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# Proof Techniques

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# Outline

## 0 Proof Techniques

- 0.1 Proof Templates
- 0.2 Mathematical Induction
- 0.3 Correctness Proofs

# What is a *formal* proof?

A formal proof (in a logical system) is a **sequence of statements** such that each statement

1. is an *axiom* (of the logical system), OR
2. follows from previous statements using the *inference rules* (of the logical system).

Among experts: Suffices to *convince a human* that a formal proof *exists*.

But: Use formal logic as guidance against faulty reasoning.  $\rightsquigarrow$  bulletproof



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## Notation:

- ▶ Statements:  $A \equiv$  "it rains",  $B \equiv$  "the street is wet".
- ▶ Negation:  $\neg A$  "Not A." "It does not rain".
- ▶ And/Or:  $A \wedge B$  "A and B";  $A \vee B$  "A or B or both."
- ▶ Implication:  $A \Rightarrow B$  "If A, then B."
- ▶ Equivalence:  $A \Leftrightarrow B$  "A holds true *if and only if* ('iff') B holds true."

$$A \Leftrightarrow B \quad :\Leftrightarrow \\ A \Rightarrow B \wedge B \Rightarrow A$$

XOR

$$A \oplus B$$

either A or B

## Clicker Question



Is the following statement true?

*"If the Earth is flat, then ships can fall over its rim."*

**A** Yes

**B** No

**C** Neither

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## Clicker Question



Is the following statement true?

*"If the Earth is flat, then ships can fall over its rim."*

**A** Yes ✓

**B** ~~No~~

**C** ~~Neither~~

$$A \Rightarrow B \quad \Leftrightarrow \quad \neg A \vee B$$

$$A \Rightarrow B$$

$$\underline{\neg A \vee B} \quad \text{true}$$

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## 0.1 Proof Templates

# Implications

To prove  $A \Rightarrow B$ , we can

$A$  = input to program is valid (a list of numbers)  
 $B$  = output of program is correct (the list is sorted)

- ▶ directly derive  $B$  from  $A$      *direct proof*     (obvious)
- ▶ prove  $(\neg B) \Rightarrow (\neg A)$      *indirect proof, proof by contraposition*
- ▶ assume  $A \wedge \neg B$  and derive a contradiction     *proof by contradiction, reductio ad absurdum*  
e.g.  $\sqrt{2}$  is irrational
- ▶ distinguish cases, i. e., separately prove  
 $(A \wedge \underline{C}) \Rightarrow B$  and  $(A \wedge \underline{\neg C}) \Rightarrow B$ .     *proof by exhaustive case distinction*  
more than 2 cases possible



## Clicker Question



Suppose we want to prove:

“If  $n^2$  is an even number, then  $n$  is also even.”

For that we show that when  $n$  is odd, also  $n^2$  is odd.

Which proof template do we follow?

- A** direct proof:  $A \Rightarrow B$
- B** indirect proof:  $(\neg B) \Rightarrow (\neg A)$
- C** proof by contradiction:  $A \wedge \neg B \Rightarrow \perp$
- D** proof by case distinction:  $(A \wedge C) \Rightarrow B$  and  $(A \wedge \neg C) \Rightarrow B$

$n$  odd  
 $\leadsto$  write  $n$   
as  $n = 2k + 1$   $k \in \mathbb{N}$

$\leadsto n^2 = (2k + 1)^2$   
 $= \underbrace{4k^2 + 4k + 1}_{\text{even}}$   
 $= 2k' + 1$   $k' \in \mathbb{N}$

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## Clicker Question



Suppose we want to prove:

"If  $n^2$  is an <sup>A</sup>even number, then  $n$  is also <sup>B</sup>even."

For that we show that when  $n$  is odd, also  $n^2$  is odd.

Which proof template do we follow? <sup>¬A</sup>  
<sup>¬B</sup> not even  $\equiv$  odd

- A** ~~direct proof:  $A \rightarrow B$~~
- B** indirect proof:  $(\neg B) \Rightarrow (\neg A)$  ✓
- C** ~~proof by contradiction:  $A \wedge \neg B \rightarrow \perp$~~
- D** ~~proof by case distinction:  $(A \wedge C) \rightarrow B$  and  $(A \wedge \neg C) \rightarrow B$~~

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## Equivalences

To prove  $A \Leftrightarrow B$ ,  $A$  iff  $B$  if and only if  
we prove both implications  $A \Rightarrow B$  and  $B \Rightarrow A$  separately.

(Often, one direction is much easier than the other.)

## Set Inclusion and Equality $\leq$

To prove that a set  $S$  contains a set  $R$ , i. e.,  $R \subseteq S$ ,  $R$  is subset of  $S$   
we prove the implication  $x \in R \Rightarrow x \in S$ .

To prove that two sets  $S$  and  $R$  are equal,  $S = R$ ,  
we prove both inclusions,  $S \subseteq R$  and  $R \subseteq S$  separately.

## **0.2 Mathematical Induction**

# Quantified Statements

## Notation

- ▶ Statements with parameters:  $\underline{A(x)} \equiv$  "x is an even number."
  - ▶ Existential quantifiers:  $\underline{\exists x : A(x)}$  "There exists some  $x$ , so that  $A(x)$ ."
  - ▶ Universal quantifiers:  $\underline{\forall x : A(x)}$  "For all  $x$  it holds that  $A(x)$ ."  $\forall x \in \mathbb{R}_{>0} : A(x)$
- Note:  $\forall x : A(x)$  is equivalent to  $\neg \exists x : \neg A(x)$

Quantifiers can be nested, e. g.,  $\varepsilon$ - $\delta$ -criterion for limits:

$$\lim_{x \rightarrow \xi} f(x) = a \quad :\Leftrightarrow \quad \underline{\forall \varepsilon > 0 \exists \delta > 0 : (|x - \xi| < \delta) \Rightarrow |f(x) - a| < \varepsilon.}$$

$\delta$  can depend on  $\varepsilon$

To prove  $\underline{\exists x : A(x)}$ , we simply list an example  $\xi$  such that  $A(\xi)$  is true.

