

LECTURE 3:

Verifying correctness of algorithms

Organizational

- First homework deadline coming soon. **Next will come soon too.**
- Solutions will be posted next week.
- **HONESTY !**
- **Last week's slides:** additional example not covered in class. This week's probably as well. **Take a look at the slides !**
- College is about **your work** more than teaching.

Outline

- Analysis of algorithms
- Basic notions
- Basic steps in correctness verification
- Rules for correctness verification
- Isn't this too theoretical ?

Analysis of algorithms

When we design an algorithm there are two main aspects which should be analyzed:

- **correctness:**
 - analyze if the algorithm produces the desired output after a finite number of operations
- **efficiency:**
 - estimate the amount of resources needed to execute the algorithm on a machine

Correctness

There are two main ways to verify if an algorithm solves a given problem:

- **Experimental (by testing):** the algorithm is executed for a several instances of the input data
- **Formal (by proving):** it is proved that the algorithm produces the right answer for any input data
- **In practice:** testing, informed by formal methods.

Advantages and Disadvantages

	Experimental	Formal
Advantages	<ul style="list-style-type: none">• simple• easy to apply	<ul style="list-style-type: none">• guarantees the correctness
Disadvantages	<ul style="list-style-type: none">• doesn't guarantee the correctness	<ul style="list-style-type: none">• rather difficult• cannot be applied for complex algorithms

Outline

- Algorithm analysis
- Basic notions
- Basic steps in correctness verification
- Rules for correctness verification

Basic notions

- Preconditions and postconditions
- Algorithm state
- Assertions
- Annotation

Preconditions and postconditions

- **Preconditions** = properties satisfied by the **input data**
- **Postconditions** = properties satisfied by the result

Example: *Find the minimum, m , of a non-empty array, $x[1..n]$*

Preconditions: $n \geq 1$ (the array is non-empty)

Postconditions: $m = \min\{x[i] \mid 1 \leq i \leq n\}$
(the variable m contains the smallest value in $x[1..n]$)

Preconditions and postconditions

(Partial) Correctness verification =

prove that **if the algorithm terminates then** it leads to postconditions starting from preconditions

Total correctness verification = prove partial correctness + finiteness

Intermediate steps in correctness verification:

- analyze the **algorithm state** and
- the effect of each processing step on the algorithm state

Basic notions

- Preconditions and postconditions
- Algorithm state
- Assertions
- Annotation

Algorithm state

- **Algorithm state** = set of values corresponding to all variables used in the algorithm
- During the execution of an algorithm its state changes (since the variables change their values)
- The algorithm is correct if at the end of the algorithm its state implies the postconditions

Algorithm state

Example: Solving the equation $ax=b$, $a \neq 0$

Input data: a

Output data: x

Preconditions: $a \neq 0$

Postconditions: x satisfies $ax=b$

Algorithm:

Solve (real a, b)

 real x

$x \leftarrow b/a$

 return x

Algorithm state

Current values of a
and b

$a=a_0, b=b_0, x$ undefined

$a=a_0, b=b_0, x=b_0/a_0$



$ax=b$

Basic notions

- Preconditions and postconditions
- **State** of the algorithm
- Assertions
- Annotation

Assertions

- **Assertion** = statement (asserted to be true) about the algorithm's state
- Assertions are used to **annotate the algorithms**
- Annotation is useful both in
 - **correctness verification**and as
 - **documentation tool**





Basic notions

- Preconditions and postconditions
- Algorithm's state
- Assertions
- Annotation

Annotation

Preconditions: a, b, c are distinct real numbers

Postconditions: $m = \min(a, b, c)$

<code>min (real a,b,c)</code>	<code>//{a<>b, b<>c, c<>a}</code>	
 <code>IF a<b THEN</code>	 <code>//{a<b}</code>	
<code>IF a<c THEN m ← a</code>	<code>//{a<b, a<c, m=a}</code>	 <code>m=min(a,b,c)</code>
<code>ELSE m ← c</code>	<code>//{a<b, c<a, m=c}</code>	 <code>m=min(a,b,c)</code>
<code>ENDIF</code>		
<code>ELSE</code>	<code>//{b<a}</code>	
<code>IF b<c THEN m ← b</code>	<code>//{b<a, b<c, m=b}</code>	 <code>m=min(a,b,c)</code>
<code>ELSE m ← c</code>	<code>//{b<a, c<b, m=c}</code>	 <code>m=min(a,b,c)</code>
<code>ENDIF</code>		
<code>ENDIF</code>		
<code>RETURN m</code>		

