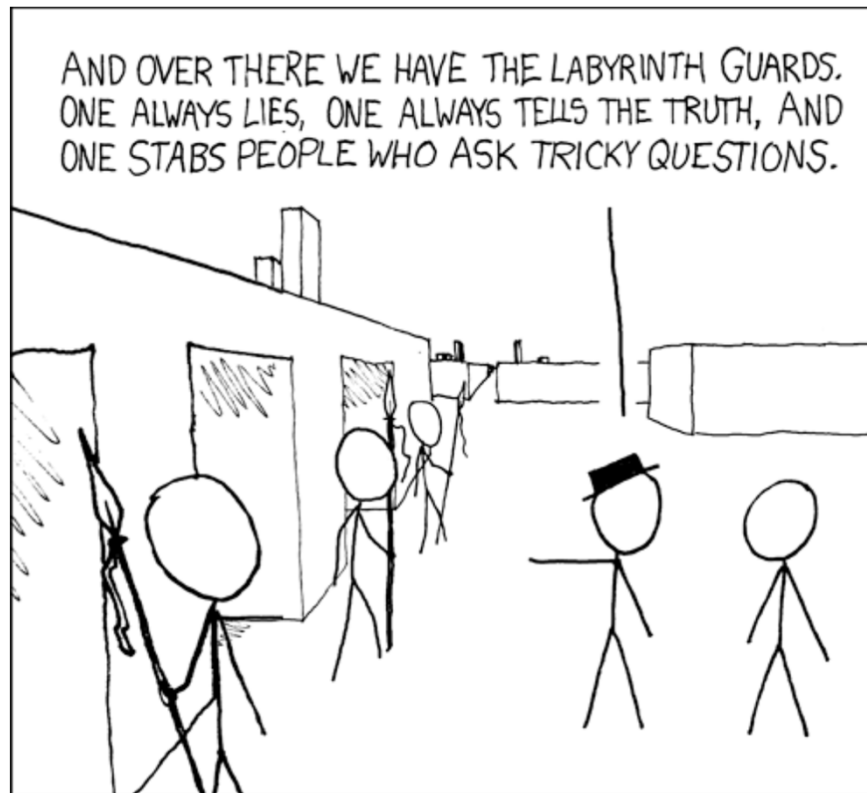


# CSE 311: Foundations of Computing

---

## Lecture 6: Predicate Logic, Logical Inference



# 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: Predicate Logic to English (Natural)

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

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

For every positive integer, there is a larger positive integer.

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

There is a positive integer that is larger than every other positive integer.

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

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

Sound more natural without introducing variable names

## Last class: English to Predicate Logic (Domain Restriction)

---

Domain of Discourse

Mammals

Predicate Definitions

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

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

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

**"All red cats like tofu"**

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

**"Some red cats don't like tofu"**

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

# Last class: 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”

## Domain of Discourse

{plum, apple}

(\*) PurpleFruit(plum)  $\wedge$  PurpleFruit(apple)

(a) PurpleFruit(plum)  $\vee$  PurpleFruit(apple)

(b)  $\neg$  PurpleFruit(plum)  $\vee$   $\neg$  PurpleFruit(apple)

(c)  $\neg$  PurpleFruit(plum)  $\wedge$   $\neg$  PurpleFruit(apple)

# Last class: De Morgan's Laws for Quantifiers

---

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

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

Intuition:  $\forall$  is like a giant AND over the domain

$\exists$  is like a giant OR over the domain

# Last class: De Morgan's Laws for Quantifiers

---

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

These are equivalent but not equal

They have different English translations, e.g.:

There is no unicorn

$$\neg \exists x \text{ Unicorn}(x)$$

Every animal is not a unicorn

$$\forall x \neg \text{ Unicorn}(x)$$

## Last class: 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 integer at least as large as every other integer”

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

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

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

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

“For every integer, there is a larger integer”



