

Özgür L. Özçep

Logic, Logic, and Logic

Lecture 1: Motivation and Overview 19 October, 2016

Foundations of Ontologies and Databases for Information Systems CS5130 (Winter 16/17)

Organizational Stuff

Organization

- Lectures with integrated exercises (sometimes homework)
- Exercise slot may vary: so come to the lectures
- ▶ Start: Today, Wed, 19 October, 2016, 16.05h
- Lecture and exercise related material in Moodle "Grundlagen von Ontologien und Datenbanken f
 ür Informationssysteme -CS5130"
- Oral exam at the end of the semester
 - **Register** for the course in Moodle
 - Prerequisite for exam: At least 50 percent of exercises solved successfully
- The lectures and the exercises are in English

Organization

- Lectures with integrated exercises (sometimes homework)
- Exercise slot may vary: so come to the lectures
- ▶ Start: Today, Wed, 19 October, 2016, 16.05h
- Lecture and exercise related material in Moodle "Grundlagen von Ontologien und Datenbanken f
 ür Informationssysteme -CS5130"
- Oral exam at the end of the semester
 - **Register** for the course in Moodle
 - Prerequisite for exam: At least 50 percent of exercises solved successfully
- ► The lectures and the exercises are in English

Sometimes English Becomes Less Important

Prologue

La loi 101 (Charte de la langue française)

Principe du deux pour un : le texte français doit être écrit en caractères deux fois plus gros que ceux de la version en langue étrangère.

Two for one principle : an english (for clarity) text should be written in characters twice smaller than its french counterpart.

Exception : the english version of the text of the Law itself can be written in characters five times bigger than the french original.

Slide example by Bruno Poizat from a conference talk

- Model Theorist
- ► Has a wonderful (unconventional) book on model theory
 - Was not well received (for some years)
 - until he translated it into English

Lit: B. Poizat. A Course in Model Theory. Universitext. Springer Verlag, 2000.

Sometimes English Becomes Less Important

Prologue

La loi 101 (Charte de la langue française)

Principe du deux pour un : le texte français doit être écrit en caractères deux fois plus gros que ceux de la version en langue étrangère.

Two for one principle : an english (for clarity) text should be written in characters twice smaller than its french counterpart.

Exception : the english version of the text of the Law itself can be written in characters five times bigger than the french original.

Slide example by Bruno Poizat from a conference talk

- Model Theorist
- ► Has a wonderful (unconventional) book on model theory
 - Was not well received (for some years)
 - until he translated it into English

Lit: B. Poizat. A Course in Model Theory. Universitext. Springer Verlag, 2000.

Plan

- Logic, Logic, Logic (2 lectures)
- Logical Foundations of Database Systems: Finite Model Theory (2 lectures)
- Semantic Integration with OBDA: Bridging the DB and Ontology World (2-3 lectures)
- Semantic Integration on Ontology Level: Ontology Integration (2-3 lectures)
- Stream Processing (2-3 lectures)
- Process Analysis and Design (2-3 lectures)

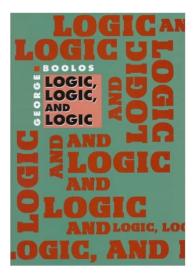
First-Order Logic

"Logic, Logic, and Logic"

- Interesting collection of essays
- Rather "philosophical logic"
- But we adopt the motto:

Logic everywhere !

- We are interested not only in logics per se but
- (Knowledge on) logics useful for computer science

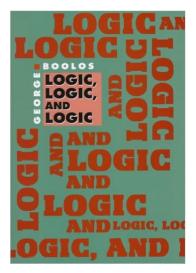


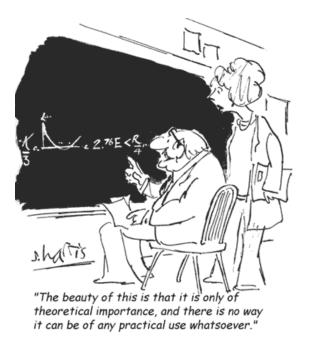
"Logic, Logic, and Logic"

- Interesting collection of essays
- Rather "philosophical logic"
- But we adopt the motto:

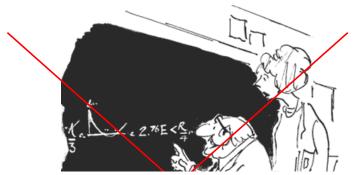
Logic everywhere !

