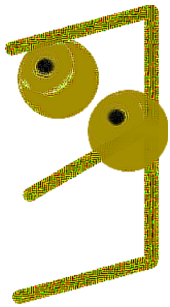
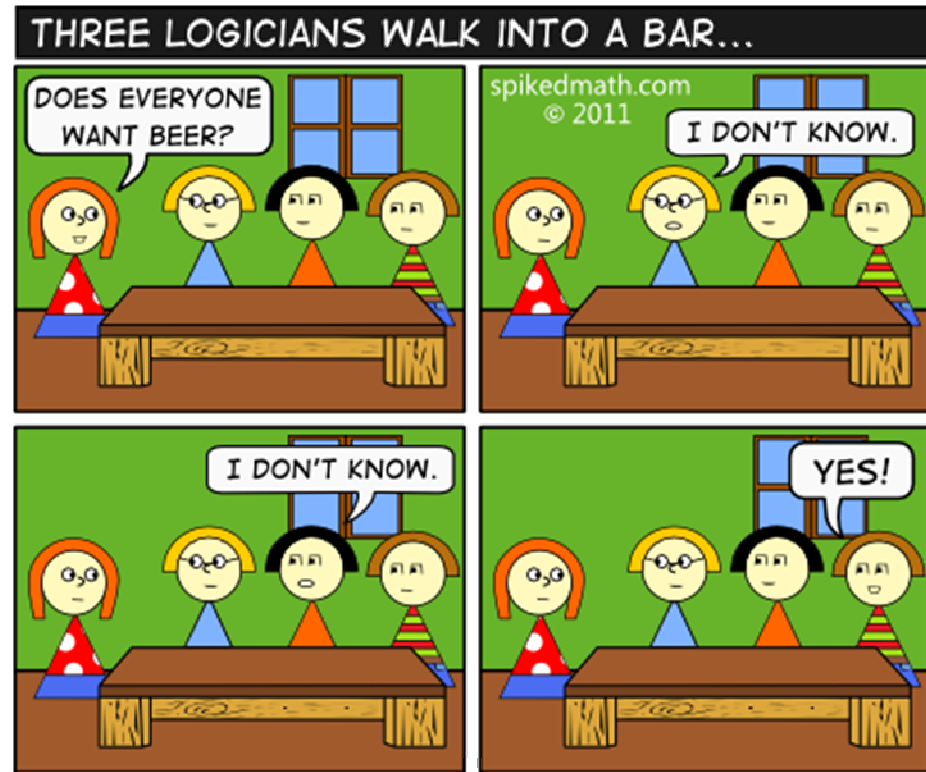


CSE 311: Foundations of Computing

Lecture 6: More Predicate Logic + Inference



Pick
up
HW
solution
at front of room.



Administrative

- **Homework 2 is now posted**
 - Make sure your submissions are readable!
- **Monday: Martin Luther King Day holiday**
- **Tuesday: Extra office hours**
 - Jason 10:30-11:20 CSE 220
 - Josh 12:00-12:50 CSE 220
- **Wednesday: Richard Anderson will teach class**
 - Normal Wednesday office hours too after class.
(I will be away at workshop on complexity of proofs).

Last class: Predicates

Predicate

- A function that returns a truth value, e.g.,

Cat(x) ::= “x is a cat”

Prime(x) ::= “x is prime”

HasTaken(x, y) ::= “student x has taken course y”

LessThan(x, y) ::= “x < y”

Sum(x, y, z) ::= “x + y = z”

GreaterThan5(x) ::= “x > 5”

HasNChars(s, n) ::= “string s has length n”

F. is Local **Predicates** *proposition* can have *predicates with* varying numbers of arguments *no argument* and input types.

Last class: Domain of Discourse

For ease of use, we define one “type”/“domain” that we work over. This set of objects is called the “**domain of discourse**”.

For each of the following, what might the domain be?

(1) “x is a cat”, “x barks”, “x ruined my couch”

“mammals” or “sentient beings” or “cats and dogs” or ...

