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### Data Exchange 2

Lecture 6: Universal Solutions, Core, Certain Answers 25 November, 2015

> Foundations of Ontologies and Databases for Information Systems CS5130 (Winter 2015)

# Recap of Lecture 5

#### Data Exchange

- Specific semantic integration scenario for two data sources with possibly different schemata
- ▶ Mapping  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau}, M_{\tau})$ 
  - $\triangleright \sigma$ : source schema
  - τ: target schema
  - $M_{\sigma\tau}$ : source target dependencies (mostly: st-tgds)
  - $M_{\tau}$ : target dependencies
- ▶ Ultimate aim: For given  $\sigma$  instance find appropriate  $\tau$  instance (solution) to do query answering on it
- ▶ SOLEXISTENCE<sub>M</sub>: Is there a solution for a given  $\mathcal{M}$
- Chase construction for finding solutions
- Chase construction gives sufficient and necessary condition if termination is guaranteed
- ► Termination with weakly acyclic dependencies

End of Recap

## Universal Solutions

#### What are Good Solutions?

- We are seeking universal solutions: they represent all other ones
- ► A solution 𝒯 may contain NULLs
- ▶ A DB instance is **complete** iff it does not contain NULLs
- $ightharpoonup Rep(\mathfrak{T}) = \text{all complete DBs instances that represent } \mathfrak{T}$
- Explicate "represent" by homomorphism notion
- ► Now formally define

$$Rep(\mathfrak{T}) = \{\mathfrak{T}' \mid \text{There is } h : \mathfrak{T} \xrightarrow{hom} \mathfrak{T}' \text{ for complete } \mathfrak{T}'\}$$

#### Homomorphism

- Intuitively, homomorphisms are structure preserving mappings
- Defined here for DB instances but similarly definable for arbitrary structures

#### Definition

A Homomorphism  $h: \mathfrak{T} \xrightarrow{hom} \mathfrak{T}'$  is a map

$$h: Var(\mathfrak{T}) \cup CONST \rightarrow VAR(\mathfrak{T}') \cup CONST$$

s.t.

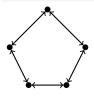
- ▶ h(c) = c for all  $c \in CONST$  and
- if  $R(\vec{t}) \in \mathfrak{T}$ , then  $R(h(\vec{t})) \in \mathfrak{T}'$

#### Wake-Up Exercise

Consider two instances that are graphs, namely

- $\mathfrak{G} = \text{cycle on 5 nodes with marked nulls } \nu_1, \dots, \nu_5$
- $\mathfrak{G}'$  = cycle on 3 nodes with marked nulls  $\nu_1', \nu_2', \nu_3'$ .

Give examples of a mapping  $h: \mathfrak{G} \to \mathfrak{G}'$  that is a homomorphism, resp. not a homomorphism.





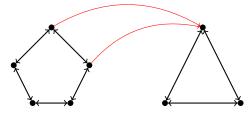
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#### no homomorphism

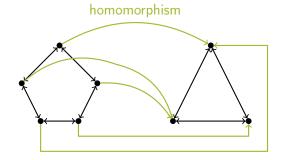


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#### Universal Solutions

 There are three equivalent characterizations of universal solutions

#### Definition (Universal Solution)

1. Solution  $\mathfrak T$  describing all others

$$\{\mathfrak{T}'\in SOL_{\mathcal{M}}(\mathfrak{S})\mid \mathfrak{T}' \text{ complete}\}\subseteq \textit{Rep}(\mathfrak{T})$$

2. Solution  $\mathfrak{T}$  general as all others

$$Rep(\mathfrak{T}') \subseteq Rep(\mathfrak{T})$$
 for every  $\mathfrak{T}' \in SOL_{\mathcal{M}}(\mathfrak{S})$ 

3. Solution  ${\mathfrak T}$  mapping homomorphically into others

For all 
$$\mathfrak{T}' \in SOL_{\mathcal{M}}(\mathfrak{S})$$
 there is  $h : \mathfrak{T} \xrightarrow{hom} \mathfrak{T}'$ 