- We are interested not only in logics per se but
- (Knowledge on) logics useful for computer science









But: "Nothing is more practical than a good theory"

"The beauty of this is that it is only of theoretical importance, and there is no way it can be of any practical use whatsoever."

Logic and Logics

- Science of logic
 - investigates mathematical structures (static and dynamic)
 - > and formal languages to describe them
 - distinguishing between syntax
 - and semantics (truth conditions for sentences)
 - providing notions of satisfaction, entailment (from semantics)
 - and of provability, inference (calculus)
- A logic: A language with syntax, semantics (and possibly calculus)
- There are many different logics (within computer science)
- ► But in any case somehow related to first-order logic

First-Order Logic (FOL)

- Also called predicate logic (or quantification logic)
- Aristotelian syllogisms already incorporate restricted FOL
 - All Philosophers are wise men. All wise men are nice. Hence all Philosophers are nice men.
 - Restricted to unary predicates
- Modern FOL started with Frege's "Begriffsschrift"
 - language constructs based on constants, variables, predicates, functions, boolean connectives, quantifiers
 - Formal axioms and inference rules
 - His 2-dimensional representation format aesthetic but not practical

$$\begin{array}{c} & \begin{array}{c} & \begin{array}{c} & \begin{array}{c} & \begin{array}{c} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \end{array}{} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}{} & \end{array}{} & \end{array}{} & \end{array}{} & \end{array}{} & \begin{array}{c} & \end{array}{} & \end{array}$$
 \\ & \\

FOL Structures

► A formalism to investigate (mathematical) structures

$$\mathfrak{A} = (A, R_1^{\mathfrak{A}}, \ldots, R_n^{\mathfrak{A}}, f_1^{\mathfrak{A}}, \ldots, f_m^{\mathfrak{A}}, c_1^{\mathfrak{A}}, \ldots, c_l^{\mathfrak{A}})$$

- (Non-logical) Vocabulary
 - Relation symbols/predicates R_i with arities
 - Function symbols f_i (with arities)
 - Constant symbols c_i
- Components of the structure
 - Universe/Domain A
 - Interpretations/denotations of nonlogical symbols
 - Relation $R^{\mathfrak{A}} \subseteq A^n$ (for *n*-ary relation symbol *R*)
 - Function $f^{\mathfrak{A}} \in A^n \longrightarrow A$ (for n-ary function symbol f)
 - Individuals $c^{\mathfrak{A}} \in A$ (for constants c)

Example FOL Structures

- Graphs $\mathfrak{G} = (V, E^{\mathfrak{G}})$
 - 1. V =nodes of the graph
 - 2. $E^{\mathfrak{G}} \subseteq V^2 = \text{edges of the graph}$
- Undirected, loopless graphs $\mathfrak{G} = (V, E^{\mathfrak{G}})$
 - 1. as above
 - 2. as above
 - 3. Additionally: edge relation is symmetric and a-reflexive
- Need an appropriate language to formulate constraints such as in 3.

FOL Syntax

- Allow variables $(x_1, x_2, ...)$ and logical constructors
- Terms
 - variables and constants are terms
 - if t_1, \ldots, t_n are terms, so is $f(t_1, \ldots, t_n)$ (for *n*-ary function symbol f

Formulae

- ▶ $t_i = t_j$ and $R(t_1, ..., t_n)$ (for terms t_i and *n*-ary relation) R
- If ϕ is a formula, so are

▶ $\neg \phi$ ("Not ϕ ")

- $\forall x \phi$ ("For all x it holds that ϕ ")
- $\exists x \phi$ ("There is an x s.t. ϕ ")
- If ϕ, ψ are formula, so are

•
$$(\phi \land \psi)$$
 (" ϕ and ψ ")

▶
$$(\phi \lor \psi)$$
 (" ϕ or ψ ")