Annotation

Preconditions: a, b, c are distinct real numbers

Postconditions: $m = \min(a, b, c)$

Another variant to find the minimum of three values

```
min (real a,b,c)           //{a<>b, b<>c, c<>a}  
  
m ← a                     // m=a  
IF m>b THEN m ← b ENDIF   // m<=a, m<=b  
IF m>c THEN m ← c ENDIF   // m<=a, m<=b, m<=c  
RETURN m  
  
↓  
m=min(a,b,c)
```

Outline

- Algorithms analysis
- Basic notions
- Basic steps in correctness verification
- Rules for correctness verification

Basic steps in correctness verification

- Identify the **preconditions** and **postconditions**
- **Annotate** the algorithm with assertions concerning its state such that
 - the preconditions are satisfied
 - the final assertion implies the postconditions
- **Prove** that by each processing step one arrives from the previous assertion to the next assertion

Some notations

Let us denote by

- P - the preconditions
- Q - the postconditions
- A - the algorithm

The triple (P, A, Q) denote a **correct algorithm** if for input data which satisfy the preconditions P the algorithm will:

- lead to postconditions Q
- stop after a finite number of processing steps

Notation:



Outline

- Algorithms analysis
- Basic notions
- Basic steps in correctness verification
- Rules for verifying correctness

Rules for verifying correctness

To prove that an algorithm is correct it can be useful to know rules corresponding to the usual statements:

- Sequential statement
- Conditional statement
- Loop statement

Sequential statement rule

Structure

A:

$\{P_0\}$

A_1

$\{P_1\}$

...

$\{P_{i-1}\}$

A_i

$\{P_i\}$

...

$\{P_{n-1}\}$

A_n

$\{P_n\}$

Rule:

If

$P \rightarrow P_0$

$\begin{matrix} A_i \\ P_{i-1} \rightarrow P_i, i=1..n \end{matrix}$

$P_n \quad Q$

Then

$\begin{matrix} A \\ P \rightarrow Q \end{matrix}$

What does this mean ?

If

- the precondition implies the initial assertion,
- each action implies the next assertion
- the final assertion implies the post-condition

then the sequence is correct

Sequential statement rule

Problem: Let x and y be two variables having the values a and b , respectively. Swap the values of the two variables.

$P: \{x=a, y=b\}$

$Q: \{x=b, y=a\}$

Variant 1:

$aux:=x$

$x:=y$

$y:=aux$

Variant 2

$x:=x+y$

$y:=x-y$

$x:=x-y$

Sequential statement rule

Problem: Let x and y be two variables having the values a and b , respectively. Swap the values of the two variables.

$P: \{x=a, y=b\}$

$Q: \{x=b, y=a\}$

Variant 1:

$\{x=a, y=b, \text{aux undefined}\}$

$\text{aux} := x$

$\{x=a, y=b, \text{aux}=a\}$

$x := y$

$\{x=b, y=b, \text{aux}=a\}$

$y := \text{aux}$

$\{x=b, y=a, \text{aux}=a\} \quad Q$

Variant 2 (a and b are numbers):

$\{x=a, y=b\}$

$x := x + y$

$\{x=a+b, y=b\}$

$y := x - y$

$\{x=a+b, y=a\}$

$x := x - y$

$\{x=b, y=a\} \quad Q$

Sequential statement rule

What about this variant ?

$x := y$

$y := x$

Sequential statement rule

What about this variant ?

$\{x=a, y=b\}$
 $x:=y$
 $\{x=b, y=b\}$
 $y:=x$
 $\{x=b, y=b\}$ ~~Q~~

The code doesn't meet the specification !

Conditional statement rule

Structure

A:

$\{P_0\}$
IF c
THEN
 A_1
 $\{c, P_0\}$
 $\{P_1\}$
ELSE
 A_2
 $\{\text{NOT } c, P_0\}$
 $\{P_2\}$

Rule:

If

- c is well defined
- $c \text{ AND } P_0 \xrightarrow{A_1} P_1$
- $P_1 \rightarrow Q$
- $\text{NOT } c \text{ AND } P_0 \xrightarrow{A_2} P_2$
- $P_2 \rightarrow Q$

then A

$P \rightarrow Q$

What does it mean ?

