

Artificial Intelligence 1

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Overview

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- 4 Knowledge representation and reasoning
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First-order Logic - Overview

- ▶ First-order logic is an extension of propositional logic that adds *relations*, *functions* and *objects* (Hilbert, Ackermann 1928)
- ▶ The foundation of a first-order logic are atomic statements such as
 knows(John, Mary) = “John knows Mary”
 brotherOf(Carl, Dave) = “Carl is the brother of Dave”
- ▶ As in propositional logic, atomic statements can be combined with \wedge (AND), \vee (OR), and \neg (NOT) in order to obtain more complex statements
- ▶ Additionally we have quantification \forall , \exists
- ▶ The following introduction to first-order logic is structured analogously to the introduction of propositional logic

Definition

A *first-order signature* Σ is a triple $\Sigma = (U, P, F)$ with

- ▶ U is a set of constant symbols (objects)
- ▶ P is a set of predicate symbols
- ▶ F is a set of function symbols (functors)

For every $e \in P \cup F$ let $ar(e) \in \mathbb{N}$ denote the *arity* of e (=number of parameters).

Example

Let $\Sigma_1 = (U_1, P_1, F_1)$ with

$$\begin{aligned} U_1 &= \{\text{john, carl, mary, dave}\} & P_1 &= \{\text{knows, brotherOf}\} \\ F_1 &= \{\text{fatherOf}\} \end{aligned}$$

and $ar(\text{knows}) = ar(\text{brotherOf}) = 2$, $ar(\text{fatherOf}) = 1$.

Definition

Let $\Sigma = (U, P, F)$ be a first-order signature and V a set of variables. The set of *terms* $\text{Terms}(\Sigma, V)$ is the minimal set T with the following properties:

1. $U \subseteq T$
2. $V \subseteq T$
3. For all $f \in F$ with $ar(f) = k$ and $t_1, \dots, t_k \in T$,
 $f(t_1, \dots, t_k) \in T$

Remark

To differentiate between variables and constants we will use the convention that variables start with an uppercase letter and constants with a lowercase letter.

Example

Let $\Sigma_1 = (U_1, P_1, F_1)$ with

$U_1 = \{\text{john, carl, mary, dave}\}$ $P_1 = \{\text{knows, brotherOf}\}$

$F_1 = \{\text{fatherOf}\}$

with $ar(\text{knows}) = ar(\text{brotherOf}) = 2$ and $ar(\text{fatherOf}) = 1$. Let $V_1 = \{X, Y, Z\}$ be a set of variables. Then

john

X

fatherOf(*mary*)

fatherOf(*Y*)

fatherOf(fatherOf(*mary*))

are terms in $\text{Terms}(\Sigma_1, V_1)$.

Definition

Let $\Sigma = (U, P, F)$ be a first-order signature, V a set of variables, $p \in P$ a predicate symbol with $ar(p) = k$, and $t_1, \dots, t_k \in \text{Terms}(\Sigma, V)$. Then

$$p(t_1, \dots, t_k)$$

is a *first-order atom*.

Example

Let Σ_1 and V_1 be as before. Then

knows(john, mary)
brotherOf(john, fatherOf(mary))
brotherOf(X, fatherOf(fatherOf(Y)))

are first-order atoms.

Definition (Syntax)

Let $\Sigma = (U, P, F)$ be a first-order signature and V a set of variables. The *first-order language* $\mathcal{L}(\Sigma, V)$ is the minimal set \mathcal{L} with

1. If $p(t_1, \dots, t_k)$ is a first-order atom then $p(t_1, \dots, t_k) \in \mathcal{L}$
2. $\top, \perp \in \mathcal{L}$ (tautology and contradiction) and
3. for all $\phi, \psi \in \mathcal{L}$ and $X \in V$
 - 3.1 $\phi \wedge \psi \in \mathcal{L}$
 - 3.2 $\phi \vee \psi \in \mathcal{L}$
 - 3.3 $\neg \phi \in \mathcal{L}$
 - 3.4 $\forall X : \phi \in \mathcal{L}$
 - 3.5 $\exists X : \phi \in \mathcal{L}$

Remark

Again, we are assuming that parentheses “(” and “)” are part of the syntax. Implication \Rightarrow and equivalence \Leftrightarrow is also defined as in propositional logic.

Example

Let Σ_1 and V_1 be as before. Then

$$\phi_1 = \text{knows}(\text{john}, \text{mary})$$

$$\phi_2 = \neg \text{brotherOf}(\text{john}, \text{fatherOf}(\text{mary})) \vee \text{knows}(\text{john}, \text{mary})$$

$$\phi_3 = \forall X : \exists Y : \text{knows}(X, Y)$$

are formulas in $\mathcal{L}(\Sigma_1, V_1)$.