# De Morgan's Laws for Quantifiers

---

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

**“No even prime is greater than 2”**

$$\begin{aligned} & \neg \exists x (\text{Even}(x) \wedge \text{Prime}(x) \wedge \text{Greater}(x, 2)) \\ & \equiv \forall x \neg (\text{Even}(x) \wedge \text{Prime}(x) \wedge \text{Greater}(x, 2)) \\ & \equiv \forall x (\neg (\text{Even}(x) \wedge \text{Prime}(x)) \vee \neg \text{Greater}(x, 2)) \\ & \equiv \forall x ((\text{Even}(x) \wedge \text{Prime}(x)) \rightarrow \neg \text{Greater}(x, 2)) \\ & \equiv \forall x ((\text{Even}(x) \wedge \text{Prime}(x)) \rightarrow \text{LessEq}(x, 2)) \end{aligned}$$

**“Every even prime is less than or equal to 2.”**

# De Morgan's Laws for Quantifiers

---

We just saw that

$$\neg \exists x (P(x) \wedge R(x)) \equiv \forall x (P(x) \rightarrow \neg R(x))$$

Can similarly show that

$$\neg \forall x (P(x) \rightarrow R(x)) \equiv \exists x (P(x) \wedge \neg R(x))$$

**De Morgan's Laws respect domain restrictions!**  
(It leaves them in place and only negates the other parts.)

# De Morgan's Laws for Quantifiers

---

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

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

Remain true when domain restrictions are used:

$$\neg \exists x (P(x) \wedge R(x)) \equiv \forall x (P(x) \rightarrow \neg R(x))$$

$$\neg \forall x (P(x) \rightarrow R(x)) \equiv \exists x (P(x) \wedge \neg R(x))$$

## Scope of Quantifiers

---

$\exists x (P(x) \wedge Q(x))$     **vs.**     $(\exists x P(x)) \wedge (\exists x Q(x))$

# 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

---

- **Quantified 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

{1, 2, 3, 4}

Predicate Definitions

GreaterEq(x, y) ::= "x ≥ y"

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

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

	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

# Quantifier Order Can Matter

Domain of Discourse

{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.”

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

	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

# Quantifier Order Can Matter

Domain of Discourse

{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.”

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

	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

The purple statement requires an entire row to be true.

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

**Important:** both include the case  $x = y$

*Different names does not imply different objects!*

# Quantification with Two Variables

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

expression	when <b>true</b>	when <b>false</b>
$\forall x \forall y P(x, y)$	Every pair is true.	At least one pair is false.
$\exists x \exists y P(x, y)$	At least one pair is true.	All pairs are false.
$\forall x \exists y P(x, y)$	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

---

- 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

# New Perspective

---

Rather than comparing A and B as columns, zoom in on just the rows where A is true:

<i>p</i>	<i>q</i>	A	B
T	T	T	
T	F	T	
F	T	F	
F	F	F	

# New Perspective

---

Rather than comparing A and B as columns, zoom in on just the rows where A is true:

<i>p</i>	<i>q</i>	A	B
T	T	T	T
T	F	T	T
F	T	F	
F	F	F	

Given that A is true, we see that B is also true.

$$A \Rightarrow B$$

## New Perspective

---

Rather than comparing A and B as columns, zoom in on just the rows where A is true:

$p$	$q$	A	B
T	T	T	T
T	F	T	T
F	T	F	?
F	F	F	?

When we zoom out, what have we proven?



## New Perspective

---

Rather than comparing A and B as columns, zoom in on just the rows where B is true:

$p$	$q$	A	B	$A \rightarrow B$
T	T	T	T	T
T	F	T	T	T
F	T	F	T	T
F	F	F	F	T

When we zoom out, what have we proven?

$$(A \rightarrow B) \equiv T$$

# New Perspective

---

## Equivalences

$A \equiv B$  and  $(A \leftrightarrow B) \equiv T$  are the same

## Inference

$A \Rightarrow B$  and  $(A \rightarrow B) \equiv T$  are the same

Can do the inference by zooming in  
to the rows where  $A$  is true

# 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**
  - Express desired outcome as set of constraints
  - Automatically apply logic inference to derive solution

# Proofs

---

- **Start with given facts (hypotheses)**
- **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 **A** and **A**  $\rightarrow$  **B** are both true, then **B** must be true
- Write this rule as 
$$\frac{A ; A \rightarrow B}{\therefore B}$$
- Given:
  - If it is Friday, then you have a 311 class today.
  - It is Friday.
- Therefore, by Modus Ponens:
  - You have a 311 class today.

