# Proving your Algorithms

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### **Motivation**

You need to prove your algorithms are correct:

- Power of the solution: Conjecture vs. Lemma!
- Building a proof may help find (and fix) mistakes

# **Categories of Proofs**

Disclaimer: this is not exhaustive!

- Correct / Complete / Terminate
  - Simple in several situation, but may be very complex too...
  - Based on pre/post condition of the algorithms
- Logic programming / Lambda calculus equivalence
  - Rigourous
  - Can be software-assisted (Coq)

# **Simple Correctness Proof**

Two main conditions:

- The algorithm is complete/correct: the post-condition is respected on all possible inputs satisfying the pre-condition
  - Precondition: a predicate I on the input data
  - Postcondition: a predicate O on the output data
  - Correctness: proving  $I \Rightarrow O$
- The algorithm terminates
  - For all possible input, the algorithm exits

# Proving the bubblesort algorithm

#### Algorithm

Algorithm bubblesort Input: Integer[]: A Output: Integer[]: sorted by increasing order

```
for i \leftarrow 1 to A.size - 1 do
for j \leftarrow i + 1 to A.size do
if A[i] > A[j] then
tmp \leftarrow A[i]
A[i] = A[j]
A[i] = tmp
end if
end for
end for
return A
```

## **Loop Invariants**

One possible scheme: prove an invariant is true for all iterations

- Initialization: the invariant(s) is true prior to the first iteration of the loop
- **3 Maintenance**: if the invariant is true for iteration n, it is true for iteration n+1
- Termination: when the loop terminates, the invariant is true on the entire input

For bubblesort, the invariant is "At iteration *i*, the sub-array A[1..*i*] is sorted and any element in A[i+1..A.size] is greater or equalt to any element in A[1..i]"

### Initialization

For i = 0, the invariant is respected: the sub-array A[1..0] is sorted, trivially (it contains no element).

#### Maintenance

Given the sub-array A[1..n - 1] sorted. Iteration n inserts at position n the smallest of the remaining unsorted elements of A[n..A.size], as computed by the j loop. A[1..n - 1] contains only elements smaller than A[n..A.size], and A[n] is smaller than any element in A[n + 1..A.size], then A[1..n] is sorted and the invariant is preserved.

## **Termination**

At the last iteration, A[1..A.size - 1] is sorted, and all elements in A[A.size - 1..A.size] are larger than elements in A[1..A.size - 1]. Hence A[1..A.size] is sorted.

## Proving 101

- Proving the algorithm terminates (ie, exits) is required at least for recursive algorithm
- For simple loop-based algorithms, the termination is often trivial (show the loop bounds cannot increase infinitely)
- Finding invariants implies to carefuly write the input/output of the algorithm
- ► The proof can be tedious, "simpler" proofs are acceptable

# Another completeness / correctness / termination proof

Scheme:

- All cases are covered: completeness
  - Show all possible inputs are processed by the algorithm, may be trivial
- ► For a given (arbitrary) case, it is correctly processed: correctness
  - May need to cover individually all branches/cases of the algorithm
  - For each case, show the processing generates the expected output
- in all cases, the algorithm exits: termination

# Example

#### Algorithm

BuildSearchSpace: Compute T

Input:

*pdg:* polyhedral dependence graph

Output:

 $\ensuremath{\mathcal{T}}$  : the bounded space of candidate multidimensional schedules

 $d \leftarrow 1$ while  $pdg \neq \emptyset$  do  $T_d \leftarrow createUniversePolytope$ for each dependence  $\mathcal{D}_{RS} \in pdg$  do  $\mathcal{W}_{\mathcal{D}_{R,S}} \leftarrow buildWeakLegalSchedules(\mathcal{D}_{R,S})$  $\mathcal{T}_d \leftarrow \mathcal{T}_d \cap \mathcal{W}_{\mathcal{D}_{\mathcal{P}}s}$ end for for each dependence  $\mathcal{D}_{R,S} \in pdg$  do  $S_{\mathcal{D}_{R,S}} \leftarrow buildStrongLegalSchedules(\mathcal{D}_{R,S})$ if  $\mathcal{T}_d \cap \mathcal{S}_{\mathcal{D}_{R,S}} \neq \emptyset$  then  $\mathcal{T}_d \leftarrow \mathcal{T}_d \cap \mathcal{S}_{\mathcal{D}_P s}$  $pdg \leftarrow pdg - \mathcal{D}_{RS}$ end if end for end do

### Proof (kind-a)

- ► Correctness: For each level *d*,  $\mathcal{T}_d$  is the contains only schedules such that for all unsatisfied dependences,  $\Theta_S \Theta_R \ge 0$ . Hence the semantics is preserved for all schedules. Since only satisfied dependence are removed from the set, the lexicopositivity of dependence satisfaction is respected.
- Completeness: trivial, no assumption is made on *pdg* and a dependence can always be at least weakly satisfied if the input program accepts at least one schedule
- Termination: At least one dependence can be solved per time dimension, and the dependence graph of a program is finite.

#### Exercise

Given the algorithm for the following problem: Input:

- The starting address of a matrix of integer A of size  $n \times n$
- The starting address of a matrix of integer *B* of size  $n \times n$
- ► A function *matrix*(16x16) : *getBlock*(*address* : *X*, *int* : *i*, *int* : *j*) which returns a sub-matrix (a block) of the matrix starting at address X, of size 16 × 16 whose first element is at position *i*, *j*

Ouput:

An integer c, the sum of the diagonal elements of the product of A and B

**Exercise:** Prove it computes tr(A.B)