First-order logic - syntax (summary)

Let $\Sigma = (U, P, F)$ be a *first-order signature* and V a set of variables. The set U contains *constants*, P *predicates*, and F *functors*. Each $p \in P$ and $f \in F$ has *arity* $ar(p)$, $ar(f)$.

- ▶ a **term** is a symbol t such that either:
 - ▶ $t \in U$
 - ▶ $t \in V$
 - ▶ $t = f(t_1, \dots, t_n)$ (where t_1, \dots, t_n are terms and $n = ar(f)$)
- ▶ an **atom** is a symbol $p(t_1, \dots, t_n)$
(where $p \in P$, t_1, \dots, t_n are terms, and $n = ar(p)$)
- ▶ a **formula** is either:
 - ▶ an atom
 - ▶ $\phi \wedge \psi$, $\phi \vee \psi$ (where ϕ, ψ are formulas)
 - ▶ $\neg \phi$ (where ϕ is a formula)
 - ▶ $\forall X : \phi$ (where $X \in V$ and ϕ is a formula)
 - ▶ $\exists X : \phi$ (where $X \in V$ and ϕ is a formula)
 - ▶ \top or \perp

- ▶ Meaning is assigned to first-order formulas through interpretations
- ▶ Every interpretation represents a *possible* world by enumerating everything that is true in this world

Definition

Let $\Sigma = (U, P, F)$ be a first-order signature with $P = \{p_1, \dots, p_n\}$ and $F = \{f_1, \dots, f_m\}$. A *first-order interpretation* I is a tuple $I = (U_I, f_I^U, P_I, F_I)$ with

1. U_I is a non-empty set of objects (the *universe* or *domain*)
2. f_I^U is a function $f_I^U : U \rightarrow U_I$
3. P_I is a set of relations $P_I = \{p_1^I, \dots, p_n^I\}$ with $p_i^I \subseteq U_I^k$ for $ar(p_i) = k$ ($i = 1, \dots, n$) and
4. F_I is a set of functions $F_I = \{f_1^I, \dots, f_m^I\}$ with $f_i^I : U_I^k \rightarrow U_I$ for $ar(f_i) = k$ ($i = 1, \dots, m$)

Example

Let Σ_1 be as before. Define $I = (U_I, f_I^U, P_I, F_I)$ through

$$U_I = \{ \text{"John Johnsson"}, \text{"Carl Carlson"}, \text{"Mary Meyer"}, \\ \text{"Dave Davidson"} \}$$

$$f_I^U(\text{john}) = \text{"John Johnsson"} \quad \dots$$

$$P_I = \{ \text{knows}^I, \text{brotherOf}_I \}$$

$$\text{with } \text{knows}^I = \{ (\text{"John Johnsson"}, \text{"Carl Carlson"}), \\ (\text{"Carl Carlson"}, \text{"Dave Davidson"}) \}$$

$$\text{brotherOf}^I = \{ (\text{"Mary Meyer"}, \text{"Dave Davidson"}) \}$$

$$F_I = \{ \text{fatherOf}^I \}$$

$$\text{with } \text{fatherOf}^I(\text{"Mary Meyer"}) = \text{"Carl Carlson"} \quad \dots$$

What about variables?

Definition

Let $\Sigma = (U, P, F)$ be a first-order signature, $I = (U_I, f_I^U, P_I, F_I)$ a first-order interpretation and V a set of variables. A *variable assignment* VA for V wrt. Σ and I is a function $VA : V \rightarrow U_I$.

Example

Let Σ_1 , V_1 , and I as before. Then $VA_1 : V_1 \rightarrow U_I$ defined via

$$VA(X) = \text{"Carl Carlsson"}$$

$$VA(Y) = \text{"Mary Meyer"}$$

$$VA(Z) = \text{"Carl Carlsson"}$$

is a variable assignment.

