Secret



publication



Secret leaked?



Secret



Safe publication?



Secret leaked?

# **Example: Hospital setting**







**P**atients



Doctors

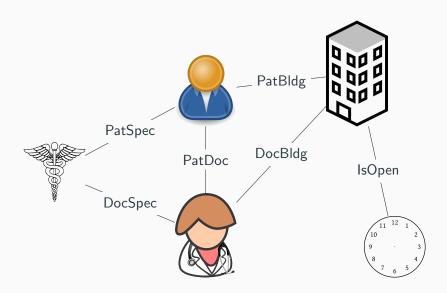


**B**uildings

**S**pecialties

Open hours

## **Example: Hospital setting**



#### Database schema

Predicate	Meaning
${\tt IsOpen}(b,t)$	Building b is open on Date t
$\mathtt{PatBdlg}(p,b)$	Patient <i>p</i> is present in Building <i>b</i>
${ t PatSpec}(p,s)$	Patient <i>p</i> was treated for Specialty <i>s</i>
$\mathtt{PatDoc}(p,d)$	Patient <i>p</i> was treated by Doctor <i>d</i>
$\mathtt{DocBldg}(d,b)$	Doctor $d$ is associated with Building $b$
$\mathtt{DocSpec}(d,s)$	Doctor $d$ is associated with Specialty $s$

#### **Views**

```
\begin{array}{lcl} \texttt{OpenHours}(b,t) &=& \texttt{IsOpen}(b,t) \\ \texttt{VisitingHours}(p,t) &=& \texttt{PatBdlg}(p,b) \land \texttt{IsOpen}(b,t) \\ \texttt{DocList}(d,s,b) &=& \texttt{DocSpec}(d,s) \land \texttt{DocBldg}(d,b) \end{array}
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#### **Constraints**

```
\mathtt{PatDoc}(p,d) \ 	o \ \exists s \ \mathtt{PatSpec}(p,s) \land \mathtt{DocSpec}(d,s) \mathtt{PatBdlg}(p,b) \ 	o \ \exists d \ \mathtt{PatDoc}(p,d) \land \mathtt{DocBldg}(d,b)
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#### Views

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OpenHours(b, t) = IsOpen(b, t)
VisitingHours(p, t) = PatBdlg(p, b) \land IsOpen(b, t)
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```

#### Constraints

$$\mathtt{PatDoc}(p,d) \rightarrow \exists s \ \mathtt{PatSpec}(p,s) \land \mathtt{DocSpec}(d,s)$$
 $\mathtt{PatBdlg}(p,b) \rightarrow \exists d \ \mathtt{PatDoc}(p,d) \land \mathtt{DocBldg}(d,b)$ 

#### Secret

$$\exists p, s \; \text{PatSpec}(p, s)$$
?

OpenHour			
$B_1$		Tuesday	
$B_2$	Every day 10-17h		
VisitingHours			
Charline Tuesday			

DocList			
Alice	$B_1$		
Alice	Cancer	$B_2$	
Bob	Radiology	$B_2$	
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## **Formalism**

## Data represented by databases

$$R(1,17), R(2,42), S(23,45), \dots$$



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#### Constraints are TGD

$$R(x,y) \rightarrow \exists z, S(y,z)$$







#### View Problem

Given (schema, constraints  $\mathcal{C}$ , views  $\mathcal{V}$ , secret  $\mathcal{S}$ , visible  $\bigcirc$ ) do we have  $\bigcirc$  such that  $\mathcal{C}(\bigcirc)$ ,  $\mathcal{V}(\bigcirc) = \bigcirc$  and  $\neg \mathcal{S}(\bigcirc)$ ?



#### Schema Problem

Given (schema, constraints  $\mathcal{C}$ , views  $\mathcal{V}$ , secret  $\mathcal{S}$ ) do we have for all

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Which configurations are decidable/tractable for the schema problem?

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Secrets Views Constraints

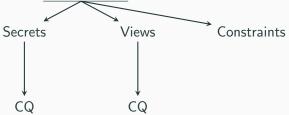
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Secrets

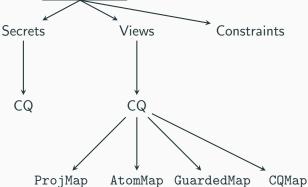
Views

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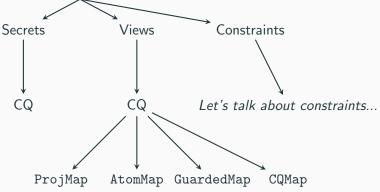
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# Ontologies

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Ontologies allows to enrich data by inferring new facts from existing ones.

## An example of ontology

## With plain words:

All cats are mammals.

All mammals are animals.

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# With Tuple Generating Dependencies:

$$CAT(x) \rightarrow MAMMAL(x)$$

$$MAMMAL(x) \rightarrow ANIMAL(x)$$

## With plain words:

All cats are mammals.

All mammals are animals.