•
$$(\phi \rightarrow \psi)$$
 ("If ϕ then ψ ")

•
$$(\phi \leftrightarrow \psi)$$
 (" ϕ iff ψ ")

FOL Syntax

• Allow variables $(x_1, x_2, ...)$ and logical constructors

Terms

- variables and constants are terms
- if t_1, \ldots, t_n are terms, so is $f(t_1, \ldots, t_n)$ (for *n*-ary function symbol f

Formulae

- $t_i = t_j$ and $R(t_1, \ldots, t_n)$ (for terms t_i and *n*-ary relation) R
- If ϕ is a formula, so are

•
$$\neg \phi$$
 ("Not ϕ ")

- $\forall x \phi$ ("For all x it holds that ϕ ")
- $\exists x \phi$ ("There is an x s.t. ϕ ")
- If ϕ, ψ are formula, so are

▶
$$(\phi \land \psi)$$
 (" ϕ and ψ ")
▶ $(\phi \lor \psi)$ (" ϕ or ψ ")
▶ $(\phi \rightarrow \psi)$ ("If ϕ then ψ "
▶ $(\phi \leftrightarrow \psi)$ (" ϕ iff ψ ")

• Interpretation $\mathcal{I} = (\mathfrak{A}, \nu)$

- ν assigns to all variables elements from domain A
- ► Needed to deal with open formulae e.g. ∀y R(y, x) open/free in variable x

► x-Variant \$\mathcal{I}_{[x/d]}\$ same as \$\mathcal{I}\$ but with \$d \in A\$ assigned to \$x\$

Interpretation of terms

•
$$\mathcal{I}(c) = c^{\mathfrak{A}}$$

• $\mathcal{I}(x) = \nu(x)$
• $\mathcal{I}(f(t_1, \dots, t_n)) = f^{\mathfrak{A}}(\mathcal{I}(t_1), \dots, \mathcal{I}(t_n))$

Because dealing with variables is non-trivial...

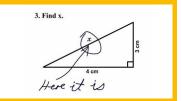
- Interpretation $\mathcal{I} = (\mathfrak{A}, \nu)$
 - ν assigns to all variables elements from domain A
 - ► Needed to deal with open formulae e.g. ∀y R(y, x) open/free in variable x
- ► x-Variant I_[x/d] same as I but with d ∈ A assigned to x
- Interpretation of terms

$$\mathcal{I}(c) = c^{\mathfrak{A}}$$

•
$$\mathcal{I}(x) = \nu(x)$$

•
$$\mathcal{I}(f(t_1,\ldots,t_n)) = f^{\mathfrak{A}}(\mathcal{I}(t_1),\ldots,\mathcal{I}(t_n))$$

Because dealing with variables is non-trivial...



► Satisfaction relation ⊨

• $\mathcal{I} \models R(t_1, \ldots, t_n)$ iff $(\mathcal{I}(t_1), \ldots, \mathcal{I}(t_n)) \in R^{\mathfrak{A}}$

 $\blacktriangleright \ \mathcal{I} \models \neg \phi \text{ iff not } \mathcal{I} \models \phi$

$$\begin{array}{l} \blacktriangleright \ \mathcal{I} \models (\phi \land \psi) \text{ iff } \mathcal{I} \models \phi \text{ and } \mathcal{I} \models \psi \\ \blacktriangleright \ \mathcal{I} \models (\phi \lor \psi) \text{ iff } \mathcal{I} \models \phi \text{ or } \mathcal{I} \models \psi \\ \blacktriangleright \ \mathcal{I} \models (\phi \rightarrow \psi) \text{ iff: } \text{ If } \mathcal{I} \models \phi \text{ then } \mathcal{I} \models \psi \end{array}$$

•
$$\mathcal{I} \models (\phi \leftrightarrow \psi)$$
 iff: $\mathcal{I} \models \phi$ iff $\mathcal{I} \models \psi$

•
$$\mathcal{I} \models \forall x \ \phi \text{ iff: For all } d \in A: \mathcal{I}_{[x/d]} \models \phi$$

