# an introduction to Deductive Program Verification

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https://msp.math.ens.fr/









# Software is hard. - Don Knuth

why?

- wrong interpretation of specifications
- coding in a hurry
- incompatible changes
- software = complex artifact
- etc.

## a famous example: binary search

given a sorted array of integer, e.g.

decide whether a given integer belongs to it

## a famous example: binary search

first publication in 1946 first publication without bug in 1962



Jon Bentley

Jon Bentley. Programming Pearls. 1986.

Writing correct programs

the challenge of binary search

and yet...

in 2006, a bug was found in Java standard library's binary search

Joshua Bloch, Google Research Blog "Nearly All Binary Searches and Mergesorts are Broken"

it had been there for 9 years

# the bug

```
...
int mid = (low + high) / 2;
int midVal = a[mid];
...
```

may exceed the capacity of type int then provokes an access out of array bounds

a possible fix

int mid = low + (high - low) / 2;

better programming languages

• better syntax

(e.g. avoid considering DO 17 I = 1. 10 as an assignment)

- more typing (e.g. avoid confusion between meters and yards)
- more warnings from the compiler (e.g. do not forget some cases)
- etc.

systematic and rigorous test is another, complementary answer

but test is

- costly
- sometimes difficult to perform
- and incomplete (except in some rare cases)

## formal methods

# formal methods propose a mathematical approach to software correctness

# what is a program?

there are several aspects

- what we compute
- how we compute it
- why it is correct to compute it this way

# what is a program?

the code is only one aspect ("how") and nothing else

"what" and "why" are not part of the code

there are informal requirements, comments, web pages, drawings, research articles, etc.

#### an example

• how: 2 lines of C

a[52514],b,c=52514,d,e,f=1e4,g,h;main(){for(;b=c==14;h=printf("%04d", e+d/f))for(e=d%=f;g=--b\*2;d/=g)d=d\*b+f\*(h?a[b]:f/5),a[b]=d%--g;}

#### an example

• how: 2 lines of C

a[52514],b,c=52514,d,e,f=1e4,g,h;main(){for(;b=c==14;h=printf("%04d", e+d/f))for(e=d%=f;g=--b\*2;d/=g)d=d\*b+f\*(h?a[b]:f/5),a[b]=d%--g;}

• what: 15,000 decimals of  $\pi$ 

• why: lot of maths, including

$$\pi = \sum_{i=0}^{\infty} \frac{(i!)^2 2^{i+1}}{(2i+1)!}$$

formal methods propose a rigorous approach to programming, where we manipulate

- a specification written in some mathematical language
- a proof that the program satisfies this specification

## specification

what do we intend to prove?

- safety: the program does not crash
  - no illegal access to memory
  - no illegal operation, such as division by zero
  - termination
- functional correctness
  - the program does what it is supposed to do

model checking, abstract interpretation, etc.

this lecture: deductive verification



#### this is not new



#### A. M. Turing. Checking a large routine. 1949.



## this is not new



Tony Hoare.

# An Axiomatic Basis for Computer Programming. 1969.





```
u \leftarrow 1<br/>for r = 0 to n - 1 do<br/>v \leftarrow u<br/>for s = 1 to r do<br/>u \leftarrow u + v
```



precondition  $\{n \ge 0\}$   $u \leftarrow 1$ for r = 0 to n - 1 do  $v \leftarrow u$ for s = 1 to r do  $u \leftarrow u + v$ postcondition  $\{u = n!\}$ 



precondition  $\{n \ge 0\}$   $u \leftarrow 1$ for r = 0 to n - 1 do invariant  $\{u = r!\}$   $v \leftarrow u$ for s = 1 to r do invariant  $\{u = s \times r!\}$   $u \leftarrow u + v$ postcondition  $\{u = n!\}$ 

## verification condition

```
forall n:int. n >= 0 ->
  (0 > n - 1 -> 1 = n!) / 
  (0 \le n - 1 \rightarrow)
    1 = 0! / 
    (forall u:int.
       (forall r:int. 0 <= r /\ r <= n - 1 -> u = r! ->
         (1 > r -> u = (r + 1)!) / (
         (1 <= r ->
           u = 1 * r! / 
           (forall u1:int.
             (forall s:int. 1 <= s / s <= r -> u1 = s * r! ->
               (forall u2:int.
                   u2 = u1 + u \rightarrow u2 = (s + 1) * r!)) / (
             (u1 = (r + 1) * r! \rightarrow u1 = (r + 1)!))) / (
       (u = ((n - 1) + 1)! \rightarrow u = n!)))
```

what do we do with this mathematical statement?

