

Knowledge Graphs

Lecture 4: Ontologies as Key to Knowledge Representation



- 4.1 From Aristotle to AI: Exploring Ontologies in Computer Science
- 4.2 The Crucial Role of Mathematical Logic

Excursion 5: Essential Logics in a Nutshell

Excursion 6: Description Logics

- 4.3 The Web Ontology Language OWL
- 4.4 From simple to complex: Scaling up with OWL
- 4.5 Unlocking the Potential of OWL



- In propositional logic the world consists simply of facts and nothing else (statements of assertions).
- Example for propositional logic assertions and deductions:
 - If it rains, the road will get wet.
 - If the moon is made out of green cheese, then cows can fly.
 - If Oliver is in love, then he will be happy.
- The world consists of objects and properties that distinguish one object from another.
- Between objects are relations. Some relations are unique, i.e. functions.



Syntax:

- Logical connectives: Op= $\{\neg, \land, \lor, \rightarrow, \leftrightarrow, (,)\}$
- a set of symbols Σ
- with Σ∩Op=∅ and {true, false}
- Production rules for propositional formulas (propositions):
 - o all atomic formulas are propositions (all elements of Σ)
 - \circ if ϕ is a proposition, then also $\neg \phi$
 - ∘ if φ and ψ are propositions, then also φ ∧ ψ , φ ∨ ψ , φ <math>→ ψ , φ ↔ ψ
- **Priority**: \neg prior to \land , \lor prior to \rightarrow , \leftrightarrow

connective	name	intentional meaning
٦	negation	"not"
٨	conjunction	"and"
V	disjunction	"or"
\rightarrow	implication	"if - then"
\leftrightarrow	equivalence	"if, and only if, then"

How to model facts



Simple Assertion	Modeling
The Moon is made of green cheese	g
It rains	r
The street is getting wet	n

Composed Assertion	Modeling
If it rains, then the street will get wet.	$r \rightarrow n$
If it rains and the street does not get wet, then the moon is made of green cheese.	$(r \land \neg n) \rightarrow g$

Model-theoretic semantics



Interpretation I:

Mapping of all atomic propositions to $\{t, f\}$.

 If F is a formula and I an interpretation, then I(F) is a truth value computed from F and I via truth tables.

I(p)	I(q)	I(¬p)	I(p∀q)	I(p∧q)	I(p→q)	I(p↔q)
f	f	t	f	f	t	t
f	t	t	t	f	t	f
t	f	f	t	f	f	f
t	t	f	t	t	t	t

Model-theoretic semantics



- We write I ⊨ F, if I(F)=t, and call interpretation I a Model of formula F.
- Rules of Semantics:
 - \circ I is a model of $\neg \varphi$, iff I is not a model of φ
 - \circ I is a model of $(\phi \wedge \psi)$, iff I is a model of ϕ AND of ψ
 - 0 ...
- Basic concepts:
 - tautology
 - satisfiable
 - refutable
 - unsatisfiable (contradiction)

Model-theoretic semantics



Decidability

All **true entailments** can be found, and all **false entailments** can be refuted, as long as you spend enough time.

⇒ there always exist terminating automatic theorem provers.

Another useful property: semantic entailment/inference

- The decision, if an assertion is a tautology, can be made via truth tables.
- In principle this equals the evaluation of all possible interpretations.



quantifier	name	intentional meaning
3	existential quantifier	"it exists"
∀	universal quantifier	"for all"

- Operators (logical connectives) as in propositional logic
- **Variables**, e.g., X, Y, Z, ...
- Constants, e.g., a, b, c, ... (i.e. a named object from the domain of discourse)
- **Functions**, e.g., f, g, h, ... (incl. arity)
- Relations / Predicates, e.g., p, q, r, ... (incl. arity)

Example of a FOL formula: $(\forall X)(\exists Y) ((p(X) \lor \neg q(f(X),Y)) \rightarrow r(X))$

FOL Syntax



"Correct" formulation of Terms from Variables, Constants and Functions:

```
f(X), g(a,f(Y)), s(a), .(H,T), x_location(Pixel)
```

 "Correct" formulation of Atoms (or Atomic Formulas) from Predicates with Terms as arguments:

```
p(f(X)),q(s(a),g(a,f(Y))),add(a,s(a),s(a)),
greater_than(x_location(Pixel),128)
```

 "Correct" formulation of (composed) Formulas from Atomic Formulas, Operators and Quantifiers:

```
(∀Pixel)(greater_than(x_location(Pixel),128) → red(Pixel))
```

- If in doubt, use brackets
- All variables should be quantified

How to model Facts



- "All kids love ice cream."
 - $\forall X: Child(X) \rightarrow lovesIceCream(X)$
- "The father of a person is its male parent."

$$\forall X \ \forall Y: isFather(X,Y) \leftrightarrow (Male(X) \land isParent(X,Y))$$

- "There are (one or more) interesting lectures."
 - $\exists X: Lecture(X) \land Interesting(X)$
- "The relation 'isNeighbor' is symmetric."

```
\forall X \ \forall Y: isNeighbor(X,Y) \rightarrow isNeighbor(Y,X)
```

How to model Facts



- "All kids love ice cream."
 - $\forall X: Child(X) \rightarrow lovesIceCream(X)$
- "The father of a person is its male parent."

```
\forall X \ \forall Y: isFather(X,Y) \leftrightarrow (Male(X) \land isParent(X,Y))
```

- "There are (one or more) interesting lectures."
 - ∃X: Lecture(X) ∧ Interesting(X)
- "The relation 'isNeighbor' is symmetric."
 - $\forall X \ \forall Y: isNeighbor(X,Y) \rightarrow isNeighbor(Y,X)$

4. Ontologies as Key to Knowledge Representation / Excursion 5: Essential Logics in a Nutshell

First Order Logic - FOL

How to model Facts



There is a significant difference:

"All kids love ice cream."