- $\mathcal{I} \models \exists x \ \phi \text{ iff: There is } d \in A \text{ s.t. } \mathcal{I}_{[x/d]} \models \phi$
- Known result: ν can be assumed to be defined only for the free variables in the formula.
- ▶ Terminology $\mathcal I$ satisfies ϕ , $\mathcal I$ makes ϕ true, $\mathcal I$ is a model for ϕ
- We also write $\mathfrak{A} \models \phi(\vec{x}/\nu)$

► Satisfaction relation ⊨

•
$$\mathcal{I} \models t_1 = t_2$$
 iff $\mathcal{I}(t_1) = \mathcal{I}(t_2)$

• $\mathcal{I} \models R(t_1, \ldots, t_n)$ iff $(\mathcal{I}(t_1), \ldots, \mathcal{I}(t_n)) \in R^{\mathfrak{A}}$

$$\blacktriangleright \ \mathcal{I} \models \neg \phi \text{ iff not } \mathcal{I} \models \phi$$

•
$$\mathcal{I} \models (\phi \land \psi) \text{ iff } \mathcal{I} \models \phi \text{ and } \mathcal{I} \models \psi$$

• $\mathcal{I} \models (\phi \lor \psi) \text{ iff } \mathcal{I} \models \phi \text{ or } \mathcal{I} \models \psi$
• $\mathcal{I} \models (\phi \to \psi) \text{ iff: } \text{ If } \mathcal{I} \models \phi \text{ then } \mathcal{I} \models$

•
$$\mathcal{I} \models (\phi \leftrightarrow \psi)$$
 iff: $\mathcal{I} \models \phi$ iff $\mathcal{I} \models \psi$

•
$$\mathcal{I} \models \forall x \ \phi \text{ iff: For all } d \in A: \mathcal{I}_{[x/d]} \models \phi$$

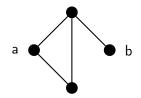
•
$$\mathcal{I} \models \exists x \ \phi \text{ iff: There is } d \in A \text{ s.t. } \mathcal{I}_{[x/d]} \models \phi$$

Known result: ν can be assumed to be defined only for the free variables in the formula.

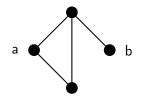
ψ

- Terminology $\mathcal I$ satisfies ϕ , $\mathcal I$ makes ϕ true, $\mathcal I$ is a model for ϕ
- We also write $\mathfrak{A} \models \phi(\vec{x}/\nu)$

• Consider loopless, symmetric graphs $\mathfrak{G} = (G, E^{\mathfrak{G}})$

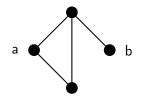


• Consider loopless, symmetric graphs $\mathfrak{G} = (G, E^{\mathfrak{G}})$

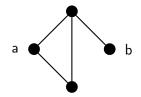


- $\blacktriangleright \phi_1 := \exists x \exists y E(x, y)$ $\mathfrak{G} \models \phi_1$ Yes!
- $\bullet \ \phi_2(x) := \exists y \ \exists z \ E(x, y) \land E(x, z) \land E(y, z) \qquad \mathfrak{G} \models \phi_2(x/a)$
- $\blacktriangleright \phi_3(x, y) := E(x, y)$

• Consider loopless, symmetric graphs $\mathfrak{G} = (G, E^{\mathfrak{G}})$

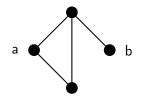


• Consider loopless, symmetric graphs $\mathfrak{G} = (G, E^{\mathfrak{G}})$



 $\phi_1 := \exists x \exists y E(x, y)$ $\phi_2(x) := \exists y \exists z E(x, y) \land E(x, z) \land E(y, z) \mathfrak{G} \models \phi_2(x/a)$ Yes! $\phi_3(x, y) := E(x, y)$ $\mathfrak{G} \models \phi_3(x/a, y/b)$

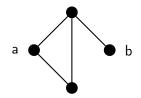
• Consider loopless, symmetric graphs $\mathfrak{G} = (G, E^{\mathfrak{G}})$