(2) “x is prime”, “ $x = 0$ ”, “ $x < 0$ ”, “x is a power of two”

“numbers” or “integers” or “integers greater than 5” or ...

(3) “student x has taken course y” “x is a pre-req for z”

“students and courses” or “university entities” or ...

Last Class: Quantifiers

We use *quantifiers* to talk about collections of objects.

$$\forall x P(x)$$

$P(x)$ is true **for every** x in the domain

read as “**for all** x , P of x ”



$$\exists x P(x)$$

There is an x in the domain for which $P(x)$ is true

read as “**there exists** x , P of x ”

Last class: Statements with Quantifiers

Domain of Discourse

Positive Integers

Predicate Definitions

Even(x) ::= "x is even"

Greater(x, y) ::= "x > y"

Odd(x) ::= "x is odd"

Equal(x, y) ::= "x = y"

Prime(x) ::= "x is prime"

Sum(x, y, z) ::= "x + y = z"

Determine the truth values of each of these statements:

$\exists x \text{ Even}(x)$

T e.g. 2, 4, 6, ...

$\forall x \text{ Odd}(x)$

F e.g. 2, 4, 6, ...

$\forall x (\text{Even}(x) \vee \text{Odd}(x))$

T every integer is either even or odd

$\exists x (\text{Even}(x) \wedge \text{Odd}(x))$

F no integer is both even and odd

$\forall x \text{ Greater}(x+1, x)$

T adding 1 makes a bigger number

$\exists x (\text{Even}(x) \wedge \text{Prime}(x))$

T Even(2) is true and Prime(2) is true

Last class: Statements with Quantifiers

Domain of Discourse

Positive Integers

Predicate Definitions

Even(x) ::= "x is even"

Greater(x, y) ::= "x > y"

Odd(x) ::= "x is odd"

Equal(x, y) ::= "x = y"

Prime(x) ::= "x is prime"

Sum(x, y, z) ::= "x + y = z"

Translate the following statements to English

$\forall x \exists y \text{ Greater}(y, x)$

There is no greatest integer.

$\forall x \exists y \text{ Greater}(x, y)$

There is no least integer.

$\forall x \exists y (\text{Greater}(y, x) \wedge \text{Prime}(y))$

For every positive integer there is a larger number that is prime.

$\forall x (\text{Prime}(x) \rightarrow (\text{Equal}(x, 2) \vee \text{Odd}(x)))$

Every prime number is either 2 or odd.

$\exists x \exists y (\text{Sum}(x, 2, y) \wedge \text{Prime}(x) \wedge \text{Prime}(y))$

There exist prime numbers that differ by two."

English to Predicate Logic

Domain of Discourse

Mammals

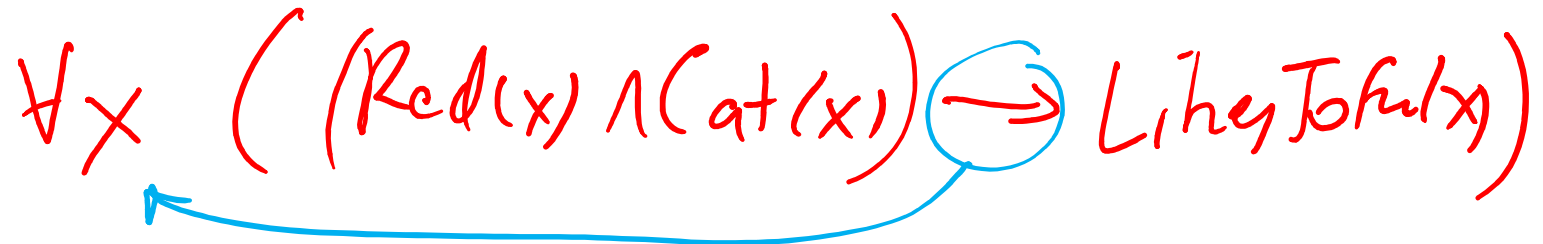
Predicate Definitions

Cat(x) ::= "x is a cat"