#### Example (Universal Solution)

```
Source DB
                                                        Target DB
  Flight (
             src. dest, airl, dep
                                                          Routes( fno, src, dest )
               paris sant.
                                 airFr
                                           2320
                                                          Info( fno, dep, arr,
      Dependencies M_{\sigma\tau}
        Flight(src, dest, airl, dep) \longrightarrow
           \exists fno \exists arr(Routes(fno, src, dest) \land Info(fno, dep, arr, airl))
       \tau solutions
                      = {Routes(\perp_1, paris, sant), Info(\perp_1, 2320, \perp_2, airFr)}
                     = \{Routes(\bot_1, paris, sant), Info(\bot_1, 2320, \bot_1, airFr)\}
                 \mathfrak{T}'' = \{Routes(123, paris, sant), Info(123, 2320, 930, airFr)\}

ightharpoonup \mathfrak{T} is a universal solution, \mathfrak{T}' and \mathfrak{T}'' are not
```

#### Example (Non-existence of Universal Solutions)

- $M_{\sigma\tau} = \{ E(x,y) \rightarrow G(x,y) \}$
- $M_{\tau} = \{ G(x,y) \rightarrow \exists z \ L(y,z), \quad L(x,y) \rightarrow \exists z \ G(y,z) \}$
- ▶ Source instance  $\mathfrak{S} = \{E(a, b)\}$
- $ightharpoonup \mathfrak{T} = \{G(a,b), L(b,a)\}$  is a solution
- ▶ But there is no universal solution

#### Proof sketch (by contradiction)

- A universal solution must have an infinite sequence  $(\mathfrak{S}, \{G(a,b), L(b,\nu_1), G(\nu_1,\nu_2), L(\nu_2,\nu_3), G(\nu_3,\nu_4)\dots\})$
- As  $\mathfrak{T}$  is finite there must be some identification of an  $\nu_i$  with a or b or with another  $\nu_i$
- ► In any case a contradiction follows

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#### Undecidability of Universal Solution Existence

#### UNISOLEXISTENCE $_{\mathcal{M}}$

- ▶ Input: A source instance 𝔝
- ▶ Output: Is there a universal solution for  $\mathfrak{S}$  under  $\mathcal{M}$ ?
- Allowing arbitrary dependencies leads to undecidability
- Shown by of reduction of halting problem

#### $\mathsf{Theorem}$

There exists a relational mapping  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau}, M_{\tau})$  s.t. UNISOLEXISTENCE<sub>M</sub> is undecidable

▶ Proof in book of Arenas et al. 5 pages long, so ... we do not show it here

#### By the way: There are Longer Proofs

- Recent example: A computer aided proof for the Erdős
   Discrepancy Problem (EDP) by Alexei Lisitsa and Boris Konev
- ▶ File containing the proof about 13 GB
- Lit: B. Konev and A. Lisitsa. Computer-aided proof of erdos discrepancy properties. Artif. Intell., 224(C):103? 118, July 2015.
- Lit: https://rjlipton.wordpress.com/2014/02/28/practically-pnp/

#### Desiderata

- ► Due to the undecidabiltiy result one has to constrain dependencies
- ► Constraints such that the following are fulfilled:
  - (C1) Existence of solutions entails existence of universal solutions
  - (C2) UNIVSOLEXISTENCE decidable and even tractable
  - (C3) If a solutions exists, then universal solutions should be constructible in polynomial time

#### Chase Helps Again

#### **Theorem**

Results of successful chase sequences are universal solutions (and sometimes called **canonical** solutions).