 $\forall X: Child(X) \rightarrow lovesIceCream(X)$

It is possible that X is not a kid but (nevertheless) loves ice cream.

∀X: Child(X) ∧ lovesIceCream(X)

There are only kids in the universe of discourse and they love ice cream.

	∀X: Child(X)	∀X: loveslcecream(x)	$\forall X$: Child(X) \rightarrow lovesIceCream(X)	∀X: Child(X) ∧ loveslceCream(X)
	0	0	1	0
	0	1	1	0
	1	0	0	0
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How to model Facts



There is a significant difference:

"There are (one or more) interesting lectures."

∃X: Lecture(X) ∧ Interesting(X)

∃X: Lecture(X) → Interesting(X)

∃X: Lecture(X)	∃X: Interesting(X)	$\exists X: Lecture(X) \rightarrow Interesting(X)$	∃X: Lecture(X) ∧ Interesting(X)
0	0	1	0
0	1	1	0
1	0	0	0
1	1	1	1

Model-theoretic Semantics



• Structure:

- Definition of a domain D.
- Constant symbols are mapped to elements of D.
- Function symbols are mapped to functions in D.
- **Relation symbols** are mapped to relations over D.

Then:

- Terms will become elements of D.
- Relation symbols with arguments will become true or false.
- Logical connectives and quantifiers are treated likewise.

The Penguin Example



Penguins are Black and White. Some old TV shows are Black and White. Therefore, some Penguins are Old TV Shows.



Logic: another thing that Penguins aren't very good at...

The Penguin Example



```
 F = ( ((\forall X)(penguin(X) \rightarrow blackandwhite(X)) \land (\exists X)(oldTVshow(X) \land blackandwhite(X)) ) 
 \rightarrow (\exists X)(penguin(X) \land oldTVshow(X) )
```

What is the intentional semantics?

Penguins are Black and White. Some old TV shows are Black and White. Therefore, Some Penguins are Old TV Shows.



Logic: another thing that Penguins aren't very good at...

The Penguin Example



```
F = ( ((∀X)(penguin(X) → blackandwhite(X)) ∧
            (∃X)(oldTVshow(X) ∧ blackandwhite(X)) )
            → (∃X)(penguin(X) ∧ oldTVshow(X) )
```

Interpretation I:

- **Domain**: a set M, containing elements a, b.
- ... no constants or function symbols ...
- We show: the formula is *refutable* (i.e. it is not a tautology)
- If I(penguin)(a), I(blackandwhite)(a),
 I(oldTVshow)(b), I(blackandwhite)(b) is true,
 I(oldTVshow)(a) is false,
 - then the formula \mathbb{F} with Interpretation \mathbb{I} is false, i.e. $\mathbb{I} \not\models \mathbb{F}$

Penguins are Black and White. Some old TV shows are Black and White. Therefore, Some Penguins are Old TV Shows.



Logic: another thing that Penguins aren't very good at...

Logical Entailment



- A **theory** T is a set of formulas.
- An interpretation I is a **model** of T, iff $I \models G$ for all formulas G in T.
- A formula F is a logical consequence of T, iff all models of T are also models of F.
- Then we write $T \models F$.
- Two formulas F, G are called logically equivalent,
 iff {F} ⊨ G and {G} ⊨ F.
- Then we write F = G



Knowledge Graphs

4. Ontologies as Key to Knowledge Representation / Excursion 5: Essential Logics in a Nutshell



Bibliographic References:

- Schöning, Uwe, Robert L. Constable, John C. Cherniavsky, Richard A. Platek, Jean H. Gallier and Richard Statman. "Logic for computer scientists." (1989).
- Logic for Computer Science. (2022, April 4). Wikibooks, The Free Textbook Project. Retrieved 17:01, February 17, 2023 from https://en.wikibooks.org/w/index.php?title=Logic for Computer Science&oldid=4045328.

Picture References:

- "In this 1960s pulp cover picture, in the waning days of a future Galactic Empire, the mathematician Hari Seldon spends his life developing a theory of psychohistory, a new and effective mathematics of sociology. Using statistical laws of mass action, it can predict the future of large populations.", created via ArtBot, Deliberate, 2023, [CC-BY-4.0], https://tinybots.net/artbot
- [2] Penguin, pixabay [Public Domain], https://pixabay.com/vectors/penguin-tux-animal-bird-cute-158551/
- "In this 1950s pulp cover picture, in the waning days of a future Galactic Empire, the mathematician Hari Seldon spends his life developing a theory of psychohistory, a new and effective mathematics of sociology. Using statistical laws of mass action, it can predict the future of large populations.", created via ArtBot, Deliberate, 2023, [CC-BY-4.0], https://tinybots.net/artbot