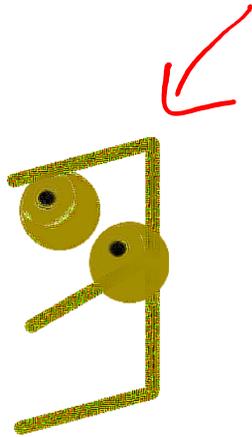
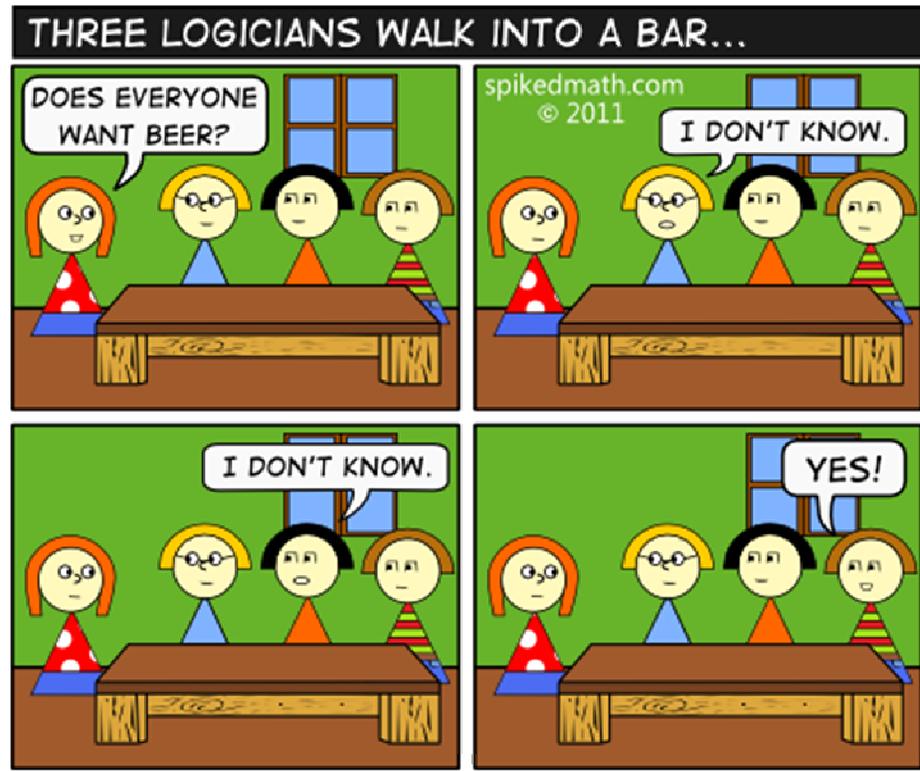


# CSE 311: Foundations of Computing

## Lecture 6: More Predicate Logic + Inference



Pick up HW solutions at front of room.



# Administrative

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- **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

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## 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”

*File is loaded* **Predicates** can have *proposition* varying numbers of arguments *predicates with no arguments* and input types.

# Last class: Domain of Discourse

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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

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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:

- |   |          |                                      |
|---|----------|--------------------------------------|
| $\exists x \text{ Even}(x)$                         | <b>T</b> | e.g. 2, 4, 6, ...                    |
| $\forall x \text{ Odd}(x)$                          | <b>F</b> | e.g. 2, 4, 6, ...                    |
| $\forall x (\text{Even}(x) \vee \text{Odd}(x))$     | <b>T</b> | every integer is either even or odd  |
| $\exists x (\text{Even}(x) \wedge \text{Odd}(x))$   | <b>F</b> | no integer is both even and odd      |
| $\forall x \text{ Greater}(x+1, x)$                 | <b>T</b> | adding 1 makes a bigger number       |
| $\exists x (\text{Even}(x) \wedge \text{Prime}(x))$ | <b>T</b> | 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

