



Recap

- A **sentence** is either True or False under an interpretation (or a world).
 - When it is True, we say that it is satisfiable (or is a model).
 - When it is False, then we say that it is unsatisfiable.
 - When a sentence is satisfiable under all interpretations (or worlds), then we say that it is a valid sentence or a tautology.
- Given that N objects are used in a **KB**, there will be 2^N possible interpretations (or worlds).

2

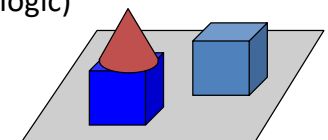
Recap

- **Soundness and Completeness**
 - Refer to an inference procedure
 - We do not say a sentence is sound or complete. An inference procedure is sound if we can derive True sentence from True sentences. That is, it implements entailment.
 - MP implements entailments
 - An inference procedure is complete if we can derive the proof of all entailed sentences (or valid sentences).

3

Representing Knowledge

- **Knowledge-based agent**
 - Have representations of the world in which they operate
 - Use those representations to infer what actions to take
- **Ontological commitments**
 - The world as facts (propositional logic)
 - The world as objects (first-order logic) with properties about each object, and relations between objects
 - e.g. the blocks world:
 - Objects: cubes, cylinders, cones, ...
 - Properties: shape, colour, location, ...
 - Relations: above, under, next-to, ...



4

First-Order Logic (FOL)

- **A very powerful KR scheme**

- Essential representation of the world
 - Deal with objects, properties, and relations.
- Simple, generic representation
 - Does not deal with specialized concepts such as categories, time, and events.
- Universal language
 - Can express anything that can be programmed.
- Most studied and best understood
 - More powerful proposals still debated.
 - Less powerful schemes too limited.

5

Propositional vs. First-Order Logic

- Aristotle's syllogism

- Socrates is a man. All men are mortal. Therefore Socrates is mortal.

Statement	Propositional Logic	First-Order Logic
"Socrates is a man."	SocratesMan, S43	Man(Socrates), P52(S21)
"Plato is a man."	PlatoMan, S157	Man(Plato), P52(S99)
"All men are mortal."	MortalMan S421 Man \Rightarrow Mortal S9 \Rightarrow S4	Man(x) \Rightarrow Mortal(x), P52(V1) \Rightarrow P66(V1)
"Socrates is mortal."	MortalSocrates S957 S43 \wedge S421 \mid \neg S957 ?!?	Mortal(Socrates) V1 \leftarrow S21, ... \mid \neg P66(S21)

6

Syntax and Semantics of FOL

- **Sentences**

- Built from quantifiers, predicate symbols, and terms

- **Terms**

- Represent objects
- Built from variables, constant and function symbols

- **Constant symbols**

- Refer to ("name") particular objects of the world
 - The object is specified by the interpretation
 - e.g. "John" is a constant, may refer to "John, king of England from 1199 to 1216 and younger brother of Richard Lionheart", or my uncle, or ...

7

Syntax and Semantics of FOL

- **Variables**

- Refer to any object of the world
 - e.g. x, person, ... as in Brother(KingJohn, person).
- Can be substituted by a constant symbol
 - e.g. person \leftarrow Richard, yielding Brother(KingJohn, Richard).

- **Terms**

- Logical expressions referring to objects
 - Include constant symbols ("names") and variables.
 - Make use of function symbols.
e.g. LeftLegOf(KingJohn) to refer to his leg without naming it
- Compositional interpretation
 - e.g. LeftLegOf(), KingJohn \rightarrow LeftLegOf(KingJohn).

8

Predicate and Function Symbols

- **Predicate symbols**

- Refer to particular relations on objects
 - Binary relation specified by the interpretation
e.g. $\text{Brother}(\text{KingJohn}, \text{RichardLionheart}) \rightarrow \text{T or F}$
- A n -ary relation if defined by a set of n -tuples
 - Collection of objects arranged in a fixed order
e.g. $\{ \langle \text{KingJohn}, \text{RichardLionheart} \rangle, \langle \text{KingJohn}, \text{Henry} \rangle, \dots \}$

Returns
T/F

- **Function symbols**

- Refer to functional relations on objects
 - Many-to-one relation specified by the interpretation
e.g. $\text{BrotherOf}(\text{KingJohn}) \rightarrow \text{a person, e.g. Richard (not T/F)}$
- Defined by a set of $n+1$ -tuples
 - Last element is the function value for the first n elements.

Returns
anything but
T/F

9

Function Symbol Example

- A function of arity n takes n objects of type W_1, \dots, W_n as inputs and returns an object of type W .