The condition c can be evaluated

Both branches lead to the postconditions

Conditional statement rule

Problem: compute the minimum of two distinct values

Preconditions: $a \neq b$

Postconditions: $m = \min\{a, b\}$

$\{a \neq b\}$

IF $a < b$

THEN

$\{a < b\}$

$m := a$

$\{a < b, m = a\}$

ELSE

$\{b < a\}$

$m := b$

$\{b < a, m = b\}$

Since

$\{a < b, m = a\}$ implies $m = \min\{a, b\}$

and

$\{b < a, m = b\}$ implies $m = \min\{a, b\}$

the algorithm meets the specification

Loop statement rule

Verifying the correctness of sequential and conditional statements is easy...

Verifying loops is **not easy** ...

Informally speaking, a loop is correct when:

- **If it finishes** it leads to postconditions
- It finishes after a finite number of steps

If only the first property is satisfied then the loop is **partially correct**

Partial correctness can be proved by using mathematical induction or by using **loop invariants**

Full correctness needs that the algorithm **terminates**

Loop invariants

Let us consider the WHILE loop:

Definition:

```
P {I}  
WHILE c DO  
    {c,I}  
    A  
    {I}  
ENDWHILE  
{NOT c, I} Q
```

- A **loop invariant** is an **assertion** that
- 1 is true at the beginning of the loop
 - 2 As long as c is true **it remains true after each execution** of the loop body
 - 3 When c is false it **implies the postconditions**

If we can find a loop invariant then that loop is partially correct

Loop invariants

Preconditions:

$x[1..n]$ non-empty array ($n \geq 1$)

Postconditions:

$m = \min\{x[i] \mid 1 \leq i \leq n\}$

```
m ← x[1]
FOR i ← 2, n DO
  IF x[i] < m THEN m ← x[i]
ENDFOR
```



```
m ← x[1]
i ← 2
WHILE i ≤ n DO
  IF x[i] < m THEN m ← x[i]
ENDIF
  i ← i + 1
ENDWHILE
```

Loop invariants

Preconditions:

$x[1..n]$ non-empty array ($n \geq 1$)

Postconditions:

$m = \min\{x[i] \mid 1 \leq i \leq n\}$

```
m ← x[1]
i ← 2
WHILE i ≤ n DO
  IF x[i] < m THEN m ← x[i]
ENDIF
  i ← i+1
ENDWHILE
```



```
i ← 1
m ← x[i]
WHILE i < n DO
  i ← i+1
  IF x[i] < m THEN m ← x[i]
ENDIF
ENDWHILE
```

Loop invariants

P: $n \geq 1$

Q: $m = \min\{x[i]; i=1..n\}$

```
m ← x[1]
i ← 2
  {m=min{x[j]; j=1..i-1}}
WHILE i ≤ n DO {i ≤ n}
  IF x[i] < m THEN m ← x[i]
  {m=min{x[j]; j=1..i}}
ENDIF
i ← i+1
  {m=min{x[j]; j=1..i-1}}
ENDWHILE
```

Loop invariant:

$m = \min\{x[j]; j=1..i-1\}$

Why ? Because ...

- when $i=2$ and $m=x[1]$ it holds
- while $i \leq n$ after the execution of the loop body it still holds
- finally, when $i=n+1$ it implies $m = \min\{x[j]; j=1..n\}$ which is exactly the postcondition

Loop invariants

P: $n \geq 1$

Q: $m = \min\{x[i]; i=1..n\}$

```
i ← 1
m ← x[i]
  {m=min{x[j]; j=1..i}}
WHILE i<n DO {i<n}
  i ← i+1
  {m=min{x[j]; j=1..i-1}}
  IF x[i]<m THEN m ← x[i]
  {m=min{x[j]; j=1..i}}
ENDIF
ENDWHILE
```

Loop invariant:

$m = \min\{x[j]; j=1..i\}$

Why ? Because ...

- when $i=1$ and $m=x[1]$ the invariant is true
- while $i<n$ after the execution of the loop body it still remains true
- finally, when $i=n$ it implies $m = \min\{x[j]; j=1..n\}$ which is exactly the postcondition

Loop invariants

Problem: Let $x[1..n]$ be an array which contains x_0 . Find the smallest index i for which $x[i]=x_0$

P: $n \geq 1$ and there exists $1 \leq k \leq n$ such that $x[k]=x_0$

Q: $x[i]=x_0$ and $x[j] \neq x_0$ for $j=1..i-1$

```
i ← 1  
WHILE x[i] ≠ x0 DO  
  i ← i+1  
ENDWHILE
```

Loop invariants

Problem: Let $x[1..n]$ be an array which contains x_0 . Find the smallest index i for which $x[i]=x_0$

P: $n \geq 1$ and there exists $1 \leq k \leq n$ such that $x[k]=x_0$

Q: $x[i]=x_0$ and $x[j] \neq x_0$ for $j=1..i-1$

Loop invariant:

$x[j] \neq x_0$ for $j=1..i-1$

Why ? Because ...

