

**Math/CSE 1019:**  
**Discrete Mathematics for Computer Science**  
Fall 2011

**Suprakash Datta**

[datta@cse.yorku.ca](mailto:datta@cse.yorku.ca)

Office: CSEB 3043

Phone: 416-736-2100 ext 77875

Course page: <http://www.cs.yorku.ca/course/1019>

# Algorithms: topics

- Notation/pseudocode
- Design of Algorithms (for simple problems)
- Analysis of algorithms
  - Is it correct?  
**Loop invariants**
  - Is it “good”?  
**Efficiency**
  - Is there a better algorithm?  
**Lower bounds**

# What is an algorithm?

- For this course: detailed pseudocode, or a detailed set of steps
- Q: Given a problem, can we always design an algorithm to solve it?
- CSE 3101: Design and Analysis of Algorithms
  - Different design paradigms
  - Different analysis techniques
  - Intractability results

# Problem 1

- Swapping two numbers in memory

```
tmp = x;
```

```
x = y;
```

```
y = tmp;
```

- Can we do it without using tmp ?

- Why does this work?

- Does it always work?

```
x = x + y;
```

```
y = x - y;
```

```
x = x - y;
```

# Making change

- Want to make change for ANY amount using the fewest number of coins
- Simple “greedy” algorithm: keep using the largest denomination possible
- Works for our coins: 1,5,10, 25,100.
- Does it always work?
- Fails for the following coins: 1,5,7,10  
e.g:  $14 = 10 + 1 + 1 + 1 + 1$ ,  $14 = 7 + 7$
- Read proof from the text

# Problem 2

Q1. How do you find the max of n numbers (stored in array A?)

Formal specs:

**INPUT:**  $A[1..n]$  - an array of integers

**OUTPUT:** an element  $m$  of  $A$  such that  $A[j] \leq m$ ,  
 $1 \leq j \leq \text{length}(A)$

**Find-max (A)**

1.  $\text{max} \leftarrow A[1]$
2. for  $j \leftarrow 2$  to  $\text{length}(A)$
3.   do if ( $\text{max} < A[j]$ )
4.          $\text{max} \leftarrow A[j]$
5. return  $\text{max}$

**How many comparisons?**

Q2. Can you think of another algorithm? Take a minute....

**How many comparisons does it take?**

# Reasoning (formally) about algorithms

1. I/O specs: Needed for correctness proofs, performance analysis. e.g. for sorting:

**INPUT:**  $A[1..n]$  - an array of integers

**OUTPUT:** a permutation  $B$  of  $A$  such that  
 $B[1] \leq B[2] \leq \dots \leq B[n]$

2. **CORRECTNESS:** The algorithm satisfies the output specs for EVERY valid input.

3. **ANALYSIS:** Compute the running time, the space requirements, number of cache misses, disk accesses, network accesses,.....

# Correctness proofs of algorithms

**INPUT:**  $A[1..n]$  - an array of integers

**OUTPUT:** an element  $m$  of  $A$  such that  $m \leq A[j]$ ,  $1 \leq j \leq \text{length}(A)$

Find-max ( $A$ )

1.  $\text{max} \leftarrow A[1]$
2. for  $j \leftarrow 2$  to  $\text{length}(A)$
3.   do if ( $\text{max} < A[j]$ )
4.          $\text{max} \leftarrow A[j]$
5. return  $\text{max}$

Prove that for any valid Input, the output of Find-max satisfies the output condition.

**Proof 1 [by contradiction]:** Suppose the algorithm is incorrect.

Then for some input  $A$ ,

(a)  $\text{max}$  is not an element of  $A$  or (b)  $(\exists j \mid \text{max} < A[j])$ .

$\text{Max}$  is initialized to and assigned to elements of  $A$  – (a) is impossible. For (b): after the  $j^{\text{th}}$  iteration of the for-loop (lines 2 – 4),  $\text{max} \geq A[j]$ . From lines 3,4,  $\text{max}$  only increases.

Therefore, upon termination,  $\text{max} \geq A[j]$ , which contradicts (b).

# Correctness proofs of algorithms -2

**INPUT:**  $A[1..n]$  - an array of integers

**OUTPUT:** an element  $m$  of  $A$  such that  $m \leq A[j]$ ,  $1 \leq j \leq \text{length}(A)$

Find-max ( $A$ )

1.  $\text{max} \leftarrow A[1]$
2. for  $j \leftarrow 2$  to  $\text{length}(A)$
3.   do if ( $\text{max} < A[j]$ )
4.          $\text{max} \leftarrow A[j]$
5. return  $\text{max}$

Prove that for any valid Input, the output of Find-max satisfies the output condition.

**Proof 2[use loop invariants]:**

(identify invariant) **I(j):** At the beginning of iteration  $j$  of for loop,  $\text{max}$  contains the maximum of  $A[1..j-1]$ .

(Proof) True for  $j=2$ . For  $j > 2$ , assume that  $(j-1)$  holds. So at the beginning of iteration  $j-1$ ,  $\text{max} = \text{maximum of } A[1..j-2]$ .

# Loop invariant proof - contd

Case (a)  $A[j]$  is the maximum of  $A[1..j]$ . In lines 3,4,  $\text{max}$  is set to  $A[j]$ .

Case (b)  $A[j]$  is not the maximum of  $A[1..j]$ , so the maximum of  $A[1..j]$  is in  $A[1..j-1]$ . By our assumption  $\text{max}$  already has this value and by lines 3-4  $\text{max}$  is unchanged in this iteration.

**You will see more non-trivial examples in CSE 2011, 3101.**

# Loop invariant proofs

STRATEGY: We proved that the invariant holds at the beginning of iteration  $j$  for each  $j$  used by Find-max.

Upon termination,  $j = \text{length}(A)+1$ . (WHY?)

The invariant holds, and so max contains the maximum of  $A[1..n]$

- STRUCTURED PROOF TECHNIQUE
- VERY SIMILAR TO INDUCTION

Advantages:

Rather than reason about the whole algorithm, reason about SINGLE iterations of SINGLE loops.

# Problem 2

Q1. How do you find the max and min of n numbers (stored in array A?)

Q2. Can you think of a FASTER algorithm?