# My First Proof!

---

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.
- 5.

Modus Ponens  $\frac{A; A \rightarrow B}{\therefore B}$

# My First Proof!

---

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.  $q$             MP: 1, 2
5.  $r$             MP: 3, 4

Modus Ponens  $\frac{A; A \rightarrow B}{\therefore B}$

# Proofs can use equivalences too

---

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          |

Modus Ponens  $\frac{A; A \rightarrow B}{\therefore B}$



# Inference Rules

---

If **A** is true and **B** is true ....

Requirements: **A ; B**

Conclusions: **∴ C , D**

Then, **C** must  
be true

Then **D** must  
be true

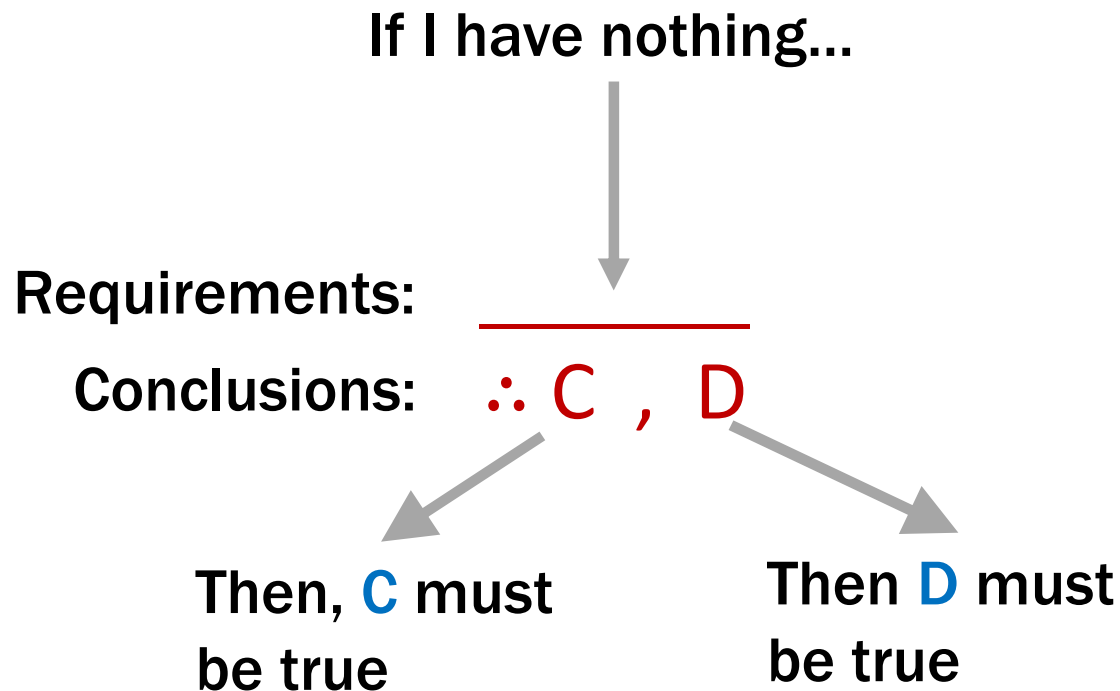
Example (Modus Ponens):

**A ; A → B**  
**∴ B**

If I have **A** and **A → B** both true,  
Then **B** must be true.

# Axioms: Special inference rules

---



Example (Excluded Middle):

\_\_\_\_\_

$\therefore A \vee \neg A$

$A \vee \neg A$  must be true.