- for $i=1$ the range $j=1..0$ is empty thus the assertion is satisfied
- Let us suppose that $x[i] \neq x_0$ and the invariant is true

Then $x[j] \neq x_0$ for $j=1..i$

- After $i:=i+1$ we obtain again $x[j] \neq x_0$ for $j=1..i-1$
- Finally, when $x[i]=x_0$ we obtain Q

```
i ← 1
  {x[j] ≠ x0 for j=1..0}
WHILE x[i] ≠ x0 DO
  {x[i] ≠ x0, x[j] ≠ x0 for j=1..i-1}
  i ← i+1
  {x[j] ≠ x0 for j=1..i-1}
ENDWHILE
```

Loop invariants

Loop invariants are useful not only for correctness proving but also for **loop design**

Ideally would be to

- find first the loop invariant
- then design the algorithm

Problem: compute the sum of the first n natural values

Precondition: $n \geq 1$

Postcondition: $S = 1 + 2 + \dots + n$

What is the property S should satisfy after the execution of the n -th loop ?

Invariant: $S = 1 + 2 + \dots + i$

Idea for loop design:

- first prepare the term
- then add the term to the sum

Loop invariants

Algorithm:

$i \leftarrow 1$

$S \leftarrow 1$

$\{S=1+2+\dots+i\}$

WHILE $i < n$ DO

$\{S=1+2+\dots+i\}$

$i \leftarrow i+1$

$\{S=1+2+\dots+i-1\}$

$S \leftarrow S+i$

$\{S=1+2+\dots+i\}$

ENDWHILE

$\{i=n, S=1+2+\dots+i\} \quad S=1+\dots+n$

Algorithm:

$S \leftarrow 0$

$i \leftarrow 1$

$\{S=1+2+\dots+i-1\}$

WHILE $i \leq n$ DO

$\{S=1+2+\dots+i-1\}$

$S \leftarrow S+i$

$\{S=1+2+\dots+i\}$

$i \leftarrow i+1$

$\{S=1+2+\dots+i-1\}$

ENDWHILE

$\{i=n+1, S=1+2+\dots+i-1\} \quad S=1+\dots+n$

Isn't this too theoretical ?

- Seems too complicated to apply in practice.
 - There is no algorithm to decide whether a given computer program will halt. Hard to find appropriate pre/post conditions.
 - **Still useful.**
 - **Scenario:** function *f* expects to be called with a natural number *n* as an argument. instead it receives an arbitrary integer.
-
- repeat {... *n*=*n*-1} until (*n* == 0) infinite loop !
-
- Python: assertions.

```
def KelvinToFahrenheit(Temperature):  
    assert (Temperature >= 0), "Colder than absolute  
zero!"  
  
    return ((Temperature-273)*1.8)+32
```

Isn't this too theoretical ? (II)

- ```
print KelvinToFahrenheit(273)
print int(KelvinToFahrenheit(505.78))
print KelvinToFahrenheit(-5)
```

32.0

451

Traceback (most recent call last):

File "test.py", line 9, in <module>

print KelvinToFahrenheit(-5)

File "test.py", line 4, in KelvinToFahrenheit

assert (Temperature >= 0),"Colder than absolute zero!"

**AssertionError: Colder than absolute zero!**

# Isn't this too theoretical ? (III)

- Apply correctness-checking **locally**
- **Commenting always a good idea !**
- “Practical” version of testing: **unit testing**. Structured way to make assertions
- **Test (on some examples) that function gives desired result.**
- Python: **pyunit**. Most other programming languages (JUnit, cppunit, ...)
- (pre)conditions often “hidden”: when we write  $x[i]$  **we implicitly assume that  $i$  is less than the largest index of an element of array  $x$ .**
- while ( $i < n$ ):  
     $x[i]$ ....  
     $i++$
- while ( $i \leq n$ ):  
     $x[i]$ ....  
     $i++$
- **they differ by loop invariants !**

# Isn't this too theoretical ? (IV)

- Requires thinking about pre/post conditions.
- Sometimes preconditions derived from correctness constraints.

$\{a < b\}$

$X = a * c$

$Y = a * c$

$\{X < Y\}$  requires  $c > 0$  !