#### **Proof Sketch**

- Have to show only universality of chase T
- Use the third definition
- Let  $\mathfrak{T}'$  be any solution
- ► Lemma: Adding facts in chase step preserves homomorphism
- Argue inductively starting from empty homomorphism
- Distinguish between tgd and egd

#### Nice Properties of Universal Solutions

#### **Theorem**

Let  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau}, M_{\tau})$  be a mapping where  $M_{\tau}$  is the union of egds and weakly acyclic tgds. Then:

- ▶ UNISOLEXISTENCE<sub>M</sub> can be solved in PTIME (C2).
- ▶ And if solutions exist, then a universal solutions exist (C1),
- ▶ and a canonical solution can be computed in polynomial time (C3).

$$M_{\sigma\tau} = \{ P(x) \rightarrow \exists z \exists w (E(x,y) \land E(x,w)) \}$$

$$M_{\tau} = \{ \underbrace{E(x,y) \to \exists z \ F(y,z)}_{\chi_1}, \underbrace{E(x,y) \land E(x,y') \to y = y'}_{\chi_2} \}$$

- ▶ Source instance  $\mathfrak{S} = \{P(a)\}$
- ▶ First step:  $\mathfrak{T} = \{E(a, \bot_1), E(a, \bot_2)\}$
- ► Two different solutions
  - Apply  $\chi_1$ , then  $\chi_2$ :

$$T_1 = \{E(a, \perp_1), F(\perp_1, \perp_3)\}, F(\perp_1, \perp_4)\}$$

ightharpoonup Apply  $\chi_2$ , then  $\chi_1$ 

$$T_2 = \{E(a, \perp_1), F(\perp_1, \perp_2)\}\$$

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▶ Apply  $\chi_2$ , then  $\chi_1$ :

$$T_2 = \{E(a, \perp_1), F(\perp_1, \perp_2)\}\$$

#### Non-uniqueness

- Non-uniqueness no serious problem as all universal solutions are good
- Nonetheless one can show

#### Proposition

Let  $\mathcal{M}=(\sigma,\tau,M_{\sigma\tau},M_{\tau})$  be a mapping s.t.  $M_{\tau}$  consists of egds only. Then every source instance  $\mathfrak S$  has a unique canonical solution  $\mathfrak T$  (up to a reaming of NULLS) under  $\mathcal M$ .

## The Core

#### Running Example: Flight Domain

```
Source DB \sigma
                                             Canonical Solution T
         city,
 Geo(
                  coun.
                           pop
                                               Routes(
                                                         fno. src. dest
         paris,
                 france.
                           2M
                                                          \perp_1, paris,
                                                                         amst.
                                                          \perp_3, paris,
                                                                         amst.
 Flight (
                   dest.
                          airl,
                                     dep
            src.
                            KLM
                                    1410
                                               Info(
                                                              dep,
                                                                             airl
            paris
                   amst.
                                                      fno.
                                                                      arr.
                                                       \perp_1, 1410, \perp_2
            paris
                            KLM
                                    2230
                                                                            klm
                   amst.
                                                       \perp_1, 2320, \perp_2
                                                                            klm
                                                         airl, city,
                                               Serves(
                                                                         coun.
                                                                                  phone
                                                         klm,
                                                                paris,
                                                                         france.
                                                                                    \perp_5
                                                         klm,
                                                                paris.
                                                                         france.
```

#### Mapping rules $M_{\sigma\tau}$

- 1. Flight(src, dest, airl, dep)  $\longrightarrow$   $\exists$  fno  $\exists$  arr(Routes(fno, src, dest)  $\land$  Info(fno, dep, arr, airl))
- 2. Flight(src, dest, airl, dep)  $\land$  Geo(city, coun, pop)  $\longrightarrow$   $\exists$  phone(Serves(airl, city, coun, phone)
- 3. Flight(src, city, airl, dep)  $\land$  Geo(city, coun, pop)  $\longrightarrow$   $\exists$  phone (Serves(airl, city, coun, phone)

#### Running Example: Flight Domain

```
Source DB \sigma
                                                Smallest Solution T*
          city,
 Geo(
                   coun.
                            pop
                                                 Routes(
                                                            fno, src, dest
         paris,
                  france.
                             2M
                                                            \perp_1, paris,
                                                                           amst.
                                                            \perp_3, paris,
                                                                           amst.
 Flight (
                    dest.
                           airl,
                                      dep
             src.
            paris
                             KLM
                                      1410
                                                 Info(
                                                                dep,
                                                                                airl
                    amst.
                                                        fno.
                                                                         arr.
                                                         \perp_1, 1410, \perp_2
            paris
                             KLM
                                      2230
                                                                                klm
                    amst.
                                                         \perp_1, 2320, \perp_2
                                                                                klm
                                                           airl, city,
                                                 Serves(
                                                                            coun.
                                                                                      phone
                                                           klm,
                                                                   paris,
                                                                           france.
                                                                                       \perp_5
                                                           klm.
                                                                   <del>paris.</del>
                                                                           france.
                                                                                       16
```