- $\blacktriangleright \phi_1 := \exists x \exists y E(x, y)$ $\mathfrak{G} \models \phi_1$ Yes!
- $\phi_2(x) := \exists y \exists z \ E(x,y) \land E(x,z) \land E(y,z) \ \mathfrak{G} \models \phi_2(x/a) \ \mathrm{Yes!}$ $\mathfrak{G} \models \phi_3(x/a, y/b)?$
- $\blacktriangleright \phi_3(x, y) := E(x, y)$

28 / 66

• Consider loopless, symmetric graphs $\mathfrak{G} = (G, E^{\mathfrak{G}})$



- $\bullet \ \phi_1 := \exists x \ \exists y \ E(x, y) \qquad \mathfrak{G} \models \phi_1 \ \mathsf{Yes!}$
- $\blacktriangleright \phi_2(x) := \exists y \; \exists z \; E(x,y) \land E(x,z) \land E(y,z) \; \mathfrak{G} \models \phi_2(x/a) \; \mathsf{Yes!}$
- $\phi_3(x,y) := E(x,y)$ $\mathfrak{G} \models \phi_3(x/a,y/b)$ NO!

Entailment

- $X \models \phi$ iff all models of X are models of ϕ
 - We say: X entails ϕ or ϕ follows from X
 - ► X: set of sentences
 - ϕ : sentence
- Note: entailment definition (per se) not easy implementable
 Notion of derivibility/inference in a calculus (see later lectures)

Algorithmic Problems in First-Order Logic

Model Checking:

- Input: graph (or generally structure) 𝔅, formula φ(x₁,...,x_n) and assignment [x₁/a₁,...,x_n/a_n]
- Output: Is $\mathfrak{G} \models \phi(x_1/a_1, \dots, x_n/a_n)$ the case?

Satisfiability Problem

- $\blacktriangleright \text{ Input: sentence } \phi$
- Output: Does there exist a structure \mathfrak{G} s.t. $\mathfrak{G} \models \phi$?

Complexity of problems

- Model checking problem is decidable and PSPACE complete (in combined complexity)
- Satisfiability is undecidable

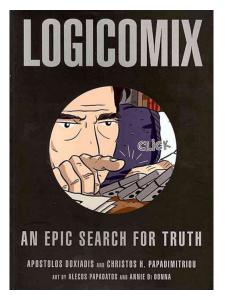
Role of Logic for/in Computer Science

The Burden of Logic in the 19-20th Century

 Role of logic as a foundation for all of mathematics

Literature hint: Logicomix

- fantastic graphic novel
- Narrator: Philosopher and logician B. Russell
- About the illusions, disillusions, and landmarking results at the end of the 19th century



Foundations of Mathematics with Mathematical Logic

- Attempts to find formal foundation for mathematical logic
- Hilberts Program (1900-1928)
 - Mathematics is consistent
 - Mathematics is (semantically) complete
 - Mathematics is decidable

Awakening

- Young Gödel proves (1931-33)
 - arithmetics not complete
 - consistency of set theory not provable
- Church/Turing (1936/37)
 - First-order logic is not decidable
 - Valid sentences not recursive
 - Sentences true in arithmetic not recursively enumerable (semi-decidable)
- Nonetheless there are the following positive insights
 - Syntactically completeness for FOL (Gödel, 1930)
 - ZFC (Zermelo-Fraenkel Set Theory) can be used to formalize all contemporary mathematics

Awakening

- Young Gödel proves (1931-33)
 - arithmetics not complete
 - consistency of set theory not provable
- Church/Turing (1936/37)
 - First-order logic is not decidable
 - Valid sentences not recursive
 - Sentences true in arithmetic not recursively enumerable (semi-decidable)
- Nonetheless there are the following positive insights
 - Syntactically completeness for FOL (Gödel, 1930)
 - ZFC (Zermelo-Fraenkel Set Theory) can be used to formalize all contemporary mathematics

The Unusual Effectiveness of Logic

- Logic (Research) and Computer Science had fruitful effects onto each other
- Logic even more w.r.t. CS (than w.r.t. mathematics)
- "Logic is the calculus of CS"

Lit: M. Y. Vardi. From philosophical to industrial logics. In Proceedings of the 3rd Indian Conference on Logic and Its Applications, ICLA'09, pages 89–115, Berlin, Heidelberg, 2009. Springer-Verlag.

