

3.3 Sets of conjunctive queries

- Let Q_1, Q_2, \dots, Q_n be conjunctive queries over a database schema \mathcal{R} as follows

$$ans(\vec{U}) \leftarrow R_{i1}(\vec{U}_{i1}), \dots, R_{in_i}(\vec{U}_{in_i}),$$

where $n_i \geq 1$ for $1 \leq i \leq n$.

- Let P_1, P_2, \dots, P_m be conjunctive queries also over \mathcal{R} as follows

$$ans(\vec{V}) \leftarrow S_{j1}(\vec{V}_{j1}), \dots, S_{jm_j}(\vec{V}_{jm_j}),$$

where $m_j \geq 1$ for $1 \leq j \leq m$.

- The answer-literals of Q 's and P 's have the same arity.

- Let $\mathcal{Q} = \{Q_1, Q_2, \dots, Q_n\}$ and $\mathcal{P} = \{P_1, P_2, \dots, P_m\}$ be sets of conjunctive queries.
- We have $\mathcal{Q} \sqsubseteq \mathcal{P}$, \mathcal{Q} is contained in \mathcal{P} iff for each instance \mathcal{I} of \mathcal{R} there holds:

$$\bigcup_{i=1, \dots, n} Q_i(\mathcal{I}) \subseteq \bigcup_{j=1, \dots, m} P_j(\mathcal{I}).$$

- Whenever $\mathcal{Q} \sqsubseteq \mathcal{P}$ and $\mathcal{P} \sqsubseteq \mathcal{Q}$, then \mathcal{P} and \mathcal{Q} are *equivalent*, $\mathcal{P} \equiv \mathcal{Q}$.

Example:

$Q_1 :$ $ans(X, Y) : -E(X, X), E(X, Y)$
 $Q_2 :$ $ans(X, Y) : -E(X, W), E(W, Y)$
 $Q_3 :$ $ans(X, Y) : -E(X, Y), E(X, U), E(U, Y)$

We have $Q_1 \sqsubseteq Q_3 \sqsubseteq Q_2$.

Moreover $\{Q_1, Q_2, Q_3\} \equiv \{Q_2, Q_3\} \equiv \{Q_2\}$.

Containment

A set \mathcal{Q} is contained in a set \mathcal{P} of queries, if any query in \mathcal{Q} is contained in at least one query of \mathcal{P} .

Is this condition necessary as well?

A *containment relation* is given as mapping Ω from \mathcal{Q} to \mathcal{P} as follows:

if $\Omega(Q_i) = P_j$, then $Q_i \sqsubseteq P_j$, where $1 \leq i \leq n$, $1 \leq j \leq m$.

Theorem

Let \mathcal{Q}, \mathcal{P} be sets of conjunctive queries. $\mathcal{Q} \sqsubseteq \mathcal{P}$ iff there exists a containment relation Ω from \mathcal{Q} to \mathcal{P} .

Proof

(1) A containment relation Ω exists. Then $\mathcal{Q} \sqsubseteq \mathcal{P}$.

(2) $\mathcal{Q} \sqsubseteq \mathcal{P}$.

Assume there exists a Q_i such that for all P_j there holds $Q_i \not\sqsubseteq P_j$. Construct a canonical instance \mathcal{I}_{Q_i} and let τ the corresponding canonical substitution.

As $\mathcal{Q} \sqsubseteq \mathcal{P}$, it follows

$$\tau(\text{ans}(\vec{U})) \in \bigcup_{j=1, \dots, m} P_j(\mathcal{I}_{Q_i}).$$

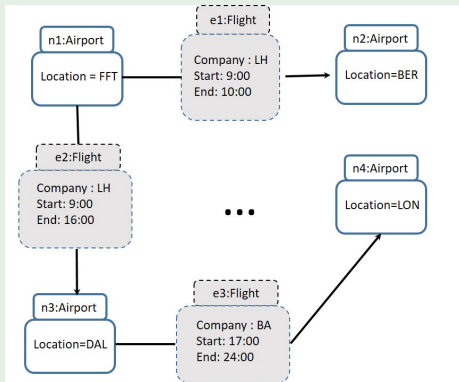
Therefore there exists $j', 1 \leq j' \leq m$, such that $\tau(\text{ans}(\vec{U})) \in P_{j'}(\mathcal{I}_{Q_i})$. However then $Q_i \sqsubseteq P_{j'}$, a contradiction.