- Example:

– $\text{Plus}(3, 4) = 7$

Object Terms

Functional Term

10

Predicate Symbol Example

- Predicates are like functions except that their return type is True or False.
- Example:
 - $\text{Greater-Than}(3, 4) = \text{False}$

11

Sentences in FOL

- **Atomic sentences**

- State facts, using terms and predicate symbols
 - e.g. $\text{Brother}(\text{Richard}, \text{John})$.
- Can have complex terms as arguments
 - e.g. $\text{Married}(\text{FatherOf}(\text{Richard}), \text{MotherOf}(\text{John}))$.
- Have a truth value
 - Depends on both the interpretation and the world.

- **Complex sentences**

- Combine sentences with connectives
 - e.g. $\text{Father}(\text{Henry}, \text{KingJohn}) \wedge \text{Mother}(\text{Mary}, \text{KingJohn})$
- Connectives identical to propositional logic
 - i.e.: $\wedge, \vee, \Leftrightarrow, \Rightarrow, \neg$

12

Sentence Equivalence

- **There are many ways to write a logical statement in FOL**

– Example

- $A \Rightarrow B$ equivalent to $\neg A \vee B$
“rule form” “complementary cases”
 $\text{Dog}(x) \Rightarrow \text{Mammal}(x)$ $\neg \text{Dog}(x) \vee \text{Mammal}(x)$
“dogs are mammals” “either it’s not a dog or it’s a mammal”
- $A \wedge B \Rightarrow C$ equivalent to $A \Rightarrow (B \Rightarrow C)$
- Proof: $A \wedge B \Rightarrow C \Leftrightarrow \neg (A \wedge B) \vee C \Leftrightarrow (\neg A \vee \neg B) \vee C$
 $\Leftrightarrow \neg A \vee \neg B \vee C \Leftrightarrow \neg A \vee (\neg B \vee C)$
 $\neg P \vee Q \Leftrightarrow P \Rightarrow Q \Leftrightarrow \neg A \vee (B \Rightarrow C) \Leftrightarrow A \Rightarrow (B \Rightarrow C)$

13

Sentences in Normal Form

- **There is only one way to write a logical statement using a Normal Form of FOL**

– Example

- $A \Rightarrow B, A \wedge B \Rightarrow C$ equivalent to $\neg A \vee B, \neg A \vee \neg B \vee C$
“Implicative Normal Form” “Conjunctive Normal Form”

- **Rewriting logical sentences allows to determine whether they are equivalent or not**

– Example

- $A \wedge B \Rightarrow C$ and $A \Rightarrow (B \Rightarrow C)$
- both have the same CNF: $\neg A \vee \neg B \vee C$

14

Sentence Verification

- **Rewriting logical sentences helps to understand their meaning**

– Example

- $\text{Owns}(x,y) \Rightarrow (\text{Dog}(y) \Rightarrow \text{AnimalLover}(x))$ $A \Rightarrow (B \Rightarrow C)$
- $\text{Owns}(x,y) \wedge \text{Dog}(y) \Rightarrow \text{AnimalLover}(x)$ $A \wedge B \Rightarrow C$
“A dog owner is an animal lover”

- **Rewriting logical sentences helps to verify their meaning is as intended**

– Example

- “Dogs all have the same enemies”
 $\text{Dog}(x) \wedge \text{Enemy}(z, x) \Rightarrow (\text{Dog}(y) \Rightarrow \text{Enemy}(z, y))$ same as
 $\text{Dog}(x) \wedge \text{Dog}(y) \wedge \text{Enemy}(z, x) \Rightarrow \text{Enemy}(z, y)$

15

Universal Quantifier \forall

- **Express properties of collections of objects**

– Make a statement about every objects w/out enumerating

- e.g. “All kings are mortal”
 $\text{King}(\text{Henry}) \Rightarrow \text{Mortal}(\text{Henry}) \wedge$
 $\text{King}(\text{John}) \Rightarrow \text{Mortal}(\text{John}) \wedge$
 $\text{King}(\text{Richard}) \Rightarrow \text{Mortal}(\text{Richard}) \wedge$
 $\text{King}(\text{London}) \Rightarrow \text{Mortal}(\text{London}) \wedge$
...

– instead: $\forall x, \text{King}(x) \Rightarrow \text{Mortal}(x)$

- Note: the semantics of the implication says $F \Rightarrow F$ is TRUE.
- Thus, for those individuals that satisfy the premise $\text{King}(x)$, the rule asserts the conclusion $\text{Mortal}(x)$
- But, for those individuals that do not satisfy the premise, the rule makes no assertion.