Lit: J. Y. Halpern, R. Harper, N. Immerman, P. G. Kolaitis, M. Y. Vardi, and V. Vianu. On the unusual effectiveness of logic in computer science. Bull. Symbolic Logic, 7(2):213–236, 2001.

Why is this the Case?

Logic is so general that it allows to

- talk precisely about the objects within a computer/computation model
- specify and reason about the properties of runs in the model
- Even more: One can characterize complexity classes with logics (Descriptive Complexity)

As an upcoming computer scientist (in academia or industry) you should train in formal models, in particular **logics**, because:

- you want to apply successfully for a job
- But more importantly: you want to keep your job

Computer Science Areas Effected by Logic Research

- Database Systems
- Ontology-Based Information Systems
- Semantic Integration
- Computer-Aided Verification (Model Checking)
- Computational Complexity
- High-Level Stream Processing
- Multi-Agent Systems
- Machine Learning (e.g. probabilistic graph models and logics)
- Semantic Web
- Logic Programming
- Knowledge Representation
- Semantics of Programms
- Digital Design ...

Computer Science Areas Effected by Logic Research

- Database Systems
- Ontology-Based Information Systems
- Semantic Integration
- Computer-Aided Verification (Model Checking)
- Computational Complexity
- High-Level Stream Processing
- Multi-Agent Systems
- Machine Learning (e.g. probabilistic graph models and logics)
- Semantic Web
- Logic Programming
- Knowledge Representation
- Semantics of Programms
- Digital Design ...

This course

Computer Science Areas Effected by Logic Research

- Database Systems
- Ontology-Based Information Systems
- Semantic Integration
- Computer-Aided Verification (Model Checking)
- Computational Complexity
- High-Level Stream Processing
- Multi-Agent Systems
- Machine Learning (e.g. probabilistic graph models and logics)
- Semantic Web
- Logic Programming
- Knowledge Representation
- Semantics of Programms
- Digital Design ...

This course

Other courses of module "Web and Data Science" (CS4513) This semester: "Web-Mining-Agenten"

Effects of Computer Science to Logic Research

- Focus/Intensive research on finite structures
 - Objects of computation are finite (Finite Model Theory)
 - But: potentially infinite structures (such as infinite DBs or streams) are useful as well
- Need for extensions of FOL
 - Higher-order logics (quantification over sets/relations)
 - Recursion (Datalog)
- ► Feasibility of reasoning services ⇒ restrictions of FOL
 - Modal and temporal logics
 - Description Logics
- Connections of logic and automata models
 - Regular expressions, finite automata, sequential logics
 - Buechi automata
- Logic engineering
- Different forms of inference ...

Overview on Course With Examples

Example: Logic in DB Research (Lectures 3-4)

- Travel DB with direct connection flights
- Reachability query
- SQL allows for recursion (CONNECT key word)
- But is it really necessary?

Table Flight		
Start	End	
Hamburg	Berlin	
Hamburg	New York	
New York	Berlin	

Query Q_{reach}: List all cities reachable from Hamburg!

Intuitively without recursion:

. . .

 $\begin{array}{lll} Q_{reach}(x) &= & \textit{Flight}(\textit{Hamburg}, x) \lor \\ & & \exists x_1 \textit{Flight}(\textit{Hamburg}, x_1) \land \textit{Flight}(x_1, x) \lor \\ & & \exists x_1, x_2 \textit{Flight}(\textit{Hamburg}, x_2) \land \textit{Flight}(x_2, x_1) \land \textit{Flight}(x_1, x) \lor \end{array}$

Example: Logic In DB Research

- Finite Model Theory (FMT) gives a proof for the impossibility to use FOL for recursive queries
- FMT models DBs as finite relational FOL structures

Example

- ▶ Flight table becomes structure
 𝔅 = (D, Flight^𝔅, Hamburg^𝔅, Berlin^𝔅,...)
- Domain D: all constants in DB
- Constants named by themselves, e.g., $Hamburg^{\mathfrak{A}} = Hamburg$
- $Flight^{\mathfrak{A}} = \{(Hamburg, Berlin), (Hamburg, NewYork), \dots\}$

Example: Logic In DB Research

Investigate all relevant reasoning problems w.r.t. finite models

- Many properties for classical FOL do not hold
- Also w.r.t. complexity
 - \implies Calls for new techniques

► In particular: Investigate properties that all FOL queries have.