## For-all statements

To prove  $\forall x : A(x)$ , we can

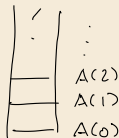
▶ derive  $A(x)$  for an “arbitrary but fixed value of  $x$ ”, or,

▶ for  $x \in \mathbb{N}_0$ , use **induction**, i. e.,

$$\mathbb{N}_0 = \{0, 1, 2, 3, \dots\}$$

▶ prove  $A(0)$ , *induction basis*, and

▶ prove  $\forall n \in \mathbb{N}_0 : A(n) \Rightarrow A(n+1)$  *inductive step*



More general variants of induction:

▶ complete/strong induction

inductive step shows  $(A(0) \wedge \dots \wedge A(n)) \Rightarrow A(n+1)$

▶ structural/transfinite induction

works on any *well-ordered* set, e. g., binary trees, graphs, Boolean formulas, strings, ...

no infinite strictly decreasing chains

## 0.3 Correctness Proofs

— continued —



## Formal verification

► verification: prove that a program computes the correct result

↪ **not** our focus in COMP 526

but some techniques are useful for *reasoning* about algorithms

Here:

1. Prove that loop or recursive call eventually terminates.
2. Prove that a *loop* computes the correct result.

## Proving termination

To prove that a recursive procedure  $\text{proc}(x_1, \dots, x_m)$  eventually terminates, we

- ▶ define a *potential*  $\Phi(x_1, \dots, x_m) \in \underline{\mathbb{N}_0}$  of the parameters  
(Note:  $\Phi(x_1, \dots, x_m) \geq 0$  by definition!)
- ▶ prove that every recursive call decreases the potential, i. e.,  
any recursive call  $\underline{\text{proc}}(y_1, \dots, y_m)$  inside  $\text{proc}(x_1, \dots, x_m)$  satisfies

$$\frac{\Phi(y_1, \dots, y_m) < \Phi(x_1, \dots, x_m)}{\hookrightarrow \leq \Phi(x_1, \dots, x_m) - 1}$$

↪  $\text{proc}(x_1, \dots, x_m)$  terminates because  
we can only strictly *decrease* the (integral!) potential a *finite* number of times from its initial value

- ▶ Can use same idea for a loop: show that potential decreases in each iteration.  
↪ see tutorials for an example.

## Loop invariants

**Goal:** Prove that a post condition holds after execution of a (terminating) loop.

---

```
1 // (A) before loop
2 while cond do
3   // (B) before body
4   body
5   // (C) after body
6 end while
7 // (D) after loop
```

---

For that, we

- ▶ find a loop invariant  $I$  (that's the tough part!)
- ▶ prove that  $I$  holds at (A)
- ▶ prove that  $I \wedge \textit{cond}$  at (B) imply  $I$  at (C)
- ▶ prove that  $I \wedge \neg \textit{cond}$  imply the desired post condition at (D)

Note:  $I$  holds before, during, and after the loop execution, hence the name.

## Loop invariant – Example

► loop condition:  $cond \equiv i < n$

► post condition (after line 13):

$$curMax = \max_{k \in [0..n-1]} A[k]$$

► loop invariant:

$$I \equiv curMax = \max_{k \in [0..i-1]} A[k] \wedge i \leq n$$

We have to prove:

(i)  $I$  holds at (A) ✓

(ii)  $I \wedge cond$  at (B)  $\Rightarrow I$  at (C)

(iii)  $I \wedge \neg cond \Rightarrow$  post condition

(ii) case distinction

(a)  $A[i] > curMax \stackrel{I}{=} \max_{k \in [0..i-1]} A[k]$

---

```
1 procedure arrayMax(A,n)
2   // input: array of n elements,  $n \geq 1$ 
3   // output: the maximum element in  $A[0..n-1]$ 
4   curMax := A[0]; i = 1
5   // (A)
6   while i < n do
7     // (B)
8     if A[i] > curMax
9       curMax := A[i]
10    i := i + 1
11    // (C)
12  end while
13  // (D)
14  return curMax
```

---

(i) here (at (A)) have  $i = 1$

$$\Rightarrow I \equiv \underline{curMax = A[0]} \wedge \underline{1 \leq n} \quad \checkmark$$
$$[0..i-1] = \{0, \dots, i-1\} = \{0\}$$

then go to line 9.  $\text{curMax} = A[i]$  after line 9

after line 10  $\text{curMax} = \max_{k \in [0 \dots i-1]} A[k] = A[i-1]$  ✓

$\text{cond} \equiv \left. \begin{array}{l} i < n \quad (\Rightarrow) \quad i \leq n-1 \\ i+1 \leq n \end{array} \right\}$  at (B)

$\leadsto$  at (C) have  $i \leq n$  ✓

(iii)  $\neg \text{cond} \equiv i \geq n$       $i \leq n$       $\leadsto i = n$

$\text{curMax} = \max_{k \in [0 \dots n-1]} A[k]$  ← post condition.     □