Given an interpretation $I = (U_I, f_I^U, P_I, F_I)$ and variable assignment $VA : V \rightarrow U_I$ we abbreviate

$$\begin{aligned} VA(c) &= f_I^U(c) && \text{if } c \in U \\ VA(f(t_1, \dots, t_k)) &= f^I(VA(t_1), \dots, VA(t_k)) \end{aligned}$$

We now turn to the satisfaction relation of first-order logic

Definition

Let $\Sigma = (U, P, F)$ be a first-order signature, V a set of variables, $I = (U_I, f_I^U, P_I, F_I)$ a first-order interpretation, $X \in V$, VA a variable assignment, and $\phi, \psi \in \mathcal{L}(\Sigma, V)$. Define inductively

$(I, VA) \models p(t_1, \dots, t_k)$	iff $(VA(t_1), \dots, VA(t_k)) \in p^I$
$(I, VA) \models \phi \vee \psi$	iff $(I, VA) \models \phi$ or $(I, VA) \models \psi$
$(I, VA) \models \phi \wedge \psi$	iff $(I, VA) \models \phi$ and $(I, VA) \models \psi$
$(I, VA) \models \neg \phi$	iff $(I, VA) \not\models \phi$

$(I, VA) \models \forall X : \phi$ iff for all VA' with $VA' = VA$ except possibly $VA'(X) \neq VA(X)$ we have $(I, VA') \models \phi$

$(I, VA) \models \exists X : \phi$ iff for at least one VA' with $VA' = VA$ except possibly $VA'(X) \neq VA(X)$ we have $(I, VA') \models \phi$

Define additionally $(I, VA) \models \top$ and $(I, VA) \not\models \perp$ for every I and VA and

$I \models \phi$ iff for all VA we have $(I, VA) \models \phi$

Remark

The terms *model*, *entailment* and *equivalence* are defined as in propositional logic.

First-order logic - semantics 7/8

Consider

$$\phi = \forall X : \exists Y : \text{knows}(X, Y)$$

and the interpretation $I = (U_I, f_I^U, P_I, F_I)$ defined via

$$U_I = \{ \text{"John Johnsson"}, \text{"Carl Carlson"}, \text{"Mary Meyer"} \}$$

$$f_I^U(\text{john}) = \text{"John Johnsson"} \quad \dots$$

$$P_I = \{ \text{knows}^I \}$$

$$\begin{aligned} \text{with } \text{knows}^I = \{ & (\text{"John Johnsson"}, \text{"Carl Carlson"}), \\ & (\text{"Carl Carlson"}, \text{"John Johnsson"}), \\ & (\text{"Mary Meyer"}, \text{"Carl Carlson"}) \} \end{aligned}$$

$$F_I = \{ \}$$

Is it true that $I \models \phi$?

$I \models \forall X : \exists Y : \text{knows}(X, Y)$

\iff for all $VA : (I, VA) \models \forall X : \exists Y : \text{knows}(X, Y)$

\iff for all VA : for all VA' with $VA' = VA$
except possibly $VA'(X) \neq VA(X)$
we have $(I, VA') \models \exists Y : \text{knows}(X, Y)$

\iff for all $VA : (I, VA) \models \exists Y : \text{knows}(X, Y)$

\iff for all VA : for some VA' with $VA' = VA$
except possibly $VA'(Y) \neq VA(Y)$
we have $(I, VA') \models \text{knows}(X, Y)$

First-order logic - semantics 8/8

We have either

$VA(X) = \text{"John Johnsson"}$ or

$VA(X) = \text{"Carl Carlson"}$ or

$VA(X) = \text{"Mary Meyer"}$.

Let's try $VA(X) = \text{"John Johnsson"}$. Then define VA' with $VA'(Y) = \text{"Carl Carlson"}$ and $VA' = VA$ otherwise, consider:

$(I, VA') \models \text{knows}(X, Y)$

$\iff (VA'(X), VA'(Y)) \in \text{knows}'$

$\iff (\text{"John Johnsson"}, \text{"Carl Carlson"}) \in \text{knows}'$

$\iff \text{TRUE}$

For $VA(X) = \text{"Carl Carlson"}$ and $VA(X) = \text{"Mary Meyer"}$ we can find an appropriate VA' as well.

It follows that $I \models \forall X : \exists Y : \text{knows}(X, Y)$.

First-order logic - calculus, implementation

- ▶ Automatic reasoning with first-order logic is also called “(automatic) theorem proving”
- ▶ For general first-order logic, the problem “is there an I with $I \models \phi$?” is *undecidable* [Turing, 1937]
- ▶ (Impossible to construct an algorithm that always leads to a correct yes-or-no answer)
- ▶ There is a wide range of syntactic restrictions of first-order logic (such as description logics) which are decidable.
- ▶ Implementations/systems for first-order logic:
 - ▶ EProver: <http://www.lehre.dhbw-stuttgart.de/~sschulz/E/E.html>
 - ▶ Vampire: <https://vprover.github.io>
 - ▶ Hyper: <https://userpages.uni-koblenz.de/~obermaie/hyper/hyper.htm>