Red(x) ::= "x is red"

LikesTofu(x) ::= "x likes tofu"

"Red cats like tofu"

$$\forall x ((\text{Red}(x) \wedge \text{Cat}(x)) \rightarrow \text{LikesTofu}(x))$$


"Some red cats don't like tofu"

$$\exists x ((\text{Cat}(x) \wedge \text{Red}(x)) \wedge \neg \text{LikesTofu}(x))$$


English to Predicate Logic

Domain of Discourse

Mammals

Predicate Definitions

$\text{Cat}(x) ::= \text{"x is a cat"}$

$\text{Red}(x) ::= \text{"x is red"}$

$\text{LikesTofu}(x) ::= \text{"x likes tofu"}$

“Red cats like tofu”

$\forall x ((\text{Red}(x) \wedge \text{Cat}(x)) \rightarrow \text{LikesTofu}(x))$

“Some red cats don’t like tofu”

$\exists y ((\text{Red}(y) \wedge \text{Cat}(y)) \wedge \neg \text{LikesTofu}(y))$

English to Predicate Logic

Domain of Discourse

Mammals

Predicate Definitions

$\text{Cat}(x) ::= \text{"x is a cat"}$

$\text{Red}(x) ::= \text{"x is red"}$

$\text{LikesTofu}(x) ::= \text{"x likes tofu"}$

When putting two predicates together like this, we use an "and".

"Red cats like tofu"

When restricting to a smaller domain in a "for all" we use implication.

When there's no leading quantification, it means "for all".

"Some red cats don't like tofu"

When restricting to a smaller domain in an "exists" we use and.

"Some" means "there exists".

Negations of Quantifiers

Predicate Definitions

PurpleFruit(x) ::= “x is a purple fruit”

(*) $\forall x$ PurpleFruit(x) (“All fruits are purple”)

What is the negation of (*)?

- (a) “there exists a purple fruit”
- (b) “there exists a non-purple fruit”
- (c) “all fruits are not purple”

Try your intuition! Which one “feels” right?

Key Idea: In **every** domain, exactly one of a statement and its negation should be true.

Negations of Quantifiers

Predicate Definitions

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(*) $\forall x$ PurpleFruit(x) ("All fruits are purple")

What is the negation of (*)?

~~(a) "there exists a purple fruit"~~

~~(b) "there exists a non-purple fruit"~~

~~(c) "all fruits are not purple"~~

Key Idea: In **every** domain, exactly one of a statement and its negation should be true.

Domain of Discourse

{plum}

(*), (a)

Domain of Discourse

{apple}

(b), (c)

Domain of Discourse

{plum, apple}

(a), (b)

Negations of Quantifiers

Predicate Definitions

PurpleFruit(x) ::= “x is a purple fruit”

(*) $\forall x$ PurpleFruit(x) (“All fruits are purple”)

What is the negation of (*)?

- (a) “there exists a purple fruit”
- (b) “there exists a non-purple fruit”
- (c) “all fruits are not purple”

Key Idea: In **every** domain, exactly one of a statement and its negation should be true.

Domain of Discourse

{plum}

(*), (a)

Domain of Discourse

{apple}

(b), (c)

Domain of Discourse

{plum, apple}

(a), (b)

The only choice that ensures exactly one of the statement and its negation is (b).

De Morgan's Laws for Quantifiers

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

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

$\exists \leftrightarrow \vee$
 $\forall \leftrightarrow \wedge$

De Morgan's Laws for Quantifiers

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

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

“There is no largest integer”

$$\begin{aligned} & \neg \exists x \forall y (x \geq y) \\ & \equiv \forall x \neg \forall y (x \geq y) \\ & \equiv \forall x \exists y \neg (x \geq y) \\ & \equiv \forall x \exists y (y > x) \end{aligned}$$

There is a largest integer

*Greater Than (x, y)
or Equal to*

De Morgan

De Morgan

“For every integer there is a larger integer”