#### Mapping rules $M_{\sigma\tau}$

- 1.  $\begin{array}{l} \textit{Flight}(\textit{src}, \textit{dest}, \textit{airl}, \textit{dep}) \longrightarrow \\ \exists \textit{fno} \ \exists \ \textit{arr}(\textit{Routes}(\textit{fno}, \textit{src}, \textit{dest}) \land \textit{Info}(\textit{fno}, \textit{dep}, \textit{arr}, \textit{airl})) \end{array}$
- 2. Flight(src, dest, airl, dep)  $\land$  Geo(city, coun, pop)  $\longrightarrow$   $\exists$  phone(Serves(airl, city, coun, phone)
- 3. Flight(src, city, airl, dep)  $\land$  Geo(city, coun, pop)  $\longrightarrow$   $\exists$  phone (Serves(airl, city, coun, phone)

#### Better than Universal? The Core?

- Universal solutions may still contain redundant information
- Seeking for smallest universal solutions: cores
- ▶  $\mathfrak{T}'$  is subinstance of  $\mathfrak{T}$ , for short  $\mathfrak{T}' \subseteq \mathfrak{T}$ , iff  $R^{\mathfrak{T}'} \subseteq R^{\mathfrak{T}}$  for all relation symbols R

#### Definition

A subsinstance  $\mathfrak{T}'\subseteq\mathfrak{T}$  is a **core** of  $\mathfrak{T}$  iff there is  $h:\mathfrak{T}\xrightarrow{hom}\mathfrak{T}'$  but there is not a homomorphism from  $\mathfrak{T}$  to a proper subinstance of  $\mathfrak{T}'$ .

► Intuitively: An instance can be retracted (structure preservingly) to its core but not further

#### Properties of Cores

#### Definition

A subinstance  $\mathfrak{T}'\subseteq\mathfrak{T}$  is a **core** of  $\mathfrak{T}$  iff there is  $h:\mathfrak{T}\xrightarrow{hom}\mathfrak{T}'$  but there is not a homomorphism from  $\mathfrak{T}$  to a proper subinstance of  $\mathfrak{T}'$ .

#### Proposition

- 1. Every instance has a core.
- All cores of the same instance are isomorphic (same up to renaming of NULLs) (⇒ Talk of the core justified)
- 3. Two instances are homomorphically equivalent iff their cores are isomorphic
- 4. If  $\mathfrak{T}'$  is core of  $\mathfrak{T}$ , then there is  $h:\mathfrak{T}\xrightarrow{hom}\mathfrak{T}'$  s.t.  $h(\nu)=\nu$  for all  $\nu\in DOM(\mathfrak{T}')$

#### Main Theorem for Cores

#### $\mathsf{Theorem}$

- 1. If  $\mathfrak{T} \in SOL_{\mathcal{M}}(\mathfrak{S})$ , then also  $core(\mathfrak{T}) \in SOL_{\mathcal{M}}(\mathfrak{S})$
- 2. If  $\mathfrak{T} \in UNIVSOL_{\mathcal{M}}(\mathfrak{S})$  then also  $core(\mathfrak{T}) \in UNIVSOL_{\mathcal{M}}(\mathfrak{S})$
- 3. If  $UNIVSOL_{\mathcal{M}}(\mathfrak{S}) \neq \emptyset$ , then all  $\mathfrak{T} \in UNIVSOL_{\mathcal{M}}(\mathfrak{S})$  have same core (up to renaming of NULLs), and the core of any universal solution is the smallest universal solution

#### Computing the Core

- ▶ Easy Case: No tgds in  $M_{\tau}$
- ▶ Simple algorithm COMPUTECORE(M)
  - ▶ Assume 𝒢 has successful sequence with result 𝔾.
  - ▶ If  $\mathfrak{T} = fail$ , then also the output fail
  - ▶ Otherwise: remove facts as long as  $M_{\sigma\tau}$  fulfilled.