First-order logic and propositional logic

- ▶ First-order logic is a *faithful generalisation* of propositional logic
 - ▶ Any propositional logic can be embedded into a first-order logic
 - ▶ If At is a propositional signature then $\Sigma_{At} = (\emptyset, At, \emptyset)$, with $ar(a) = 0$ for every $a \in At$, is the corresponding first-order signature
 - ▶ Then $\mathcal{L}(At) \subseteq \mathcal{L}(\Sigma, \emptyset)$
 - ▶ All other notions (satisfaction, entailment) are then equivalent
- whenever we can use propositional logic formulas we can also use first-order logic

Chapter 2.1: Classical logics

Summary

Chapter 2.1: Summary

- ▶ Syntax and semantics of formal logics
- ▶ Propositional logic
 - ▶ Syntax: signature, \wedge , \vee , \neg
 - ▶ Semantics: interpretations, models, satisfaction relation
 - ▶ Inference, equivalence
 - ▶ Satisfiability, CNF, SAT
- ▶ First-order logic
 - ▶ Syntax: signature, variables, terms, atoms, \wedge , \vee , \neg , \forall , \exists
 - ▶ Semantics: interpretations, variable assignments, models, satisfaction relation
 - ▶ Automatic theorem proving

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First-order logic and Horn logic 1/2

- ▶ Drawback of first-order logic: too expressive and therefore not decidable in general
- ▶ Wanted: Subset of first-order logic that is expressive but decidable
 - ▶ For modelling (ontologies, semantic web): description logic
 - ▶ For programming: Horn logic
- ▶ Horn logic is the foundation of most logical programming languages such as Prolog

First- order logic and Horn logic 2/2

- ▶ Recall definition *clause* (propositional logic): a disjunction of literals
- ▶ Definition is the same for first-order logic, example:

$$s(a, b) \vee \neg t(a) \vee \neg r(b, c)$$

Definition

A *Horn clause* is a clause with at most one positive literal.

Examples:

- ▶ $s(a, b) \vee \neg t(a)$ is a Horn clause.
- ▶ $p(X) \vee \neg t(Y) \vee \neg u(X, Y)$ is a Horn clause.
- ▶ $q \vee \neg v \vee \neg x$ is a Horn clause.
- ▶ $s(a, b) \vee t(a) \vee \neg r(b, c)$ is not a Horn clause.

Horn clauses and Prolog

- ▶ A Horn clause $h \vee \neg b_1 \vee \dots \vee \neg b_n$ is logically equivalent to an implication

$$h \Leftarrow (b_1 \wedge \dots \wedge b_n)$$

- ▶ Rules (=implications) are the building blocks of Prolog.
- ▶ The syntax of Prolog is very similar to the syntax of first-order logic with few exceptions

First-order logic	Prolog	
\Leftarrow	<code>:-</code>	Rule
\wedge	<code>,</code>	Conjunction
\vee	<code>;</code>	Disjunction
\neg	<code>not</code>	Negation*

*Not exactly the same

Definition

A Prolog program P consists of

1. a data base D
2. and a rule base R

Definition

A data base D is a set of first-order atoms without variables (and without functors). Every atom is terminated by a full stop “.”.

Example

```
childOf(maria, claudia).  
childOf(claudia, berta).  
female(maria).  
female(claudia).  
female(berta).
```

Convention: variables start with an uppercase letter (or with `_`) and constants start with a lowercase letter. Predicate symbols also start with a lowercase letter.

Definition

A rule base R is a set of Horn clauses of the form

$H \text{ :- } B_1, \dots, B_N.$

with H, B_1, \dots, B_N being first-order atoms (without functors).

Example

```
grandchildOf(X,Z) :- childOf(X,Y), childOf(Y,Z).  
mother(X) :- female(X), childOf(_,X).  
male(X) :- not(female(X)).
```

Remark: $_$ is an anonymous variable and can be used if the actual value is not important.

Evaluation of Prolog programs 1/3

- ▶ Prolog programs represent a knowledge base (facts and rules)
- ▶ Prolog programs are “executed” by asking specific *queries*

Definition

A *Prolog query* (also *goal*) is a first-order atom (possibly with variables) with a prefixed `?-.`

Example

- ▶ `?- female(maria)` *Is Maria female?*
- ▶ `?- female(X)` *For what X is it true that X is female?*
- ▶ `?- grandchildOf(maria, X)` *For what X is it true that maria is a grandchild of X?*

Evaluation of Prolog programs 2/3

- ▶ Executing a query means to determine whether the program entails the query.
- ▶ If query contains variables: determine *for which assignments of these variables* the program entails the query (could be none, could be more than one).
- ▶ Semantics of Prolog follows the *Closed World Assumption* (Statements that are not entailed are assumed to be false.)
- ▶ Execution of queries via depth-first backward chaining, where rules are applied *in the order in which they occur in the program*.