3.4 Datalog

Snippet of a graph DB;

Query: `MATCH (X:Airport Location:"FFT") -[:Flight*]-> (Y:Airport) RETURN Y`



How can we compute the answers for arbitrary instances?

Datalog: Databases in logic.

- Queries are expressed as rules (akin to triggers in SQL).
- Fully logic-based query language - different to SQL - resembling the *Prolog* programming language; recurrently studied in database research.

Datalog Queries: Rules

- Queries are expressed as rules.
- A rule is an implication of the form

$$H(\vec{U}) \leftarrow L_1, \dots, L_n,$$

such that ($1 \leq i \leq n$):

- L_1, \dots, L_n are literals and $H(\vec{U})$ is an atom, where $H \in \mathcal{R}$.
- The L_i 's are atoms $R_i(\vec{U}_i)$ or negated atoms $\neg R_i(\vec{U}_i)$, where $R_i \in \mathcal{R}$ and \vec{U}, \vec{U}_i vectors of variables and constants.
- Left to \leftarrow is the head of the query, and to the right there is the *body*. The literals in the body are also called subgoals.
- A set of rules is called *program*.

Possible relational representation of a flight Graph DB instance

Relational schema: *Flight*[*Company*, *From*, *To*, *Start*, *End*];

Instance (specifying daily flight connections):

<i>Company</i>	<i>From</i>	<i>To</i>	<i>Start</i>	<i>End</i>
LH	FFT	BER	9:00	10:00
AA	ST	NY	9:30	16:00
LH	MUE	ROMA	10:00	12:00
BA	DAL	LON	17:00	24:00
LH	FFT	DAL	8:00	16:00
BA	LON	NY	10:00	15:00

Which destinations are reachable from Frankfurt (FFT) with direct flight connection?

$\text{FDest}(X) \leftarrow \text{Flight}(_, \text{'FFT'}, X, _, _)$

Note:

The placeholder “ $_$ ” is a shortcut for a unique (undistinguished) variable that appears only in the body of the rule.

Which destinations can be reached from Frankfurt (FFT) when starting at 9:00 and changing the plane at most once?

$\text{FDest9am}(X) \leftarrow \text{Flight}(_, \text{'FFT'}, X, \text{'9:00'}, _)$

$\text{FDest9am}(Y) \leftarrow \text{Flight}(_, \text{'FFT'}, X, \text{'9:00'}, _), \text{Flight}(_, X, Y, _, _)$

Which destinations can be reached from Frankfurt (FFT)? Recursion!

$\text{DestRec}(X) \leftarrow \text{Flight}(-, \text{'FFT'}, X, -, -)$
 $\text{DestRec}(Y) \leftarrow \text{DestRec}(X), \text{Flight}(-, X, Y, -, -)$

Which destinations can be reached from Frankfurt (FFT) taking only Lufthansa (LH) flights?

$\text{LHDestRec}(X) \leftarrow \text{Flight}(\text{'LH'}, \text{'FFT'}, X, -, -)$
 $\text{LHDestRec}(Y) \leftarrow \text{LHDestRec}(X), \text{Flight}(\text{'LH'}, X, Y, -, -)$

All destinations that can be reached from Frankfurt except those for which a Lufthansa-only (!) connection exists. Negation!

$\text{Destination}(X) \leftarrow \text{DestRec}(X), \neg \text{LHDestRec}(X)$

Formal Framework

Additional Definitions

Consider a Datalog rule of the form

$$H \leftarrow L_1, \dots, L_n$$

- If $n = 0$, then its body is empty and the rule is called *fact*
- Relation symbols that appear solely on the body of rules are called *extensional*; the remaining relational symbols are called *intensional*
- Accordingly, we distinguish between the extensional database (EDB) and the intensional database (IDB)

From Datalog Rules to Datalog Programs

- A set of rules ρ is called *program* Π .
- Let Π be a program. The *dependency graph* of Π is a directed, labeled digraph (V, E) containing two types of edges (positive and negative edges) defined as follows:
 - V is the set of relational symbols appearing in the rules of ρ
 - Let P be a relational symbol of a positive literal appearing in the body of some rule ρ in Π and let Q be the relational symbol of ρ 's head. Then the (positive) edge $P \rightarrow Q$ is contained in E .
 - Let P be the relational symbol of a negative literal appearing in the body of some rule ρ in Π and let Q be the relational symbol of ρ 's head. Then the (negative) edge $P \multimap Q$ is contained in E .
- We call a program *recursive*, if its dependency graph has a cycle.
- Note: the definition of recursiveness ignores edge labels; we will come back to these labels at a later point