Database:  $\{CAT(\begin{tabular}{c} \begin{tabular}{c} \begin{tabular} \begin{tabular}{c} \begin{tabular}{c} \begin{tabular}{c}$ 

## With plain words:

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Database: {CAT( )}

Query: Are there animals?  $(\exists X, ANIMAL(X)?)$ 

## With plain words:

All cats are mammals.

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Database:  $\{CAT(\stackrel{\bullet}{V})\}$ 

Query: Are there animals?  $(\exists X, ANIMAL(X)?)$ 

Answer: Yes:  $CAT() \Rightarrow MAMMAL() \Rightarrow ANIMAL() \Rightarrow$ 

# More complex ontological rules

# Foreign key constraint:

$$SEMINAR(team, speaker, room, date) \rightarrow \\ \exists pers, RESERVED(room, date, pers)$$

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## Even more complex constraints:

```
SEMINAR(team, speaker, room, date) \rightarrow
\exists pers, RESERVED(room, date, pers) \land MEMBER(pers, team)
```

# More complex ontological rules

## Foreign key constraint:

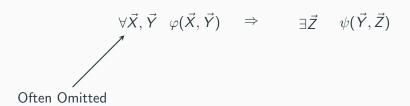
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## Even more complex constraints:

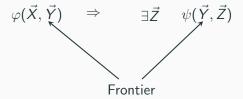
$$SEMINAR(team, speaker, room, date) \rightarrow \\ \exists pers, RESERVED(room, date, pers) \land MEMBER(pers, team)$$

 $MEMBER(person, team) \rightarrow$   $\exists date, room, SEMINAR(team, person, room, date)$ 

$$\forall \vec{X}, \vec{Y} \quad \varphi(\vec{X}, \vec{Y}) \quad \Rightarrow \quad \exists \vec{Z} \quad \psi(\vec{Y}, \vec{Z})$$







# Open World Query Answering (OWQA)

# **Open World Query Answering**

- ullet A set of facts  ${\cal F}$
- ullet A set of TGD constraints  ${\cal C}$
- A conjunctive query Q

Do we have, for all ::

$$(\mathcal{F}\subseteq \bigcirc \land \mathcal{C}(\bigcirc ))\Rightarrow \mathcal{Q}(\bigcirc )?$$

 $\mathsf{OWQA}(\mathcal{F},\mathcal{C},\mathcal{Q})$  asks if  $\mathcal{Q}$  is true in all completions of  $\mathcal{F}$  (respecting  $\mathcal{C}$ ).

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 $\mathsf{OWQA}(\mathcal{F},\mathcal{C},\mathcal{Q})$  asks if  $\mathcal{Q}$  is true in all completions of  $\mathcal{F}$ (respecting C).

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$$OWQA(\mathcal{F}, \mathcal{C}, \mathcal{Q}) \Leftrightarrow Chase(\mathcal{F}, \mathcal{C}) \vDash \mathcal{Q}$$

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Intuitively the chase simply "applies" the constraints.

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#### With:

- $\mathcal{F} = CAT( ) )$
- $C = \{CAT(X) \rightarrow MAMMAL(X), MAMMAL(X) \rightarrow ANIMAL(X)\}$

#### We obtain:

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$$\mathcal{F}_1 = \{ CAT( \ ) \}$$

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$$\mathcal{F}_1 = \{CAT()\}$$

2. 
$$\mathcal{F}_2 = \{CAT(\overset{\bullet}{\bigvee}), MAMMAL(\overset{\bullet}{\bigvee})\}$$

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$$\mathcal{F}_1 = \{CAT()\}$$

2. 
$$\mathcal{F}_2 = \{CAT(), MAMMAL()\}$$

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- $\mathcal{F} = \{PERSON(alice)\}$
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- 4.  $\mathcal{F}_4 = \{PERSON(alice), PARENT(alice, Y), PERSON(Y), PARENT(Y, Y')\}$

#### With:

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. . .

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When it is not finite it sometimes has a regularity that allows for decidable OWQA.

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And in general the OWQA is undecidable...

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• GTGD, one atom in the body guards all variables

$$A(x, y, z) \wedge B(x) \wedge C(y, z) \rightarrow \exists w, D(x, y, w)$$

#### **Decidable Classes of TGD**

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FGTGD, one atom in the body guards all the frontier variables

$$A(w, y, y) \wedge B(x) \wedge C(y, z) \rightarrow \exists u, D(x, y, u)$$

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• FGTGD, one atom in the body guards all the frontier variables

$$A(w, y, y) \wedge B(x) \wedge C(y, z) \rightarrow \exists u, D(x, y, u)$$

 Fr1LTGD, one atom in the body guards the only frontier variable

$$A(w, y, y) \land B(x) \land C(y, z) \rightarrow \exists u, D(x, u)$$

## Another approach: query rewriting

#### With

- $MAMMAL(X) \rightarrow ANIMAL(X)$
- $CAT(X) \rightarrow MAMMAL(X)$

And the query  $\exists X, ANIMAL(X)$ , we obtain:

• ANIMAL(X)

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- $ANIMAL(X) \lor MAMMAL(X) \lor CAT(X)$

# Solving our problem

### Back to our problems

#### **View Problem**

Given (schema, constraints  $\mathcal{C}$ , views  $\mathcal{V}$ , secret  $\mathcal{S}$ , visible  $\bigcirc$ ) do we have  $\bigcirc$  such that  $\mathcal{C}(\bigcirc)$ ,  $\mathcal{V}(\bigcirc) = \bigcirc$  and  $\neg \mathcal{S}(\bigcirc)$ ?