Evaluation of Prolog programs 3/3

Data base:

```
childOf(maria, claudia). childOf(claudia, berta).  
female(maria). female(claudia). female(berta).
```

Rule base:

```
grandchildOf(X,Z) :- childOf(X,Y), childOf(Y,Z).  
mother(X) :- female(X), childOf(_,X).  
male(X) :- not(female(X)).
```

- ▶ ?- childOf(maria, berta) No (Not entailed)
- ▶ ?- female(carla) No (Carla is not mentioned)
- ▶ ?- male(dieter) Yes (Why?)
- ▶ ?- mother(X) Yes, with multiple assignments for X:
 - ▶ X = claudia
 - ▶ X = berta

Prolog interpreter: SWI-Prolog 1/4

- ▶ Prolog is an *interpreted* programming language
- ▶ We use *SWI-Prolog* (<http://www.swi-prolog.org/>) for this lecture and for the tutorials

Installation of SWI-Prolog in Unix/Linux

```
$ sudo apt-get install swi-prolog
```

simpleFamily.pl:

```
childOf(maria, claudia).  
childOf(claudia, berta).  
female(maria).  
female(claudia).  
female(berta).  
grandchildOf(X,Z) :- childOf(X,Y), childOf(Y,Z).  
mother(X) :- female(X), childOf(_,X).  
male(X) :- not(female(X)).
```

Execution using SWI-Prolog

```
$ swipl simpleFamily.pl
```

Prolog interpreter: SWI-Prolog 3/4

Interpreter.

```
Welcome to SWI-Prolog (Multi-threaded, 64 bits, Version 6.6.6)
Copyright (c) 1990-2013 University of Amsterdam, VU Amsterdam
SWI-Prolog comes with ABSOLUTELY NO WARRANTY. This is free software,
and you are welcome to redistribute it under certain conditions.
Please visit http://www.swi-prolog.org for details.
```

```
For help, use ?- help(Topic). or ?- apropos(Word).
```

```
?-
```

Asking queries:

```
Welcome to SWI-Prolog (Multi-threaded, 64 bits, Version 6.6.6)
Copyright (c) 1990-2013 University of Amsterdam, VU Amsterdam
SWI-Prolog comes with ABSOLUTELY NO WARRANTY. This is free software,
and you are welcome to redistribute it under certain conditions.
Please visit http://www.swi-prolog.org for details.
```

```
For help, use ?- help(Topic). or ?- apropos(Word).
```

```
?- grandchildOf(maria, X).
```

```
X = berta.
```

```
?-
```

Interpreter is terminated by entering “halt.”

Arithmetic operators 1/3

- ▶ Prolog has built-in functionalities for arithmetics, natural numbers are predefined constants
 - ▶ Addition: $X+2$
 - ▶ Subtraction: $Y-5$
 - ▶ Multiplication: $3*5$
 - ▶ Division: $12/4$
- ▶ Comparison operators
 - ▶ Syntactic equality: $=$
 - ▶ Semantic equality/inequality: $==$
 - ▶ less than/greater than: $>, <, >=, <=$

Example:

```
?- 3+4 = 1+6.  
false.
```

```
?- 3+X = Y+4.  
X = 4,  
Y = 3.
```

Arithmetic operators 2/3

More examples:

```
?- 2*5 == 10.  
true.
```

```
?- 3*3 < 10.  
true.
```

arithmetics1.pl:

```
isSumOf(X,Y,Z) :- X == Y+Z.
```

```
?- isSumOf(10,6,4).  
true.
```

```
?- isSumOf(7,1,3).  
false.
```

Arithmetic operators 3/3

- ▶ Value assignment is realised via `is`: X is *Arithmetic expression*

```
?- X is (2*3+4).  
X=10.
```

arithmetics2.pl:

```
even(0).  
even(X) :- X > 0, Y is (X-1), odd(Y).  
odd(X) :- not(even(X)).
```

```
?- even(2).  
true.  
  
?- even(7).  
false.
```


Termination

Note: Prolog program may not terminate.

Be cautious when implementing, in particular with recursive definitions and arithmetic expressions:

```
t(X) :- t(X+1).
```

```
?- t(1).
```

```
ERROR: Out of global stack
```