De Morgan's Laws for Quantifiers

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

Negation of “Red cats like tofu”

$$\begin{aligned} & \neg \forall x ((\text{Red}(x) \wedge \text{Cat}(x)) \rightarrow \text{LikesTofu}(x)) \\ \equiv & \exists x \neg ((\text{Red}(x) \wedge \text{Cat}(x)) \rightarrow \text{LikesTofu}(x)) && \text{De Morgan} \\ \equiv & \exists x \neg (\neg (\text{Red}(x) \wedge \text{Cat}(x)) \vee \text{LikesTofu}(x)) && \text{Implication} \\ \equiv & \exists x (\neg \neg (\text{Red}(x) \wedge \text{Cat}(x)) \wedge \neg \text{LikesTofu}(x)) && \text{De Morgan} \\ \equiv & \exists x ((\text{Red}(x) \wedge \text{Cat}(x)) \wedge \neg \text{LikesTofu}(x)) && \text{Double Neg} \end{aligned}$$

“Some red cats don’t like tofu.”

Scope of Quantifiers

$$\exists x (P(x) \wedge Q(x))$$

vs.

$$\exists x P(x) \wedge \exists x Q(x)$$

Domain

	P	Q
1	T	F
2	F	T
3	T	F
4	F	F
5	T	F
⋮		
1	T	T
1		

scope of quantifiers

$$\exists x (P(x) \wedge Q(x)) \quad \text{vs.} \quad \exists x P(x) \wedge \exists x Q(x)$$

This one asserts P
and Q of the *same* x.

This one asserts P and Q
of potentially different x's.

Scope of Quantifiers

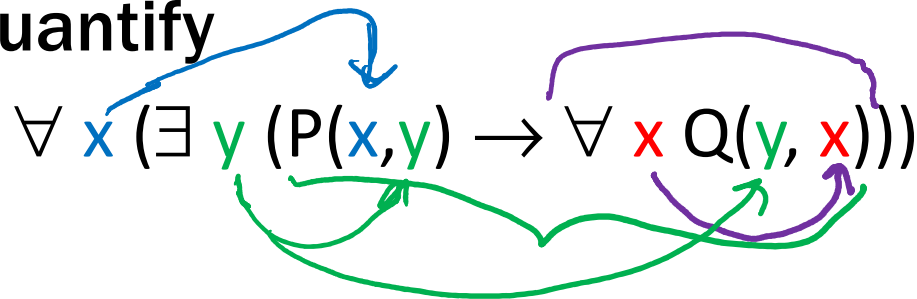
Example: $\text{NotLargest}(x) \equiv \exists y \text{ Greater}(y, x)$
 $\equiv \exists z \text{ Greater}(z, x)$

truth value:

doesn't depend on y or z “**bound** variables”

does depend on x “**free** variable”

quantifiers only act on free variables of the formula
they quantify



Quantifier “Style”

The diagram shows the logical formula $\forall x(\exists y(P(x,y) \rightarrow \forall x Q(y,x)))$. The first x and the y are highlighted in green. The x in the inner universal quantifier is highlighted in red. A blue bracket above the formula spans from the first x to the end of the expression. Two black curved arrows point from a common point below the text to the first x and the red x , indicating the confusion caused by reusing the same variable name.

$$\forall x(\exists y(P(x,y) \rightarrow \forall x Q(y,x)))$$

This isn't “wrong”, it's just horrible style.
Don't confuse your reader by using the same
variable multiple times...there are a lot of letters...

Nested Quantifiers

- **Bound variable names don't matter**

$$\forall x \exists y P(x, y) \equiv \forall a \exists b P(a, b)$$

- **Positions of quantifiers can sometimes change**

$$\forall x (Q(x) \wedge \exists y P(x, y)) \equiv \forall x \exists y (Q(x) \wedge P(x, y))$$

- **But: order is important...**

Quantifier Order Can Matter

Domain of Discourse

Integers

OR

{1, 2, 3, 4}

Predicate Definitions

GreaterEq(x, y) ::= "x ≥ y"

"There is a number greater than or equal to all numbers."