Example: Dependency Graph

Consider the Datalog program Π defined by the rules

```
DestRec(X)  $\leftarrow$  Flight(_, 'FFT', X, _, _)  
DestRec(Y)  $\leftarrow$  DestRec(X), Flight(_, X, Y, _, _)  
NotDestRec(X)  $\leftarrow$  City(X),  $\neg$  DestRec(X)
```

Then the dependency graph of Π is defined as $G := (V, E)$, where

```
V := { DestRec, Flight, City, NotDestRec },  
E := { Flight  $\rightarrow$  DestRec, DestRec  $\rightarrow$  DestRec,  
      City  $\rightarrow$  NotDestRec, DestRec  $\xrightarrow{\neg}$  NotDestRec }.
```

This program is recursive (cycle: $\text{DestRec} \rightarrow \text{DestRec}$).

Definition: Active Domain

- The active domain of an instance \mathcal{I} , $adom(\mathcal{I})$, is defined as the set of all constants appearing in \mathcal{I} .
- The active domain of a Datalog program Π w.r.t. input \mathcal{I} , $adom(\Pi, \mathcal{I})$, is the set of all constants appearing in Π and \mathcal{I} .

Safe Datalog

- Let Π be a Datalog program and let \mathcal{I}_E be an instance of extensional relational symbols (input) and \mathcal{I}_A be an instance of the intensional relational symbol (output, i.e. set of answers).
- A rule is called *safe* if every variable appears in a *positive* literal in its body

Lemma

Let Π be a Datalog program. If every rule of Π is safe and \mathcal{I}_E is finite, then the output \mathcal{I}_A of Π is finite.

Example: Safe Datalog Program

```
DestRec(X) ← Flight(., 'FFT', X, ., .)
DestRec(Y) ← DestRec(X), Flight(., X, Y, ., .)
```

Example: Non-safe Datalog Program

obviously wrong and no positive literals in the goal.

```
Goal(X) ← Flight(., 'FFT', Y, ., .)
```

Return, because x is not making any bound
Syntax is correct but has no sens

Example: Non-safe Datalog Program

```
Goal(X) ←  $\neg$  Flight(., 'FFT', X, ., .)
```

Note

- The result of non-safe Datalog programs may depend on the underlying domain - we are interested to evaluate them w.r.t. the active domain, only.

Outlook: Datalog

In the following, we study (some of the) different fragments of Datalog:

Name	Informal Description
Datalog ⁺	Positive Datalog, i.e. Datalog without negated literals
Datalog [¬]	Datalog with positive and negated subgoals
Datalog ^{¬¬}	An extension of Datalog [¬] , where we also allow head predicates to be negated
Stratified Datalog [¬]	An important subclass of Datalog [¬] , obtained from a syntactic restriction (will be defined later)
NR-Datalog [¬]	Non-recursive Datalog with negation
Datalog ^{wff} , Datalog ^{stable}	Datalog [¬] beyond stratification

Datalog⁺

Definition

A set of safe positive rules is called Datalog⁺ program.

Datalog⁺ rules are of the following form:

$$H(\vec{U}) \leftarrow R_1(\vec{U}_1), \dots, R_n(\vec{U}_n),$$

where H and the R_i 's are relational symbols out of \mathcal{R} .

Naive Evaluation Algorithm for Datalog⁺ Programs

Goal: compute the output \mathcal{I}_A of some Datalog⁺ program Π w.r.t. the input \mathcal{I}_E

- (1) Begin: initialize the relations of the intensional relational symbols R with \emptyset , i.e. $\mathcal{I}_A^0(R) = \emptyset$.
Set $j := 0$.

- (2) (a) Set $j := j + 1$.