#### $\mathsf{Theorem}$

If chase not fails, then  $COMPUTECORE(\mathcal{M})$  outputs core of universal solutions in polynomial time.

- Algorithm works as egds satisfactions preserved for subinstances
- lacktriangle More sophisticated methods needed in presence of tgds in  $M_ au$

#### The Core

- Core has nice properties: Uniqueness
- But may be more costly to compute than universal canonical solution
- ► In the end: We want to use solution for QA—and for this canonical universal solutions suffice

# Query Answering

#### Certain Answers

- Given mapping  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau}, M_{\tau})$
- Semantics of query answering specified as certain answer semantics

#### Definition

The **certain answers** of query Q over  $\tau$  for given instance  $\mathfrak S$  is defined as

$$\mathit{cert}_{\mathcal{M}}(\mathit{Q},\mathfrak{S}) = \bigcap \{\ \mathit{Q}(\mathfrak{T}) \mid \mathfrak{T} \in \mathit{SOL}_{\mathcal{M}}(\mathfrak{S})\ \}$$

- ▶ Note:  $Q(\mathfrak{T})$  gives set of tuples of constants from  $\mathfrak{S}$
- Definition does not tell how to actually compute the certain answers
- ▶ In many cases it is not necessary to compute all solutions to get certain answers

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# Algorithmic Problems for Certain Answers

## Problem: $CERTAIN_{\mathcal{M}}(Q)$

Input: Source instance  $\mathfrak{S}$  and tuple of elements  $\vec{t} \in DOM(\mathfrak{S})$ Output: Answer whether  $\vec{t} \in certain_{\mathcal{M}}(Q, \mathfrak{S})$ 

- Again, to guarantee tractability or even decidability one has to restrict the involved components
  - ► Constrain query language (e.g., from FOL to CQs)
  - ► Constrain dependencies (e.g., to weakly acyclic TGDs)

### Proposition

There is an FOL query Q and a  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau})$  s.t. CERTAIN $_{\mathcal{M}}(Q)$  is undecidable.

# Answering Conjunctive Queries (CQs)

Conjunctive queries (CQs)

$$Q(\vec{x}) = \exists \vec{y} \ (\alpha_1(\vec{x_1}, \vec{y_1}) \land \cdots \land \alpha_n(\vec{x_n}, \vec{y_n}))$$

▶ Unions of conjunctive queries (UCQs)

$$Q(\vec{x}) = CQ_1(\vec{x}) \lor \cdots \lor CQ_n(\vec{x})$$

► Crucial Property: (U)CQs are preserved under homomorphisms

## Proposition

Let  $h: \mathfrak{S} \xrightarrow{hom} \mathfrak{S}'$  and Q be a UCQ. Then:

$$Q(\mathfrak{S}) \subseteq Q(\mathfrak{S}')$$

(In detail: for all tuples of constants: If  $\vec{a} \in Q(\mathfrak{S})$ , then  $\vec{a} \in Q(\mathfrak{S}')$ 

Follows easily from homomorphism definition

As a corollary one immediately gets also preservation for certain query answering.

### Proposition

Let  $h: \mathfrak{S} \xrightarrow{hom} \mathfrak{S}'$  and Q be a UCQ. Then:

 $certain(Q,\mathfrak{S})\subseteq certain(Q,\mathfrak{S}')$ 

# Certain Answering UCQs

#### **Theorem**

Let  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau}, M_{\tau})$  be a mapping where  $M_{\tau}$  is a union of egds and weakly acyclic tgds and let Q be a UCQ.

Then  $CERTAIN_{\mathcal{M}}(Q)$  can be solved in PTIME.