- Not a method to apply mechanically. **Think !**
- Test-driven design: **write functions/classes after you've written unit tests for them.**
- **Good idea:** you often modify code. Unit tests make sure that the function remains correct.

# Summary

Proving the correctness of an algorithm means:

- To prove that it leads from the preconditions to postconditions (partial correctness)
- To prove that it is finite

A **loop invariant** is a property which

- Is true before the loop
- Remains true by the execution of the loop body
- At the end of the loop it implies the postconditions

# Work for you (informal, not assigned)

- Take a look at the extra example below.
- As you learn python
  - read documentation on assert
  - write programs using assert
- Read more on unit testing, documentation on pyunit
- Try to unit test a simple program using pyunit

# Example: successor problem (last slides of Lecture 2)

Reminder: find the successor of an element in the strictly increasing sequence of natural values containing  $n$  distinct digits

```
Successor(integer x[1..n])
integer i, k
i ← Identify(x[1..n])
IF i=1
THEN write "There is no
successor !"
ELSE
 k ← Minimum(x[i-1..n])
 x[i-1] ↔ x[k]
 x[i..n] ← Reverse(x[i..n])
 write x[1..n]
ENDIF
```

Subalgorithms to be verified:

Identify (x[1..n])

P:  $n > 1$ , there exists  $i$  such that  $x[i-1] < x[i]$

Q:  $x[i-1] < x[i]$  and  $x[j-1] > x[j]$ ,  $j = i+1..n$

Minimum (x[i-1..n])

P:  $x[i-1] < x[i]$

Q:  $x[k] \leq x[j]$ ,  $j = 1..n$ ,  $x[k] > x[i-1]$

Reverse(x[i..n])

P:  $x[j] = x_0[j]$ ,  $j = 1..n$

Q:  $x[j] = x_0[n+i-j]$ ,  $j = 1..n$

# Example: successor problem

Identify the rightmost element,  $x[i]$ , which is larger than its left neighbour ( $x[i-1]$ )

**Identify**(integer  $x[1..n]$ )

Integer  $i$

$i \leftarrow n$

WHILE  $(i > 1)$  and  $(x[i] < x[i-1])$

do

$i \leftarrow i - 1$

ENDWHILE

RETURN  $i$

**P:**  $n > 1$ , there exists  $i$  such that  $x[i-1] < x[i]$

**Q:**  $x[i-1] < x[i]$  and  $x[j-1] > x[j]$ ,  $j = i+1..n$

**Loop invariant:**

$x[j-1] > x[j]$ ,  $j = i+1..n$



# Example: successor problem

Find the index of the smallest value in the subarray  $x[i..n]$  which is larger than  $x[i-1]$

**Minimum**(integer  $x[i..n]$ )

Integer  $j$

$k \leftarrow i$

$j \leftarrow i+1$

WHILE  $j \leq n$  do

  IF  $x[j] < x[k]$  and  $x[j] > x[i-1]$

  THEN  $k \leftarrow j$

  ENDIF

$j \leftarrow j+1$

RETURN  $k$

**P:**  $x[i-1] < x[i]$

**Q:**  $x[k] \leq x[j]$ ,  $j = i..n$ ,  $x[k] > x[i-1]$

**Loop invariant:**

$x[k] \leq x[r]$ ,  $r = i..j-1$

$x[k] > x[i-1]$

# Example: successor problem (back to Lecture 2)

Reverse the order of elements of  $x[\text{left}..\text{right}]$

**reverse** (INTEGER  $x[\text{left}..\text{right}]$ )

INTEGER  $j_1, j_2$

$j_1 \leftarrow \text{left}$

$j_2 \leftarrow \text{right}$

WHILE  $j_1 < j_2$  DO

$x[j_1] \leftrightarrow x[j_2]$

$j_1 \leftarrow j_1 + 1$

$j_2 \leftarrow j_2 - 1$

ENDWHILE

RETURN  $x[\text{left}..\text{right}]$

P:  $x[j] = x_0[j]$ ,  $j = \text{left}..\text{right}$

Q:  $x[j] = x_0[\text{left} + \text{right} - j]$ ,  $j = \text{left}..\text{right}$

**Loop invariant:**

$x[j] = x_0[\text{left} + \text{right} - j]$ ,  $j = \text{left}..j_1 - 1$

$x[j] > x_0[j]$ ,  $j = \text{left}..\text{right}$

$x[j] = x_0[\text{left} + \text{right} - j]$ ,  $j = j_2 + 1..\text{right}$