Let ρ be a rule from Π of the form $H \leftarrow G$, where $H = R(a_1, \dots, a_k)$ with variables or constants a_i ($1 \leq i \leq k$). Set

$$\mathcal{I}_\rho(R) := \{(\nu(a_1), \dots, \nu(a_k)) \mid (\mathcal{I}_E \cup \mathcal{I}_A^{j-1}) \models_\nu G, \nu \text{ is a variable assignment for } G\}$$

- (b) Let R be an intensional relational symbol and let $\rho_1^R, \dots, \rho_l^R$ be the rules having predicate R in their head. Put

$$\mathcal{I}_A^j(R) := \cup_{i=1}^l \mathcal{I}_{\rho_i}(R)$$

- (2) Repeat step (2) until $\mathcal{I}_A^j(R) = \mathcal{I}_A^{j-1}(R)$ for all intensional relational symbols R .

Examples: Naive Evaluation Algorithm

- $Dest('FFT', X) \leftarrow Flight(-, 'FFT', X, -, -)$

j	$\mathcal{I}_A (Dest)$
0	\emptyset
1	$\{(FFT, BER), (FFT, DAL)\}$
2	$\{(FFT, BER), (FFT, DAL)\}$

- $DestRec(X) \leftarrow Flight(-, 'FFT', X, -, -)$
 $DestRec(Y) \leftarrow DestRec(X), Flight(-, X, Y, -, -)$

j	$\mathcal{I}_A (DestRec)$
0	\emptyset
1	$\{BER, DAL\}$
2	$\{BER, DAL, LON\}$
3	$\{BER, DAL, LON, NY\}$
4	$\{BER, DAL, LON, NY\}$

Proposition

Given a Datalog⁺ program Π , the naive evaluation algorithm always terminates.

Proof Sketch

Follows from the observation that the computation in steps (2a) and (2b) is monotonic and the finiteness of the output (Datalog⁺ is safe).

Example *ancestor*

- (1) $a(X, Y) \leftarrow p(X, Y)$
 $a(X, Y) \leftarrow a(X, Z), p(Z, Y)$
- (3) $a(X, Y) \leftarrow p(X, Y)$
 $a(X, Y) \leftarrow a(X, Z), a(Z, Y)$

- (2) $a(X, Y) \leftarrow p(X, Y)$
 $a(X, Y) \leftarrow p(X, Z), a(Z, Y)$

$p =$

<i>parent</i>	<i>kid</i>
<i>Abraham</i>	<i>Isaac</i>
<i>Abraham</i>	<i>Ishmael</i>
<i>Isaac</i>	<i>Jacob</i>
<i>Ishmael</i>	<i>Nebaioth</i>
<i>Jacob</i>	<i>Joseph</i>
<i>Joseph</i>	<i>Ephraim</i>

$$(1) \frac{j \quad \mathcal{I}_A(a)}{0 \quad \emptyset}$$

$$(2) \frac{j \quad \mathcal{I}_A(a)}{0 \quad \emptyset}$$

$$(3) \frac{j \quad \mathcal{I}_A(a)}{0 \quad \emptyset}$$

Example *same generation*

SG: $sg(X, X) \leftarrow p(X, Y)$
 $sg(X, Y) \leftarrow p(X_1, X), sg(X_1, Y_1), p(Y_1, Y)$

$$p = \begin{array}{c|c} \text{parent} & \text{kid} \\ \hline Abraham & Isaac \\ Abraham & Ishmael \\ Isaac & Jacob \\ Ishmael & Nebaioth \\ Jacob & Joseph \\ Joseph & Ephraim \end{array}$$

$$\begin{array}{c|c} j & \mathcal{I}_A(sg) \\ \hline 0 & \emptyset \end{array}$$

Semi-naive Evaluation

Naive bottom-up evaluation is highly inefficient because of redundant computations.

Observation:

To derive in round $i + 1$ a new, previously not derived fact, we have to use a fact having been derived in round i as a new fact.

consider a non-recursive, however infinite, version of the *ancestor* Datalog program.

$$\begin{aligned} \text{anc}' : \quad & \Delta_a^1(X, Y) \leftarrow p(X, Y) \\ & \Delta_a^2(X, Y) \leftarrow \Delta_a^1(X, Z), p(Z, Y) \\ & \vdots \\ & \Delta_a^{i+1}(X, Y) \leftarrow \Delta_a^i(X, Z), p(Z, Y) \\ & \vdots \end{aligned}$$

The final result is given by computing the union of all Δ^i , $i \geq 0$.

... this is the underlying idea of semi-naive computation of Datalog programs.