#### **Proof Sketch**

- ▶ Consider naive evaluation strategy  $Q_{naive}$ 
  - Let  ${\mathfrak T}$  arbitrarily chosen universal solution
  - ▶ Treat marked NULLS in 𝒯 as constants.
  - ▶ Calculate  $Q(\mathfrak{T})$  under this perspective
  - ightharpoonup and then eliminate all tuples from  $Q(\mathfrak{T})$  containing a NULL
- ▶ Now one can show  $certain_{\mathcal{M}}(Q,\mathfrak{S}) = Q_{naive}(\mathfrak{T}).$

Showing 
$$certain_{\mathcal{M}}(Q,\mathfrak{S})=Q_{naive}(\mathfrak{T})$$

- ▶ We know that a universal solution 𝒯 can be constructed in polynomial time.
- ▶ For every  $\mathfrak{T}' \in SOL_{\mathcal{M}}$  there is  $\mathfrak{T} \xrightarrow{hom} \mathfrak{T}'$
- ▶ NULL-free tuples in  $Q(\mathfrak{T}) \subseteq \bigcap_{\mathfrak{T}' \in SOL_{\mathcal{M}}}$  NULL-free tuples in  $Q(\mathfrak{T}')$
- Answering FOL queries (and so of UCQs) computable in PTIME data complexity

# QA for other classes of Queries

 Proof above used a simple strategy for certain answering by naive evaluation

### Naive Evaluation Strategy

$$cert(\mathfrak{S},Q)=Q_{naive}(\mathfrak{T})$$

where  $\mathfrak{T}$  is a (universal) solution

- $\blacktriangleright$  This strategy works also for Datalog programs as constraints for the target schema  $\tau$ 
  - Reason: Datalog programs are preserved under homomorphisms
  - ► Even if one adds inequalities, naive evaluation works
  - Hence certain answering is here in PTime

# Rewritability

- ▶ Naive evaluation is a form of rewriting
- ► Fundamental method that re-appears in different areas of CS
- ► Rewrite a query w.r.t. a given KB into a new query that "contains" the knowledge of KB
- Challenges
  - Preserve the semantics in the rewriting process
  - ► The language of the output query is constraint to a "simple language" (so rewritability not always guaranteed)

### Definition (FOL Rewritability)

Let  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau}, M_{\tau})$  be a mapping and let Q be a quer over  $\tau$ .

Then Q is said to be **FOL-rewritable** over the canonical universal solution under  $\mathcal{M}$  if there is a FOL query  $Q_{rew}$  over  $\tau^{C}$  such that

$$certain_{\mathcal{M}}(Q,\mathfrak{S})=Q_{rew}(\mathfrak{T})$$

- ▶ Here  $\tau^C = \tau \cup \{C\}$  where unary predicate C depicts all constants (not NULLs) in targets
- Works like a type predicate

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There is **one** rewriting for any given pair of source  $\mathfrak S$  and universal solution  $\mathfrak T$ 

- ► The known component is the mapping M
- lacktriangle The unknown components are all pairs  $(\mathfrak{S},\mathfrak{T})$

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If in definition one talk about cores  $\mathfrak T$  instead of universal solutions then Q is said to be **FOL rewritable over cores** 

### Theorem

FOL rewritability over core  $\models$  FOL rewritability over universal sol., but not vice versa.

### Definition (FOL Rewritability)

Let  $\mathcal{M} = (\sigma, \tau, M_{\sigma\tau}, M_{\tau})$  be a mapping and let Q be a quer over  $\tau$ .

Then Q is said to be **FOL-rewritable** over the canonical universal solution under  $\mathcal{M}$  if there is a FOL query  $Q_{rew}$  over  $\tau^{C}$  such that

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#### Example

- ▶  $Q(\vec{x})$ : a conjunctive query
- $Q_{rew}$ :  $Q(\vec{x}) \wedge C(x_1) \wedge \cdots \wedge C(x_n)$
- lacktriangle The rewriting is even independent of  ${\mathcal M}$

# Adding Negations to Query Language

- Negations in query languages lead to lose of naive rewriting technique
- ► Even if one allows only negation in inequalities