Theorem

All FOL formulas are **local**. (Holds even for FOL extended with aggregation)

Recursive queries are not local!

Example: Data Exchange (Lectures 5-6)

Deals in a specific way with the integration of DBs

Scenario

- ➤ You have two DBs (source and target) on the same domain but different schemata S and T
- You have some relationship specifications $\Sigma(T, S)$ for T and S
- Aim: Answer queries over T to get answers with DBs over S
- Subaims: Find (good) instances for T corresponding to given instances over S and answer over found solution set.

And here comes logic

- Language for specifying Σ_{ST} ⇒ Specific FOL formulas called tuple generating dependencies (tgds)
- Criteria for goodness of solutions \implies universal model notion
- ▶ How specify answers? ⇒ Certain answer semantics

Example: Data Exchange (Lectures 5-6)

Deals in a specific way with the integration of DBs

Scenario

- ➤ You have two DBs (source and target) on the same domain but different schemata S and T
- You have some relationship specifications $\Sigma(T, S)$ for T and S
- Aim: Answer queries over T to get answers with DBs over S
- ► Subaims: Find (good) instances for *T* corresponding to given instances over *S* and answer over found solution set.
- And here comes logic
 - Language for specifying Σ_{ST} ⇒ Specific FOL formulas called tuple generating dependencies (tgds)
 - Criteria for goodness of solutions \Longrightarrow universal model notion
 - ► How specify answers? ⇒ Certain answer semantics

Example: Data Exchange

Example

- S: student(name)
- T: univ(sname, uname)
- Σ_{ST} : student(x) $\rightarrow \exists y \ univ(x, y)$

"If something is a student in a S-DB, then there is an associated university in the T-DB"

- Example *T*-query: $Q(x) = \exists y.univ(x, y)$
- What should be the answers for given S-DB I = {student(Frege)}? cert(Q(x),I) = {Frege}

Example: Querying via Ontologies (Lectures 7-8)

- Ontologies as formal means to represent and reason over data
- Ontologies specify constraints and completeness rules
- Ontologies may have many models (open world assumption)
- May be used for access of heterogeneous data sources
- Appropriate ontology languages: Description Logics (OWL and variants)
 - Constants, concepts (unary predicates), roles (binary predicates)
 - ► Terminological axioms, e.g., *Students Humans*
 - Assertions axioms, e.g., Student(Frege)
 - Description logics are feasible fragments of FOL

Example

No university known for Goedel	Table university	
 Completeness: Student ⊑ ∃hasUniv.University 	Student	Univ
	Frege	U-Jena
	Russell	U-London
Functionality constraint:	Goedel	NULL
(func hasUniv)		

Example: Ontology Integration (Lectures 9-10)

- There exist many ontologies out there
- For some applications need to integrate ontologies
- Problem: Joining ontologies may lead to incoherences/inconsistencies

Example

Ontology A

Ontology B

- Article $\equiv \exists publ. Journal$
- ▶ Journal ⊑ ¬Proceedings
- (func publ)

- ► Article ≡ ∃publ.Journal ⊔Proceedings
- publish(ab, procXY)

- $O_A \cup O_B$ is inconsistent
- How to repair this?