16

Using the Universal Quantifier

\forall must be used with Rule (\Rightarrow)

- The implication (\Rightarrow) is the natural connective to use with the universal quantifier (\forall)

– Example

- General form: $\forall x P(x) \Rightarrow Q(x)$
 - e.g. $\forall x \text{Dog}(x) \Rightarrow \text{Mammal}(x)$ “all dogs are mammals”
 - Use conjunction? $\forall x P(x) \wedge Q(x)$
 - e.g. $\forall x \text{Dog}(x) \wedge \text{Mammal}(x)$
 - same as $\forall x P(x)$ and $\forall x Q(x)$
 - e.g. $\forall x \text{Dog}(x)$ and $\forall x \text{Mammal}(x)$
- All dogs are mammals. All mammals are dogs.* **Not correct.**
- \rightarrow yields a very strong statement (too strong! i.e. *incorrect*)

17

Existential Quantifier \exists

- Express properties of **some** particular objects

– Make a statement about one object without naming it

- e.g., “King John has a brother who is king”

- $\exists x, \text{Brother}(x, \text{KingJohn}) \wedge \text{King}(x)$

- instead of

$\text{Brother}(\text{Henry}, \text{KingJohn}) \wedge \text{King}(\text{Henry}) \vee$
 $\text{Brother}(\text{London}, \text{KingJohn}) \wedge \text{King}(\text{London}) \vee$
 $\text{Brother}(\text{Richard}, \text{KingJohn}) \wedge \text{King}(\text{Richard}) \vee$
 ...

18

Using the Existential Quantifier

- The conjunction (\wedge) is the natural connective to use with the existential quantifier (\exists)

– Example

- General form: $\exists x P(x) \wedge Q(x)$
 - e.g., $\exists x \text{Dog}(x) \wedge \text{Owns}(\text{John}, x)$, “John owns a dog”
- Use Implication? $\exists x P(x) \Rightarrow Q(x)$
 - e.g., $\exists x \text{Dog}(x) \Rightarrow \text{Owns}(\text{John}, x)$
 - Could be true for all x such that $P(x)$ is false
 - e.g., $\text{Dog}(\text{Garfield_the_cat}) \Rightarrow \text{Owns}(\text{John}, \text{Garfield_the_cat})$
 - \rightarrow yields a very weak statement (too weak! i.e. *useless*)



Properties of \Rightarrow
 if $T \Rightarrow T$
 $F \Rightarrow T/F$

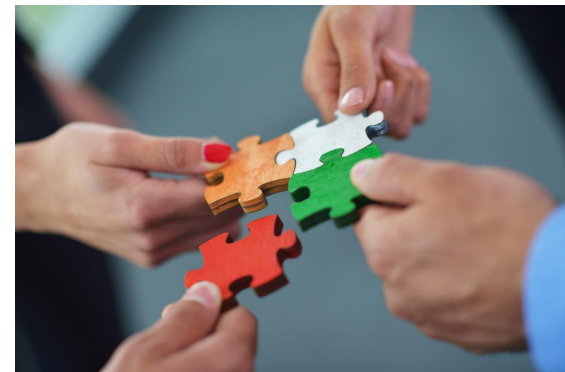
\downarrow
 F

\downarrow
 can be T

\downarrow \therefore WRONG

19

Thank you!



20

CZ3005 Artificial Intelligence

Week 10b – First-Order Logic

Yu Han

han.yu@ntu.edu.sg

Nanyang Assistant Professor
School of Computer Science and Engineering
Nanyang Technological University



Recap

- **Normal Forms**
 - $P \Rightarrow Q$ can be rewritten as $\neg P \vee Q$
- **Auto documentation with predicate naming**
 - Reading from left to right
 - e.g., grandfather(Philip, William)
- **For all** quantifier (universal for all models) is used with implication connective
 - \forall with \Rightarrow
- **Existential** quantifier (satisfiable for at least one model) is used with and connective
 - \exists with \wedge

Recap

- **First-Order Logic:**
 - Allows descriptions of relations and properties.
 - Allows the descriptions of relations and properties in a compounded manner.
 - Permits the use of constant and variables.
 - Allows general statements to be made.
 - Separation of inference from the representation of knowledge.