## Definition (Conjunctive Queries with inequalities CQ<sup>\neq</sup>)

A conjunctive query with inequalities is a query of the form

$$Q(\vec{x}) = \exists \vec{y} \ (\alpha_1(\vec{x_1}, \vec{y_1}) \land \cdots \land \alpha_n(\vec{x_n}, \vec{y_n}))$$

where  $\alpha_i$  is either an atomic relational formula or an inequality  $z_i \neq z_j$ .

```
Source DB
                                                         Target DB
  Flight (
                        dest.
                                  airl.
               src.
                                            dep
                                                           Routes( fno, src,
                                                                                         dest
               paris
                                  airFr
                                            2320
                        sant.
                                                           Info(
                                                                    fno, dep,
                                                                                       arr,
                                            2200
               paris
                        sant.
                                   lan
       Dependencies M_{\sigma\tau}
         Flight(src, dest, airl, dep) \longrightarrow
           \exists fno \exists arr(Routes(fno, src, dest) \land Info(fno, dep, arr, airl))
   • Query Q(x,z) = \exists y \exists y' (Routes(y,x,z) \land Routes(y',x,z) \land y \neq y')
   ▶ But: cert(Q(x,z),\mathfrak{S})_{\mathcal{M}} = \emptyset because there is a solution
```

```
Source DB
                                                            Target DB
  Flight (
                         dest.
                                   airl.
                src.
                                               dep
                                                               Routes( fno, src, dest
                paris
                                    airFr
                                              2320
                          sant.
                                                               Info( fno, dep, arr,
                                     lan
                                              2200
                paris
                          sant.
       Dependencies M_{\sigma\tau}
         Flight(src, dest, airl, dep) \longrightarrow
            \exists fno \exists arr(Routes(fno, src, dest) \land Info(fno, dep, arr, airl))
      Any universal solution \mathfrak{T}' contains solution \tau solutions
                   \mathfrak{T} = \{ Routes(\bot_1, paris, sant), Info(\bot_1, 2320, \bot_2, airFr), \}
                                 Routes(\perp_3, paris, sant), Info(\perp_3, 2320, \perp_4, Ian) }
   • Query Q(x,z) = \exists y \exists y' (Routes(y,x,z) \land Routes(y',x,z) \land y \neq y')

ightharpoonup Q_{naive}(\mathfrak{T}') = \{(paris, sant)\}
   ▶ But: cert(Q(x,z),\mathfrak{S})_{\mathcal{M}} = \emptyset because there is a solution
```

#### Source DB Target DB Flight ( airl. src. dest. dep Routes( fno, src, dest paris airFr 2320 sant. Info( fno, dep, arr, lan 2200 paris sant. Dependencies $M_{\sigma\tau}$ $Flight(src, dest, airl, dep) \longrightarrow$ $\exists fno \exists arr(Routes(fno, src, dest) \land Info(fno, dep, arr, airl))$ Any universal solution $\mathfrak{T}'$ contains solution $\tau$ solutions $\mathfrak{T} = \{ Routes(\bot_1, paris, sant), Info(\bot_1, 2320, \bot_2, airFr), \}$ Routes( $\perp_3$ , paris, sant), Info( $\perp_3$ , 2320, $\perp_4$ , Ian) } • Query $Q(x,z) = \exists y \exists y' (Routes(y,x,z) \land Routes(y',x,z) \land y \neq y')$ $ightharpoonup Q_{naive}(\mathfrak{T}') = \{(paris, sant)\}$ ▶ But: $cert(Q(x,z),\mathfrak{S})_{\mathcal{M}} = \emptyset$ because there is a solution

#### Target DB Source DB Flight ( airl. src. dest. dep Routes( fno, src, dest paris airFr 2320 sant. Info( fno, dep, arr, 2200 paris sant. lan Dependencies $M_{\sigma\tau}$ $Flight(src, dest, airl, dep) \longrightarrow$ $\exists fno \exists arr(Routes(fno, src, dest) \land Info(fno, dep, arr, airl))$ Any universal solution $\mathfrak{T}'$ contains solution $\tau$ solutions $\mathfrak{T} = \{ Routes(\bot_1, paris, sant), Info(\bot_1, 2320, \bot_2, airFr), \}$ Routes( $\perp_3$ , paris, sant), Info( $\perp_3$ , 2320, $\perp_4$ , Ian) } • Query $Q(x,z) = \exists y \exists y' (Routes(y,x,z) \land Routes(y',x,z) \land y \neq y')$ $ightharpoonup Q_{naive}(\mathfrak{T}') = \{(paris, sant)\}$ (for any universal solution $\mathfrak{T}'$ ) ▶ But: $cert(Q(x,z),\mathfrak{S})_{\mathcal{M}} = \emptyset$ because there is a solution

