### Querying Clique Guarded Existential Rules

Sen Zheng, Renate A. Schmidt

University of Manchester

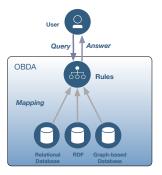
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### Ontology Based Data Access



Ontology-based data access (OBDA) systems

- integrate schemas of heterogeneous databases
- present rules in decidable logics, e.g., description logics, guarded logics
- mainly concern answering queries

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#### Context

Answering Boolean conjunctive query (BCQ)

- Returns an yes/no to a query
- Query containment/equivalence/evaluation
- Widely studied in literatures, e.g., [2, 3, 4, 5, 7, 8]

Clique guarded existential rules (CGER):

- Decidable
- $\bullet$  Subsume Horn (loosely) guarded fragment and Horn- $\mathcal{ALCHOI}$
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Aim:

Give a BCQ q, a set of CGERs  $\Sigma$  and a set of ground facts  $\mathcal{D}$ , check whether  $\Sigma \cup \mathcal{D} \models q$ .

BCQ:  $q = \exists X \phi(X)$ 

 $\boldsymbol{\phi}$  is a conjunction of atoms containing only variables and constants.

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 $\mathsf{CGER}: \forall X \forall Y \phi(X, Y) \to \exists Z \psi(X, Z)$ 

- $\phi(X, Y)$  and  $\psi(X, Z)$  are conjunctions of atoms
- X is not an empty set in  $\exists Z\psi(X,Z)$
- each pair of free variables of  $\exists Z\psi(X,Z)$  co-occur in at least one atom of  $\phi(X,Y)$

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 $\forall xyzv_1v_2v_3(A_1(x, y, v_1) \land A_2(x, z, v_2) \land A_3(y, z, v_3) \rightarrow \exists wB(x, y, z, w))$ 

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#### **Decision Procedure**

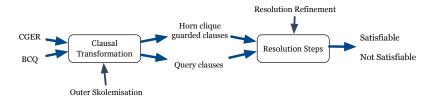


Figure: Procedure Overview

Three major steps to decide  $\Sigma \cup \mathcal{D} \cup \neg q$ :

- Clausal transformation
- Clause definement
- Resolution refinement

#### **Clausal Transformation**

1. Negating BCQ to obtain query clauses:

 $\exists xyz \ A(x,y) \land B(y,z) \text{ becomes } \neg A(x,y) \lor \neg B(y,z)$ 

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#### **Clausal Transformation**

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2. Using prenex normal form and outer Skolemisation to obtain Horn clique guarded clause (HCGC):

 $\forall xyzv_1v_2v_3(A_1(x, y, v_1) \land A_2(x, z, v_2) \land A_3(y, z, v_3) \rightarrow \exists wB(x, y, z, w))$  becomes

 $\neg A_1(x, y, v_1) \lor \neg A_2(x, z, v_2) \lor \neg A_3(y, z, v_3) \lor B(x, y, z, f_{xyzv_1v_2v_3})$  where f is a Skolem function.

## Query Clause and HCGC

Query clause: A negative clause containing only variables and constants.  $\neg A(x, y) \lor \neg B(y, z, a)$ 

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# Query Clause and HCGC

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Horn clique guarded clause *C*:

- condensed Horn clause
- simple

 $\rightarrow$  no nested non-ground compound terms

weakly covering

 $\rightarrow$  var(t) = var(C) for any non-ground compound term t

- there is a clique in some negative flat literals (aka guards)  $\rightarrow$  In  $C_1$ , a clique  $\{x, y, z\}$  co-occur with each other in one of guards
- variables in C all occur in guards G
   → var(G) = var(C)

 $C_1 = \neg A_1(x, y, v_1) \lor \neg A_2(x, z, v_2) \lor \neg A_3(y, z, v_3) \lor B(x, y, z, fxyzv_1v_2v_3)$ 

#### Loss of Weakly Covering Property

Example 1:

Given a set of HCGC  $C_1$ ,  $C_2$  and a query clause Q:

$$Q = \neg A_1(x, y) \lor \neg A_2(y, z) \\ C_1 = A_1(f_{x_1y_1}, x_1) \lor \neg G_1(x_1, y_1) \\ C_2 = A_2(g_{x_2y_2}, x_2) \lor \neg G_2(x_2, y_2)$$

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Perform resolution on  $Q, C_1, C_2$ :

the mgu is  $\{x \mapsto f(gx_2y_2, y_1), x_1, y \mapsto gx_2y_2, z \mapsto x_2\}$ , the resolvent is  $\neg G_1(g(x_2y_2), y_1) \lor \neg G_2(x_2, y_2)$ .

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$$\{x \mapsto f(gx_2y_2, y_1), x_1, y \mapsto gx_2y_2, z \mapsto x_2\}$$
,  
the resolvent is  $\neg G_1(g(x_2y_2), y_1) \lor \neg G_2(x_2, y_2)$ .

Neither a query clause nor a HCGC.

#### Term Depth Increase

Example 2:

Given a set of HCGC:

$$C = \neg A_1(x, y, v_1) \lor \neg A_2(y, z) \lor \neg A_3(z, x) \lor D(x, z)$$
  

$$C_1 = A_1(fx_1, x_1, x_1) \lor \neg G_1(x_1)$$
  

$$C_2 = A_2(gx_2, gx_2) \lor \neg G_2(x_2)$$
  

$$C_3 = A_3(x_3, fx_3) \lor \neg G_3(x_3)$$

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$$C_3 = A_3(x_3, f_{x_3}) \lor \neg G_3(x_3)$$

Perform resolution on  $C, C_1, C_2, C_3$ :

the mgu is  $\{x \mapsto fgx_2, y, z, x_1, x_3, v_1 \mapsto gx_2\}$ , the resolvent is  $\neg G_1(gx_2) \lor \neg G_2(x_2) \lor \neg G_3(gx_2) \lor D(fgx_2, gx_2)$ .

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• Order variables in the main premise by variable depth of their substitution.

 $\rightarrow \{x \mapsto fgx_2, y \mapsto gx_2, z \mapsto gx_2\}$ , hence  $x >_v y =_v z$ .

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- Apply resolution on selected literal. • Applying resolution on C,  $C_1$ ,  $C_3$  derives  $C_4 = \neg G_1(x_1) \lor \neg G_3(x_1) \lor \neg A_2(x_1, x_1) \lor D(fx_1, x_1)$

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Further application of resolution between  $C_2$  and  $C_4$  can be avoided using orderings.

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- Else find the maximal literal ¬A(x) ∨ B(gx)\*
- Else select all the negative literals containing top variables  $\neg A(x, y, v_1) \lor \neg B(y, z) \lor \neg C(z, x)$  if x is a top variable.

## Claims

Query-Res denotes the combination of:

- condensation
- tautology elimination
- ordered factoring defined by Query-Refine
- ordered resolution with selection defined by Query-Refine

#### Claim 1

Query-Res decides HCGCs and query clauses.

#### Claim 2

The combination of the previous clausal transformations and Query-Res decide the BCQ answering for CGERs.

### Conclusion and Ongoing Work

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TPTP contains 92 HCGC problems, among which 66 are non-propositional.

Among those 66 problems, 65 are Horn guarded clause, 1 is Horn loosely guarded but not guarded. No problem is HGGC but not a Horn loosely guarded clause.

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