Recap

Generation of complex sentences

Composition via

Connectives – expressiveness

i.e. complex relations

Generalization – universal statement

– existential statement

Nesting and Mixing Quantifiers

Combining \forall and \exists

– Express more complex sentences

- e.g., “if x is the parent of y, then y is the child of x”:
- $\forall x, \forall y \text{ Parent}(x, y) \Rightarrow \text{Child}(y, x)$
- “everyone has a parent”: $\forall x, \exists y \text{ Parent}(y, x)$

– Semantics depends on quantifiers ordering

- e.g., $\exists y, \forall x \text{ Parent}(y, x)$
- “there is someone who is everybody’s parent”?

Well-formed formula (WFF)

– Sentences with all variables properly quantified

there exists a y such that for all x, y is the parent of x

For all x & all y if x is the parent of y, y must be parent of x

For all x, there must exist y such that y is the parent of x

Equality Predicate Symbol

Need for equality

– State that two terms refer to the same object

- e.g., $\text{Father}(\text{John}) = \text{Henry}$, or
- $= (\text{Father}(\text{John}), \text{Henry})$

– Useful to define properties

- e.g. “King John has two brothers”:
- $\exists x, y \text{ Brother}(x, \text{KingJohn}) \wedge \text{Brother}(y, \text{KingJohn}) \wedge \neg(x=y)$

distinguish two different persons.

Connections between Quantifiers

Equivalences

– Using the negation (hence only one quantifier is needed)

$$\forall x P(x) \Leftrightarrow \neg \exists x \neg P(x)$$

- e.g. “everyone is mortal”:

$$\forall x \text{ Mortal}(x) \Leftrightarrow \neg \exists x \neg \text{Mortal}(x)$$

there does not exist any x such that P(x) is true

– De Morgan’s Laws

$$\forall x P \Leftrightarrow \neg \exists x \neg P$$

$$\forall x \neg P \Leftrightarrow \neg \exists x P$$

$$\neg \forall x P \Leftrightarrow \exists x \neg P$$

$$\neg \forall x \neg P \Leftrightarrow \exists x P$$

$$P \wedge Q \Leftrightarrow \neg(\neg P \vee \neg Q)$$

$$\neg P \wedge \neg Q \Leftrightarrow \neg(P \vee Q)$$

$$\neg(P \wedge Q) \Leftrightarrow \neg P \vee \neg Q$$

$$\neg(\neg P \wedge \neg Q) \Leftrightarrow P \vee Q$$

Grammar of First-Order Logic

(Backus-Naur Form)

Sentence	→	<u>AtomicSentence</u> (Sentence) Sentence <u>Connective</u> Sentence \neg Sentence <u>Quantifier</u> Variable, ... Sentence
AtomicSentence	→	<u>Predicate</u> (Term, ...) <u>Term</u> = Term
Term	→	<u>Function</u> (Term, ...) <u>Constant</u> <u>Variable</u>
Connective	→	\wedge \vee \Leftrightarrow \Rightarrow
Quantifier	→	\forall \exists
Constant	→	A X_1 John ...
Variable	→	a x person ...
Predicate	→	P() Colour() Before() ...
Function	→	F() MotherOf() SquareRootOf() ...

Using First-Order Logic

• Knowledge domain

- A part of the world we want to express knowledge about

• Example of the kinship domain

- Objects: people e.g., Elizabeth, Charles, William, etc.
- Properties: gender i.e., male, female
Unary predicates: Male() and Female()
- Relations: kinship e.g., motherhood, brotherhood, etc.
Binary predicates: Parent(), Sibling(), Brother(), Child(), etc.
Functions: MotherOf(), FatherOf() ← Unary
- > Express facts e.g., Charles is a male
and rules e.g., the mother of a parent is a grandmother

9

Sample Functions and Predicates

• Functions

$$\forall x,y \text{ FatherOf}(x)=y \Leftrightarrow \text{Parent}(y,x) \wedge \text{Male}(y)$$

$$\forall x,y \text{ MotherOf}(x)=y \Leftrightarrow \text{Parent}(y,x) \wedge \text{Female}(y)$$

• Predicates

$$\forall x,y \text{ Parent}(x,y) \Leftrightarrow \text{Child}(y,x)$$

$$\forall x,y \text{ Grandparent}(x,y) \Leftrightarrow \exists z, \text{Parent}(x,z) \wedge \text{Parent}(z,y)$$

$$\forall x,y \text{ Sibling}(x,y) \Leftrightarrow \neg x=y \wedge \exists z, \text{Parent}(z,x) \wedge \text{Parent}(z,y)$$

$$\forall x \text{ Male}(x) \Leftrightarrow \neg \text{Female}(x)$$

• Potential problems

- Self-definition (causes infinite recursion)

$$\text{e.g., } \forall x,y \text{ Child}(x,y) \Leftrightarrow \text{Parent}(y,x) \text{ following the above}$$

this to defined like this recursive

transit two levels of parents.