#### Schema Problem

Given (schema, constraints  $\mathcal{C}$ , views  $\mathcal{V}$ , secret  $\mathcal{S}$ ) do we have for all

an instance such that 
$$\mathcal{C}(\ )$$
,  $\mathcal{V}(\ )=\mathcal{V}(\ )$  and

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## Solving the schema problem

#### The critical instance

The instance  $\bigcirc_{C}$  contains one fact per relation, with one constant: C.

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The instance  $\bigcirc_{\mathsf{C}}$  contains one fact per relation, with one constant: C. We note  $\bigcirc_{\mathsf{C}} = \mathcal{V}(\bigcirc_{\mathsf{C}})$  its view image.

### Solving the schema problem

#### The critical instance

The instance  $\bigcirc_{\rm C}$  contains one fact per relation, with one constant: C. We note  $\bigcirc_{\rm C}=\mathcal{V}(\bigcirc_{\rm C})$  its view image.

#### Reduction for schema problem

 $SchemaProblem(\mathcal{C}, \mathcal{V}, \mathcal{S})$  reduces to  $ViewProblem(\bigcirc_{\mathbb{C}}, \mathcal{C}, \mathcal{V}, \mathcal{S})$ 

From Querying Visible and Invisible Information. LICS 2016

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- A query Q

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 $\bullet$  The query is  ${\cal S}$ 

Encoding  $ViewProblem(\bigcirc_{\mathbf{C}}, \mathcal{C}, \mathcal{V}, \mathcal{S})$  as OWQA

- ullet The query is  ${\cal S}$
- The initial facts encode the forward constraints



## Encoding $ViewProblem(\bigcirc_{c}, \mathcal{C}, \mathcal{V}, \mathcal{S})$ as OWQA

- ullet The query is  ${\cal S}$
- The initial facts encode the forward constraints



ullet The constraints are the original constraints  ${\cal C}.$ 

## Encoding $ViewProblem(\bigcirc_{c}, \mathcal{C}, \mathcal{V}, \mathcal{S})$ as OWQA

- ullet The query is  ${\cal S}$
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$$\bigcirc_{\mathcal{C}} \subseteq \mathcal{V}(\bigcirc)$$

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But we also need to encode the backward constraints  $\mathcal{V}(\square) \subseteq \bigcirc_{\mathbb{C}}!$ 

## Encoding $ViewProblem(\bigcirc_{\mathbb{C}}, \mathcal{C}, \mathcal{V}, \mathcal{S})$ as OWQA

- ullet The query is  ${\cal S}$
- The initial facts encode the forward constraints

$$\bigcirc_{\mathcal{C}} \subseteq \mathcal{V}(\bigcirc)$$

ullet The constraints are the original constraints  $\mathcal{C}.$ 

But we also need to encode the backward constraints  $\mathcal{V}(\square) \subseteq \bigcirc_{\mathbb{C}}!$ 

For this we use that  $adom(\mathcal{V}(\square)) = \{C\}$ 

#### Lower bounds

Various reductions from:

• OWQA

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Various reductions from:

- OWQA
- Query evaluation

#### Lower bounds

#### Various reductions from:

- OWQA
- Query evaluation
- Alternating Turing Machines

Constraints	Views	ProjMap	AtomMap	GuardedMap	CQMap
IncDep		PSPACE	EXPTIME	2ExpTime	2ExpTime
LTGD		ExpTime	EXPTIME	2ExpTime	2ExpTime
GTGD		2ExpTime	2ExpTime	2ExpTime	2ExpTime
FGTGD		2ExpTime	2ExpTime	2ExpTime	2ExpTime

Table 1: Complexity of disclosure

 $\Rightarrow$  all bounds are *tight*!

Constraints	Views	ProjMap	AtomMap	GuardedMap	CQMap
IncDep		NP	NP	EXPTIME	2ExpTime
LTGD		NP	NP	EXPTIME	2ExpTime
GTGD		EXPTIME	EXPTIME	EXPTIME	2ExpTime
FGTGD		2ExpTime	2ExpTime	2ExpTime	2ExpTime

Table 2: Complexity of disclosure in bounded arity

 $\Rightarrow$  all bounds are *tight*!

#### In PTIME:

• CQ secret, foreign keys constraints and projection views

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#### In PTIME:

- CQ secret, foreign keys constraints and projection views
- bounded CQ secret, ProjMap, LTGD

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#### **Future Works**

• Implement model checker for publication methods.

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#### **Future Works**

- Implement model checker for publication methods.
- How to synthesize publications automatically?

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## Thank you!

Questions?