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Domain of Discourse

Mammals

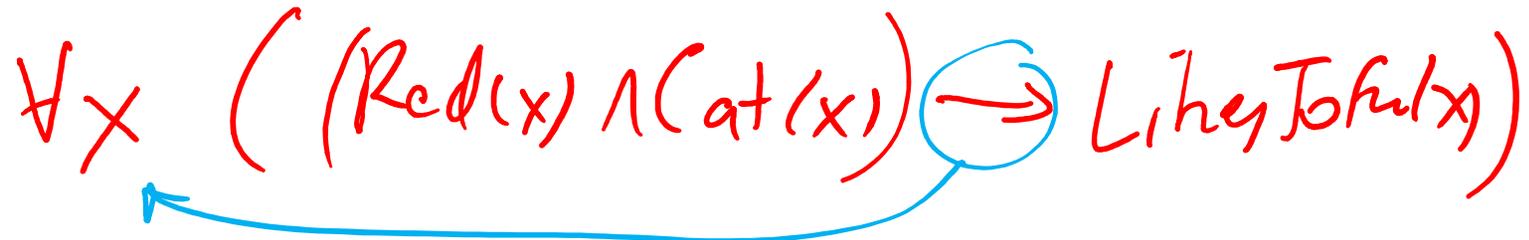
Predicate Definitions

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

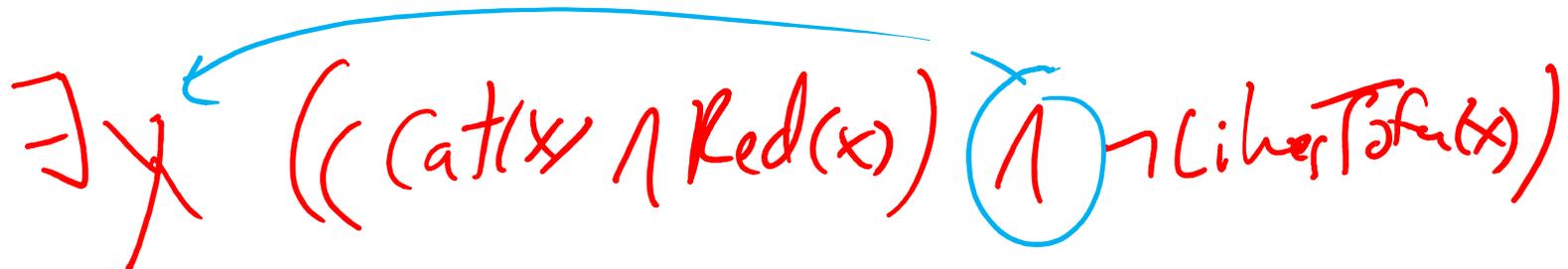
Red(x) ::= "x is red"

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

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"**

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

# 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"

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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What is the negation of (\*)?

(a) "there exists a purple fruit"

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(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

---

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

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

$$\begin{array}{l} \exists \leftrightarrow \vee \\ \forall \leftrightarrow \wedge \end{array}$$

# 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”**

$$\neg \exists x \forall y (x \geq y)$$
$$\equiv \forall x \neg \forall y (x \geq y)$$
$$\equiv \forall x \exists y \neg (x \geq y)$$
$$\equiv \forall x \exists y (y > x)$$

*There's a largest if  $\exists x \forall y (x \geq y)$*

*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

---

$$\begin{aligned}\neg \forall x P(x) &\equiv \exists x \neg P(x) \\ \neg \exists x P(x) &\equiv \forall x \neg P(x)\end{aligned}$$

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	T	T
3	F	F
4	F	F
5	T	F
⋮	⋮	⋮
⋮	T	T

Handwritten annotations: A blue oval encircles the entire table. A purple oval encircles the 'T' in the second row of the 'P' column and the 'T' in the second row of the 'Q' column. A blue oval encircles the 'T' in the bottom row of the 'P' column and the 'T' in the bottom row of the 'Q' column. Red arrows point from the top of the 'P' and 'Q' columns to their respective headers. Red wavy lines underline the 'P(x)' and 'Q(x)' terms in the second formula above.

## 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”

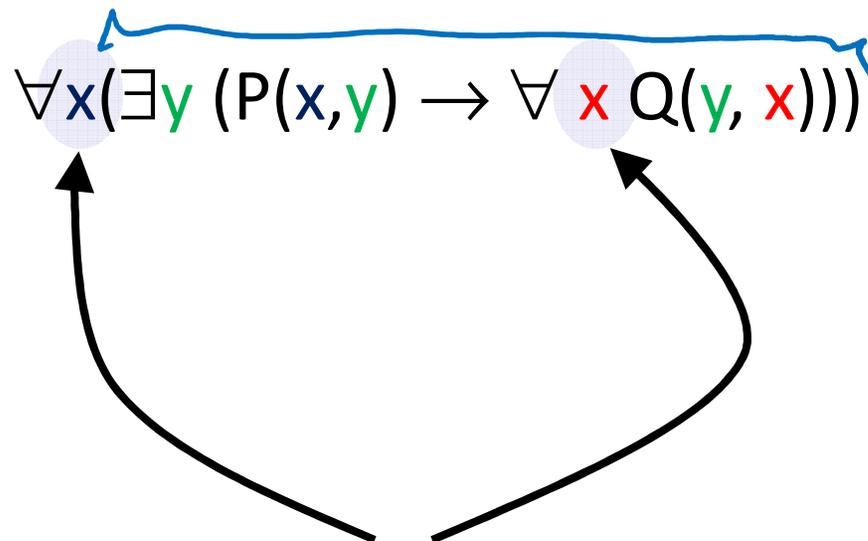
does depend on  $x$  “**free** variable”

**quantifiers only act on free variables** of the formula  
they quantify

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

# Quantifier “Style”

---

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


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

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- **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"

	y			
	1	2	3	4
1	T	F	F	F
2	T	T	F	F
3	T	T	T	F
4	T	T	T	T

“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.”

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

← true for both

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 | T

# Quantification with Two Variables

expression	when <b>true</b>	when <b>false</b>
$\forall x \forall y P(x, y)$ $\equiv \forall y \forall x P(x, y)$	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.
$\forall x \exists y P(x, y)$ <i>not <math>\equiv</math></i>	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

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- **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. | $q$               | By Modus Ponens from 1 and 2 |
| 5. | $r$               | By M.P from 4 and 3          |

# My First Proof!

---

FA, RSY

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

# Proofs can use equivalences too

---

$p, p \rightarrow q$   
          
 $\therefore q$

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.

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

- For rule to be correct  $(A \wedge B) \rightarrow C$  and  $(A \wedge B) \rightarrow D$  must be a tautologies

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

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

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