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# **Proof Techniques**

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## **Learning Outcomes**

### Unit 1: Proof Techniques

- **1.** Know logical *proof strategies* for proving implications, set inclusions, set equalities, and quantified statements.
- **2.** Be able to use *mathematical induction* in simple proofs.
- **3.** Know techniques for *proving termination* and *correctness* of procedures.

### **Outline**

# **1** Proof Techniques

- 1.1 Digression: Random Shuffle
- 1.2 Proof Templates
- 1.3 Mathematical Induction
- 1.4 Correctness Proofs

1.1 Digression: Random Shuffle

### Random shuffle

- ▶ **Goal:** Put an array A[0..n) of n numbers into random order. More precisely: Any ordering of the elements  $A[0], \ldots, A[n-1]$  should be equally likely.
- ► A natural approach yields the following code

```
procedure myShuffle(A[0..n))

for i := 0, ..., n-1

r := \text{randomInt}([0..n)) // A \text{ uniformly random number } r \text{ with } 0 \le r < n.

Swap A[i] and A[r] // Swap A[i] to random position.

end for
```

▶ Intuitively: All elements are moved to a random index, so the order is random . . . right?

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### Correct shuffle

▶ interestingly, a very small change corrects the issue

```
procedure shuffleKnuthFisherYates(A[0..n))
for i := 0, ..., n-1

r := \text{randomInt}(\begin{bmatrix} i \\ i \end{bmatrix}, n))
Swap A[i] and A[r]

end for
```





$$n = 5$$

- ▶ looks good ...
- ▶ ... but how can we convince ourselves that it is correct, *beyond any doubt?*

# 1.2 Proof Templates

# 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.  $\leadsto$  bulletproof



### Notation:

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

# **Implications**

To prove  $A \Rightarrow B$ , we can

- ► directly derive *B* from *A* direct proof
- ▶ prove  $(\neg B) \Rightarrow (\neg A)$  indirect proof, proof by contraposition
- ▶ assume  $A \land \neg B$  and derive a contradiction proof by contradiction, reduction ad absurdum
- ▶ distinguish cases, i. e., separately prove  $(A \land C) \Rightarrow B$  and  $(A \land \neg C) \Rightarrow B$ . proof by exhaustive case distinction

## **Equivalences**

To prove  $A \Leftrightarrow B$ , 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**

To prove that a set *S* contains a set *R*, i. e.,  $R \subseteq S$ , 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.

1.3 Mathematical Induction

# **Quantified Statements**

### **Notation**

- ► Statements with parameters:  $A(x) \equiv$ "x is an even number."
- Existential quantifiers:  $\exists x : A(x)$  "There exists some x, so that A(x)."
- ▶ Universal quantifiers:  $\forall x : A(x)$  "For all x it holds that 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:

$$\lim_{x \to \xi} f(x) = a \qquad :\Leftrightarrow \qquad \forall \varepsilon > 0 \; \exists \delta > 0 \; : \; \left( |x - \xi| < \delta \right) \Rightarrow \left| f(x) - a \right| < \varepsilon.$$

To prove  $\exists x : A(x)$ , 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.,
  - ightharpoonup 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  $(A(0) \land \cdots \land A(n)) \Rightarrow A(n+1)$
- structural/transfinite induction works on any well-ordered set, e.g., binary trees, graphs, Boolean formulas, strings, . . .

no infinite strictly decreasing chains

# 1.4 Correctness Proofs

### Formal verification

- verification: prove that a program computes the correct result
- → not our key focus in CS 566

  but same 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  $proc(x_1, ..., x_m)$  eventually terminates, we

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

$$\Phi(y_1, \dots, y_m) < \Phi(x_1, \dots, x_m)$$
 which means  $\Phi(y_1, \dots, y_m) \leq \Phi(x_1, \dots, x_m) - \mathbf{1}$ 

- $\rightarrow$  proc( $x_1, ..., x_m$ ) 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  $I \land cond$  at (B) imply I at (C)
- ▶ prove that  $I \land \neg cond$  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:  $cond \equiv j < n$
- ▶ post condition (in line 13):  $curMax = \max_{k \in [0..n-1]} A[k]$
- ▶ loop invariant:

$$I \equiv curMax = \max_{k \in [0..j-1]} A[k] \land j \le n$$

### We have to proof:

- (i) I holds at (A)
- (ii)  $I \wedge cond$  at (B)  $\Rightarrow I$  at (C)
- (iii)  $I \land \neg cond \Rightarrow post condition$

```
1 procedure arrayMax(A,n)
      // input: array of n elements, n \ge 1
      // output: the maximum element in A[0..n-1]
      curMax := A[0]; j := 1
      //(A)
      while j < n do
          //(B)
           if A[i] > curMax
              curMax := A[i]
          j := j + 1
10
          //(C)
11
      end while
12
      //(D)
13
       return curMax
```

# **Loop invariant – Example**