we could perform a manual proof (as Turing and Hoare did) but it is long, tedious, and error-prone

so we turn to tools that mechanize mathematical reasoning

#### automated theorem proving



## no hope

it is not possible to implement such a program (Turing/Church, 1936, from Gödel)

full employment theorem for mathematicians



Kurt Gödel

## automated theorem proving



examples: Z3, CVC4, Alt-Ergo, Vampire, SPASS, etc.

### interactive theorem proving

if we only intend to check a proof, we can do it



examples: Coq, Isabelle, PVS, HOL Light, etc.

#### examples



Georges Gonthier, using Coq

- the four color theorem
- Feit-Thompson theorem

#### Thomas Hales, using HOL Light

• Kepler conjecture



#### let's verify a program

# Turing's routine



$$u \leftarrow 1$$
  
for  $r = 0$  to  $n - 1$  do  
 $v \leftarrow u$   
for  $s = 1$  to  $r$  do  
 $u \leftarrow u + v$ 

#### termination

in programming, we have

• loops

the program execution may return to a previous point

#### recursion

a function can be defined with self-references

 $x \leftarrow a \text{ positive integer}$ while  $x \neq 1$  do if x is even then  $x \leftarrow x/2$ else  $x \leftarrow 3x + 1$ 

# a recursive function

$$f(n) = \begin{cases} n-10 & \text{if } n > 100\\ f(f(n+11)) & \text{otherwise} \end{cases}$$

## a recursive function

$$f(n) = \left\{ egin{array}{cc} n-10 & ext{if } n>100 \ f(f(n+11)) & ext{otherwise} \end{array} 
ight.$$

#### it's called McCarthy's 91 function
# it's up to you

you can prove either

#### partial correctness

if the precondition holds and if the program terminates then its postcondition holds

or

#### total correctness

if the precondition holds then the program terminates and its postcondition holds partial correctness is a rather weak property, since non-termination can turn your whole proof into something meaningless

#### how to prove termination

bad news: we cannot check automatically whether a program terminates or not

we have to provide hints, such as an upper bound on the number of steps before termination



#### let's prove that McCarthy's 91 function terminates

$$f(n) = \begin{cases} n-10 & \text{if } n > 100\\ f(f(n+11)) & \text{otherwise} \end{cases}$$

#### I do not think it means what you think it means



# binary search

> v

. . .

↑

lo

 $\uparrow$ 

hi

$$\begin{array}{l} lo \leftarrow 0 \\ hi \leftarrow len(a) - 1 \\ \texttt{while } lo \leq hi \ \texttt{do} \\ m \leftarrow lo + (hi - lo)/2 \\ \texttt{if } a[m] < v \\ lo \leftarrow m + 1 \\ \texttt{else } \texttt{if } a[m] > v \\ hi \leftarrow m - 1 \\ \texttt{else} \\ \texttt{return } m \\ \texttt{return } -1 \end{array}$$

#### a possible contract

def binary\_search(a, v): requires ... the array is sorted ... ensures  $0 \le result < len(a) \land a[result] = v$  $\lor result = -1 \land \forall i. \ 0 \le i < len(a) \Rightarrow a[i] \ne v$ 

this is perfectly fine

but if we write instead

def binary\_search(a, v): requires ... the array is sorted ... ensures  $(0 \le result < len(a) \Rightarrow a[result] = v)$  $\land (result = -1 \Rightarrow \forall i. 0 \le i < len(a) \Rightarrow a[i] \ne v)$ 

the program can now return -2 and yet be proved correct



before you do any proof, get the specification right then have the reader agree with you on the spec otherwise, the whole proof is a waste of time