Belief Revision

- Belief Revision deals with operators for revising theories under possible inconsistencies
- Investigates concrete revision operators
- Principles that these must fulfill (minimality etc.)
- Representation theorems
- Recent research how to adapt these for non-classical logics/ontologies

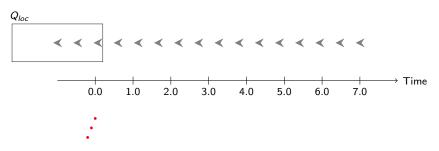
Streams (Lectures 11-12)

- "It's a streaming world" (Ubiquity)
 - Many data are temporal (sensor, event data)
 - Big data is mostly temporal data
- "Streams are forever" (Potential Infinity)
 - Streams are potentially infinite
 - One has to tame the infinite
 - Streams call for continuous querying (monitoring)
- "Order Matters" (Sequentiality)
 - > Stream elements have an arriving order next to temporal order
 - Re-ordering or special sequencing may be needed

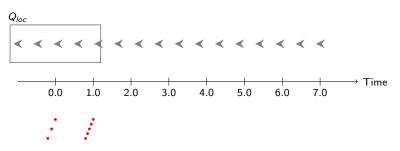
Lit: E. Della Valle. et al. It's a streaming world! Reasoning upon rapidly changing information. Intelligent Systems, IEEE, 24(6):83–89, nov.-dec. 2009.

Lit: J. Endrullis, D. Hendriks, and J. W. Klop. Streams are forever. Bulletin of the EATCS, 109:70–106, 2013.

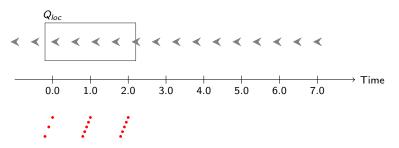
Lit: E. D. Valle et al. Order matters! Harnessing a world of orderings for reasoning over massive data. Semantic Web, 4(2):219–231, 2013.



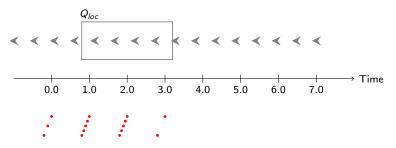
- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge



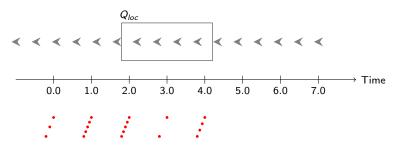
- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge



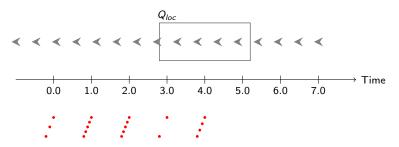
- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge



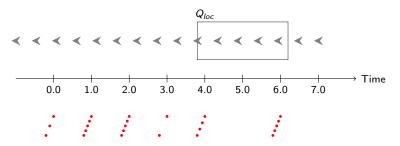
- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge



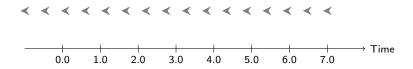
- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge



- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge



- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge



- Sliding window for taming the infinite
- Query window contents with local query Qloc
- Example: Q_{loc} = Show all failure events in the window
- For High-Level Stream Processing: Incorporate background knowledge

Process Verification (Lectures 12-13)

- Verification of system behavior very important for industrial applications
- Model Checking mature theory with well-proven software implementations used in industry
 - given a system description (model) and (desired) specifications (axioms in (temporal logics))
 - Check whether specification is fulfilled by (all runs of) model

Example (Linear Temporal Logic)

Excluding unwanted conditions for every time point

 $\Box \neg$ (turbineTemp > 90°)

Ensuring wanted conditions

 \Box (startTurbine $\rightarrow \diamond$ TurbinelsRunning)

Process Verification

- Lift verification ideas/tools to verify business processes
- Challenges
 - ► Have to incorporate (large amounts of) data ⇒ artifact-centric approach (early 2000)
 - Finite state models not sufficient
 - \implies finite state transducers

Exercise 1 (6 points)

Describe an example application or a computer science sub-area from your CS studies or from your job which exemplifies the "use" of some form of logic. In particular answer the following questions (on 2-3 slides in pdf):

- 1. What kind of logic is used?
- 2. What is its relation to FOL?
- 3. How/why is it used in the area/application?
- Send your solutions in one pdf file as presentation until Monday night, 24th of October 2016 to oezcep@ifis.uni-luebeck.de.
- You may work in pairs
- State your name, your study course (Studiengang) and your identity number (Matrikelnummer) at the title page