# Simple Propositional Inference Rules

---

Two inference rules per binary connective,  
one to **eliminate** it and one to **introduce** it

$$\text{Elim } \wedge \frac{A \wedge B}{\therefore A, B}$$

$$\text{Intro } \wedge \frac{A ; B}{\therefore A \wedge B}$$

$$\text{Elim } \vee \frac{A \vee B ; \neg A}{\therefore B}$$

$$\text{Intro } \vee \frac{A}{\therefore A \vee B, B \vee A}$$

$$\text{Modus Ponens} \frac{A ; A \rightarrow B}{\therefore B}$$

$$\text{Direct Proof} \frac{A \Rightarrow B}{\therefore A \rightarrow B}$$

Not like other rules

# Proofs

---

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

How To Start:

We have givens, find the ones that go together and use them. Now, treat new things as givens, and repeat.

$$\frac{A ; A \rightarrow B}{\therefore B}$$

$$\frac{A \wedge B}{\therefore A, B}$$

$$\frac{A ; B}{\therefore A \wedge B}$$

# Proofs

---

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

Two visuals of the same proof.  
We will use the top one, but if  
the bottom one helps you  
think about it, that's great!

- |    |                            |                       |
|----|----------------------------|-----------------------|
| 1. | $p$                        | Given                 |
| 2. | $p \rightarrow q$          | Given                 |
| 3. | $q$                        | MP: 1, 2              |
| 4. | $p \wedge q$               | Intro $\wedge$ : 1, 3 |
| 5. | $p \wedge q \rightarrow r$ | Given                 |
| 6. | $r$                        | MP: 4, 5              |

$$\frac{\frac{p \ ; \ p \rightarrow q}{q} \text{MP}}{p \ ; \ q} \text{Intro } \wedge$$
$$\frac{p \wedge q \ ; \ p \wedge q \rightarrow r}{r} \text{MP}$$

# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .

1.  $p \wedge s$       Given
2.  $q \rightarrow \neg r$       Given
3.  $\neg s \vee q$       Given

First: Write down givens  
and goal

20.  $\neg r$



Idea: Work backwards!

# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .

1.  $p \wedge s$       Given

2.  $q \rightarrow \neg r$       Given

3.  $\neg s \vee q$       Given

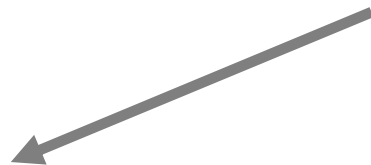
Idea: Work backwards!

We want to eventually get  $\neg r$ . How?

- We can use  $q \rightarrow \neg r$  to get there.
- The justification between 2 and 20 looks like “elim  $\rightarrow$ ” which is MP.

20.  $\neg r$

MP: 2,



# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .

1.  $p \wedge s$       Given
2.  $q \rightarrow \neg r$       Given
3.  $\neg s \vee q$       Given

Idea: Work backwards!

We want to eventually get  $\neg r$ . How?

- Now, we have a new “hole”
- We need to prove  $q$ ...
  - Notice that at this point, if we prove  $q$ , we've proven  $\neg r$ ...

19.  $q$



20.  $\neg r$

MP: 2, 19



# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .

1.  $p \wedge s$       Given

2.  $q \rightarrow \neg r$       Given

3.  $\neg s \vee q$       Given

This looks like or-elimination.

19.  $q$

?

20.  $\neg r$

MP: 2, 19


Elim  $\vee$   $\frac{A \vee B; \neg A}{\therefore B}$

# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .


1.  $p \wedge s$       Given
2.  $q \rightarrow \neg r$       Given
3.  $\neg s \vee q$       Given

18.  $\neg\neg s$              $\neg\neg s$  doesn't show up in the givens but  $s$  does and we can use equivalences
19.  $q$        $\vee$  Elim: 3, 18
20.  $\neg r$       MP: 2, 19

# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .

1.  $p \wedge s$       Given
2.  $q \rightarrow \neg r$       Given
3.  $\neg s \vee q$       Given
  
17.  $s$       
18.  $\neg\neg s$       Double Negation: 17
19.  $q$        $\vee$  Elim: 3, 18
20.  $\neg r$       MP: 2, 19

# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .

1.  $p \wedge s$       Given

2.  $q \rightarrow \neg r$       Given

3.  $\neg s \vee q$       Given

17.  $s$        $\wedge$  Elim: 1

18.  $\neg\neg s$       Double Negation: 17

19.  $q$        $\vee$  Elim: 3, 18

20.  $\neg r$       MP: 2, 19

No holes left! We just need to clean up a bit.

# Proofs

---

Prove that  $\neg r$  follows from  $p \wedge s$ ,  $q \rightarrow \neg r$ , and  $\neg s \vee q$ .

1.  $p \wedge s$       Given
2.  $q \rightarrow \neg r$       Given
3.  $\neg s \vee q$       Given
4.  $s$        $\wedge$  Elim: 1
5.  $\neg \neg s$       Double Negation: 4
6.  $q$        $\vee$  Elim: 3, 5
7.  $\neg r$       MP: 2, 6

# Important: Applications of Inference Rules

---

- You can use **equivalences** to make substitutions of **any sub-formula**.

e.g.  $(p \rightarrow r) \vee q \equiv (\neg p \vee r) \vee q$

- Inference rules only** can be applied to **whole formulas** (not correct otherwise).

e.g. 1.  $p \rightarrow r$  given

~~2.  $(p \vee q) \rightarrow r$  intro  $\vee$  from 1.~~

Does not follow! e.g.  $p=F, q=T, r=F$

## To Prove An Implication: $A \rightarrow B$

---

- We use the direct proof rule
- The “pre-requisite”  $A \Rightarrow B$  for the direct proof rule is a proof that “Given  $A$ , we can prove  $B$ .”
- **The direct proof rule:**
  - If you have such a proof then you can conclude that  $A \rightarrow B$  is true

$$\frac{A \Rightarrow B}{\therefore A \rightarrow B}$$

# To Prove An Implication: $A \rightarrow B$

---

$$\frac{A \Rightarrow B}{\therefore A \rightarrow B}$$

- We use the direct proof rule
- The “pre-requisite”  $A \Rightarrow B$  for the direct proof rule is a proof that “Given  $A$ , we can prove  $B$ .”
- **The direct proof rule:**

If you have such a proof then you can conclude that  $A \rightarrow B$  is true

Example: Prove  $p \rightarrow (p \vee q)$ .

proof subroutine

Indent proof  
subroutine  $\Rightarrow$

1.1.  $p$

Assumption

1.2.  $p \vee q$

Intro  $\vee$ : 1

1.  $p \rightarrow (p \vee q)$

Direct Proof



# Proofs using the direct proof rule

---

Show that  $p \rightarrow r$  follows from  $q$  and  $(p \wedge q) \rightarrow r$

1.  $q$  Given

2.  $(p \wedge q) \rightarrow r$  Given

This is a  
proof  
of  $p \rightarrow r$

3.1.  $p$  Assumption

3.2.  $p \wedge q$  Intro  $\wedge$ : 1, 3.1

3.3.  $r$  MP: 2, 3.2

If we know  $p$  is true...  
Then, we've shown  
 $r$  is true

3.  $p \rightarrow r$  Direct Proof

# Example

---

Prove:  $(p \wedge q) \rightarrow (p \vee q)$

There MUST be an application of the Direct Proof Rule (or an equivalence) to prove this implication.

Where do we start? We have no givens...

## Example

---

Prove:  $(p \wedge q) \rightarrow (p \vee q)$

# Example

---

Prove:  $(p \wedge q) \rightarrow (p \vee q)$

1.1.  $p \wedge q$

1.2.  $p$

1.3.  $p \vee q$

1.  $(p \wedge q) \rightarrow (p \vee q)$

Assumption

Elim  $\wedge$ : 1.1

Intro  $\vee$ : 1.2

Direct Proof

# One General Proof Strategy

---

- 1. Look at the rules for introducing connectives to see how you would build up the formula you want to prove from pieces of what is given**
- 2. Use the rules for eliminating connectives to break down the given formulas so that you get the pieces you need to do 1.**
- 3. Write the proof beginning with what you figured out for 2 followed by 1.**