#### ghost code

### ghost code

data and code added to the program to make the proof simpler

we search the smallest Fibonacci number equal to or greater than n

$$a, b \leftarrow 0, 1$$
  
while  $a < n$  do  
 $a, b \leftarrow b, a + b$   
return  $a$ 

#### example

to prove it correct we may want to introduce a loop invariant as follows

```
a, b \leftarrow 0, 1
while a < n do
invariant \exists i. i \ge 0 \land a = F_i \land b = F_{i+1}
a, b \leftarrow b, a + b
return a
```

but proving the existence of i is difficult for theorem provers

#### a better way

instead, we can keep track of the value of i with a ghost variable

```
\begin{array}{l} a,b \leftarrow 0,1\\ i \leftarrow 0\\ \text{while } a < n \text{ do}\\ \text{invariant } i \geq 0 \land a = F_i \land b = F_{i+1}\\ a,b \leftarrow b,a+b\\ i \leftarrow i+1\\ \text{return } a \end{array}
```

instead of having the theorem prover guessing the right value, we provide it

# rules of the game

- ghost code may read regular data but can't modify it
- ghost code cannot modify the control flow of regular code
- regular code does not see ghost data



consequence: ghost code can be removed without observable modification

### removing ghost code

 $a, b \leftarrow 0, 1$   $i \leftarrow 0$ while a < n do invariant  $i \ge 0 \land a = F_i \land b = F_{i+1}$   $a, b \leftarrow b, a + b$   $i \leftarrow i + 1$ return a

### removing ghost code

```
\begin{array}{l} a,b \leftarrow 0,1\\ \texttt{ghost } i \leftarrow 0\\ \texttt{while } a < n \ \texttt{do}\\ \texttt{invariant } i \geq 0 \land a = F_i \land b = F_{i+1}\\ a,b \leftarrow b,a+b\\ \texttt{ghost } i \leftarrow i+1\\ \texttt{return } a \end{array}
```

### removing ghost code

 $\textit{a},\textit{b} \gets 0,1$ 

while a < n do

$$a, b \leftarrow b, a + b$$

return a

# an application of ghost code

suppose we want to prove that, for all n,

#### $n! \ge 1$

we can make a program that proves it

 $\begin{array}{l} f \leftarrow 1 \\ \texttt{for } i = 1 \texttt{ to } n \texttt{ do} \end{array}$ 

 $f \leftarrow i \times f$ 

 $f \leftarrow 1$ for i = 1 to n do invariant f = (i - 1)! $f \leftarrow i \times f$ assert f = n!

```
f \leftarrow 1
for i = 1 to n do
invariant f = (i - 1)! \land f \ge 1
f \leftarrow i \times f
assert f = n!
assert n! \ge 1
```

```
f \leftarrow 1
for i = 1 to n do
invariant f = (i - 1)! \land f \ge 1
f \leftarrow i \times f
assert f = n!
assert n! \ge 1
```

- the whole program is ghost (we do not intend to run it)
- we have performed a proof by induction (automated theorem provers won't do that by themselves)

#### conclusion

#### takeaways

- we can verify programs, once and for all
- we have tools to do this and in particular theorem provers
- a program can be a proof
- the programming language does not matter
- go see The Princess Bride if you haven't already

### if you love mathematics



### http://projecteuler.net/

#### verification of an algorithm

# Boyer-Moore's majority

given a multiset of N votes

# A A C C B B C C C B C C

determine the majority, if any

### an elegant solution

#### due to Boyer & Moore (1980)

linear time

uses only three variables

#### MJRTY—A Fast Majority Vote Algorithm<sup>1</sup>

Robert S. Boyer and J Strother Moore

Computer Sciences Department University of Texas at Austin and Computational Logic, Inc. 1717 West Sixth Street, Suite 290 Austin, Texas

#### Abstract

A new algorithm is presented for determining which, if any, of an arbitrary number of candidates has received a majority of the votes cast in an election.



 $\begin{array}{rl} \text{cand} &= & A \\ k &= & 1 \end{array}$ 



 $\begin{array}{l} \text{cand} = A \\ \text{k} = 2 \end{array}$ 



cand = Ak = 3



cand = Ak = 2



 $\begin{array}{l} \text{cand} = A \\ \text{k} &= 1 \end{array}$ 



 $\begin{array}{l} \text{cand} = A \\ \text{k} &= 0 \end{array}$ 





cand = Bk = 1


 $\begin{array}{l} \text{cand} = B \\ \text{k} = 0 \end{array}$ 



















cand = Ck = 3

then we check if C indeed has majority, with a second pass (in that case, it has: 7>13/2)