In KB Just list child (John, Betty) ;

10

TELLing and ASKing

• TELLing the KB

- Assertion: add a sentence to the knowledge base
 - e.g.
TELL(KB, $\forall x,y \text{ MotherOf}(x)=y \Leftrightarrow \text{Parent}(y,x) \wedge \text{Female}(y)$)
and so on, then
TELL(KB, $\text{Female}(\text{Elizabeth}) \wedge \text{Parent}(\text{Elizabeth}, \text{Charles}) \wedge \text{Parent}(\text{Charles}, \text{William})$)

• ASKing the KB

- Query: retrieve/infer a sentence from the knowledge base
- Yes/No answer
 - e.g. ASK(KB, $\text{Grandparent}(\text{Elizabeth}, \text{William})$)
- Binding list, or substitution
 - e.g. ASK(KB, $\exists x \text{ Child}(\text{William}, x)$) yields {x / Charles}

11

Inferences Rules for FOL

• Inference rules from Propositional Logic

– Modus Ponens

$$\frac{\alpha \Rightarrow \beta, \alpha}{\beta} \text{ if } \alpha(T) \Rightarrow \beta(T)$$

– And-Elimination

$$\frac{\alpha_1 \wedge \alpha_2 \wedge \dots \wedge \alpha_n}{\alpha_i}$$

– Or-Introduction

$$\frac{\alpha_i}{\alpha_1 \vee \alpha_2 \vee \dots \vee \alpha_n}$$

if you link symbols in α_i then if our take not α_i should eval to T

As long as any α_i true you can use OR to

– Double-Negation-Elimination

$$\frac{\neg \neg \alpha}{\alpha} \text{ implies}$$

– And-Introduction

$$\frac{\alpha_1, \alpha_2, \dots, \alpha_n}{\alpha_1 \wedge \alpha_2 \wedge \dots \wedge \alpha_n}$$

– Resolution

$$\frac{\alpha \vee \beta, \neg \beta \vee \gamma}{\alpha \vee \gamma}$$

All interpreted as T when combined \Rightarrow become T

12

Universal Elimination

- $\forall x, \text{Likes}(x, \text{flower})$
- Substituting x by Shirin gives
- $\text{Likes}(\text{Shirin}, \text{flower})$ *No longer Rule*
- The substitution should be done by a constant term.
- In this way, the \forall quantifier can be eliminated.

13

Working Example with Prolog

- SWI-Prolog offers a comprehensive free Prolog environment.
- Since its start in 1987, SWI-Prolog development has been driven by the needs of real world applications.
- SWI-Prolog is widely used in research and education as well as commercial applications.
- Download it here: <https://www.swi-prolog.org/>
- Let's see the "royal family" example together



15

Existential Elimination/Introduction

- **Existential Elimination**
 - $\exists x, \text{likes}(x, \text{flower})$
 - Can be changed to:
 - $\text{likes}(\text{Person}, \text{flower})$
 - As long as the person is not in the knowledge base.
- **Existential Introduction**
 - $\text{Likes}(\text{Marry}, \text{flower})$
 - Can be written as:
 - $\exists x, \text{likes}(x, \text{flower})$

14

Working Example with Prolog

```
SWI-Prolog -- d:/Documents/PhD/Courses/CZ3005/Lab Week 10/family.pl
File Edit Settings Run Debug Help
stack_guard(Guard)
{
  current_prolog_flag(backtrace_depth, Depth)
  -> Depth=0
  ;
  Depth=20
  ;
}
get_prolog_backtrace(Depth,
  Stack0,
  [frame(Fr, guard(Guard))],
  debug(backtrace, 'Stack = ~p', [Stack0]),
  clean_stack(Stack0, Stack1),
  join_stacks(Ctx0, Stack1, Stack)
).

:- dynamic goal_expansion/2.
:- multifile goal_expansion/2.

:- thread_local thread_message_hook/3.
:- dynamic thread_message_hook/3.
:- volatile thread_message_hook/3.

parent_of(warren, jerry).
parent_of(maryalice, jerry).
parent_of(warren, kather).
parent_of(A, B) :-
  brother(B, C),
  parent_of(A, C).

male(jerry).
male(stuart).
male(warren).
male(peter).
true.

?- 
```

16

Thank you!