$\exists x \forall y \text{ GreaterEq}(x, y)$

"Every number has a number greater than or equal to it."

$\forall y \exists x \text{ GreaterEq}(x, y)$

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The purple statement requires an entire row to be true.

The red statement requires one entry in each column to be true.

False for integers

Integers T T F F

Quantification with Two Variables

expression	when true	when false
$\forall x \forall y P(x, y)$ $\equiv \forall y \forall x P(x, y)$	Every pair is true.	At least one pair is false.
$\exists x \exists y P(x, y)$ $\equiv \exists y \exists x P(x, y)$	At least one pair is true.	All pairs are false.
$\forall x \exists y P(x, y)$ $\text{not } \equiv$	We can find a specific y for each x. $(x_1, y_1), (x_2, y_2), (x_3, y_3)$	Some x doesn't have a corresponding y.
$\exists y \forall x P(x, y)$	We can find ONE y that works no matter what x is. $(x_1, y), (x_2, y), (x_3, y)$	For any candidate y, there is an x that it doesn't work for.

Logical Inference

Logical Inference

- So far we've considered:
 - How to understand and *express* things using propositional and predicate logic
 - How to *compute* using Boolean (propositional) logic
 - How to show that different ways of expressing or computing them are *equivalent* to each other
- Logic also has methods that let us *infer* implied properties from ones that we know
 - Equivalence is a small part of this

Applications of Logical Inference

- **Software Engineering**
 - Express desired properties of program as set of logical constraints
 - Use inference rules to show that program implies that those constraints are satisfied
- **Artificial Intelligence**
 - Automated reasoning
- **Algorithm design and analysis**
 - e.g., Correctness, Loop invariants.
- **Logic Programming, e.g. Prolog** , SAT solvers
 - Express desired outcome as set of constraints
 - Automatically apply logic inference to derive solution

Proofs

- **Start with hypotheses and facts**
- **Use rules of inference to extend set of facts**
- **Result is proved when it is included in the set**

An inference rule: *Modus Ponens*

- If p and $p \rightarrow q$ are both true then q must be true
- Write this rule as
$$\frac{p, p \rightarrow q}{\therefore q}$$
- Given:
 - If it is Monday then you have a 311 class today.
 - It is Monday.
- Therefore, by Modus Ponens:
 - You have a 311 class today.

My First Proof!

$\frac{p, p \rightarrow q}{\therefore q}$

Show that r follows from p , $p \rightarrow q$, and $q \rightarrow r$

1. p Given

2. $p \rightarrow q$ Given

3. $q \rightarrow r$ Given

4. q

5.

By M. dis. process from 1 and 2
By M.P. from 4 and 3

r

My First Proof!

FA, 254

Show that r follows from p , $p \rightarrow q$, and $q \rightarrow r$

$\therefore q$

- | | | |
|----|-------------------------------------|----------|
| 1. | p | Given |
| 2. | $p \rightarrow q$ | Given |
| 3. | <u>$q \rightarrow r$</u> | Given |
| 4. | <u>q</u> | MP: 1, 2 |
| 5. | r | MP: 3, 4 |

Proofs can use equivalences too

$p, p \rightarrow q$
 $\vdash q$

Show that $\neg p$ follows from $p \rightarrow q$ and $\neg q$

1. $p \rightarrow q$

Given —

2. $\neg q$

Given ←

3. $\neg q \rightarrow \neg p$

Contrapositive: 1

4. $\neg p$

MP: 2, 3

Inference Rules

- Each **inference rule** is written as:
...which means that if both A and B are true then you can infer C and you can infer D.
 - For rule to be correct $(A \wedge B) \rightarrow C$ and $(A \wedge B) \rightarrow D$ must be a tautologies

$$\frac{A, B}{\therefore C, D}$$

- Sometimes rules don't need anything to start with. These rules are called **axioms**:
 - e.g. *Excluded Middle Axiom*

$$\frac{}{\therefore p \rightarrow p}$$

$$\frac{}{\therefore p \vee \neg p}$$