#### Source DB

#### Target DB

▶ Dependencies  $M_{\sigma\tau}$ 

$$\begin{aligned} &\textit{Flight}(\textit{src}, \textit{dest}, \textit{airl}, \textit{dep}) \longrightarrow \\ &\exists \textit{fno} \ \exists \ \textit{arr}(\textit{Routes}(\textit{fno}, \textit{src}, \textit{dest}) \land \textit{Info}(\textit{fno}, \textit{dep}, \textit{arr}, \textit{airl})) \end{aligned}$$

Any universal solution  $\mathfrak{T}'$  contains solution  $\tau$  solutions

$$\mathfrak{T} = \{ Routes(\bot_1, paris, sant), Info(\bot_1, 2320, \bot_2, airFr), Routes(\bot_3, paris, sant), Info(\bot_3, 2320, \bot_4, lan) \}$$

- Query  $Q(x,z) = \exists y \exists y' (Routes(y,x,z) \land Routes(y',x,z) \land y \neq y')$
- $Q_{\text{naive}}(\mathfrak{T}') = \{(paris, sant)\}$  (for any universal solution  $\mathfrak{T}'$ )
- ▶ But:  $cert(Q(x,z),\mathfrak{S})_{\mathcal{M}} = \emptyset$  because there is a solution

$$\mathfrak{T}'' = \{ Routes(\pm_1, paris, sant), Info(\pm_1, 2320, \pm_2, airFr), Info(\pm_1, 2320, \pm_2, Ian) \}$$

# CQ<sup>≠</sup> is in coNP

► In case of CQ<sup>≠</sup> one cannot even find a tractable possibility to certain answer them Answering

#### Theorem

Let  $\mathcal{M}=(\sigma,\tau,M_{\sigma\tau},M_{\tau})$  be a mapping where  $M_{\tau}$  is the union of egds and weakly acyclic tgds, and let Q be a  $UCQ^{\neq}$  query. Then:

 $CERTAIN_{\mathcal{M}}(Q)$  is in coNP

# Non-rewritability

► Generally it is not possible to decide whether rewritability holds

#### **Theorem**

For mappings without target constraints one can not decide whether a given FOL query is rewritable over the canonical solutions (over the core).

- Showing Non-FOL-rewritability can be done with locality tools
- Actually: One uses Hanf-locality of FOL
- Adaptation to DE setting

#### Not Covered

- Different semantics for query answering
  - Combinations of open-world (certain answers) and closed-word semantics
- ▶ Whole sub-field of mapping management
  - How to compose mappings
  - ► How to maintain mappings (e.g., w.r.t. consistency)
  - ► How to invert mappings: Get back source DB from target DB
- DE for non-relational DBs
  - e.g., DE for semi-structured data (XML)
  - different techniques needed

Exercise 5

# Exercise 5.1 (4 Points)

Prove the folklore proposition that conjunctive queries are preserved under homomorphisms.

# Exercise 5.2 (6 Points)

Complete the proof of the non-existence of a universal solution for the example given in the lecture.

## Example (Non-existence of Universal Solutions)

$$M_{\sigma\tau} = \{\underbrace{E(x,y) \to G(x,y)}_{\theta_1} \}$$

$$M_{\tau} = \{\underbrace{G(x,y) \to \exists z \ L(y,z)}_{\chi_1}, \underbrace{L(x,y) \to \exists z \ G(y,z)}_{\chi_2} \}$$

▶ Source instance  $\mathfrak{S} = \{E(a, b)\}$ 

# Exercise 5.3 (4 Points)

- 1. Prove that every finite graph has a core
- 2. Prove that two cores of the same graph are isomorphic