Software Testing and Reverse Engineering CS4110

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Before we begin

- Git:
 - https://github.com/TUDelft-CS4110-2018/

Slack:

- https://cs4110-2018.slack.com/
- Download:
 - AFL http://lcamtuf.coredump.cx/afl/
 - The RERS 2016 reachability problems http://www.rers-challenge.org/2016/problems/Reachability/
 ReachabilityRERS2016.zip
 - The RERS 2017 reachability training problems -http://rers-challenge.org/2017/problems/training/
 RERS17TrainingReachability.zip
- We will use them in the last part of the lecture



Why?

- Software is one of the most complex artifacts of mankind
- Errors are easily made and hard to find
- In this course, we study automated methods to help find these errors, three flavors:
 - Black-box
 - White-box
 - Grey-box
- Background:
 - Software Engineering
 - Artificial Intelligence
 - Machine Learning
 - Many Smart Tricks…



Black-box – what would you test? 2 mins https://www.socrative.com/ Room: VERWER

Testing increase i and decrease d, balance resets to 1000:





White-box – what would you test? 2 mins https://www.socrative.com/ Room: VERWER

```
int balance = 1000;
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
```



```
int balance = 1000;
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
```



```
int balance = 1000;
                              should be >=
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
```



```
int balance = 1000;
                              should be >=
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
                                             what if amount is
                                             negative?
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
```



```
int balance = 1000;
                               should be >=
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
                                              what if amount is
                                              negative?
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
                                          what if sum is too large
                                          for int?
```



```
int balance = 1000;
                               should be >=
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
                                              what if amount is
                                              negative?
   else
       printf("Insufficient funds\n");
                                           what if sum is too large
void increase(int amount)
                                           for int?
   balance = balance + amount;
```



How to do this for thousands of lines of code....

Flavours

- You are given a piece of software, does it work correctly?
- 2 subproblems:
 - What does it do?
 - Reverse engineering
 - What should it do?
 - Testing



Different settings: code and tests

```
int balance = 1000;
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
balance = 10; decrease(5);
assert(balance = 5);
increase(5);
assert(balance = 10);
```



Different settings: code and tests

```
int balance = 1000;
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
balance = 10; decrease(5);
assert(balance = 5);
increase(5);
assert(balance = 10);
```

Typical question:

Are the tests sufficient?



Different settings: only code

```
int balance = 1000;
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
```



Different settings: only code

```
int balance = 1000;
void decrease(int amount)
   if (balance <= amount)</pre>
       balance = balance - amount;
   else
       printf("Insufficient funds\n");
void increase(int amount)
   balance = balance + amount;
```

Typical question:

What are good tests?



Different settings: obfuscated code

```
if(((((input.equals(inputs[2]) && (((a305 == 9) &&
(((a14.equals("f")) \&\& cf) \&\& a94 \le 23)) \&\& (a185.equals("e"))))
&& a277 \le 199) && ((a371 == a298[0]) && (((a382 && (a287 ==
a215[0])) \&\& (a115.equals("q"))) \&\& a396))) \&\& a47 >= 37)) {
  cf = false;
  a170 = a1;
  a185 = "f";
  a100 = ((((((a94 * a94) %14999) %14901) + -15097) / 5) + -2185);
         System.out.println("X");
```



Different settings: obfuscated code

Typical question:

What does it do?



Different settings: binary executable

```
push
        ebp
        ebp, esp
mov
sub
        esp, 18h
        [ebp-8], ebx
mov
        [ebp-4], esi
mov
        ebx, [ebp-8]
mov
        esi, [ebp-4]
mov
        esp, ebp
mov
        ebp
pop
retn
```



Different settings: binary executable

```
push
        ebp
        ebp, esp
mov
sub
        esp, 18h
        [ebp-8], ebx
mov
        [ebp-4], esi
mov
        ebx, [ebp-8]
mov
        esi, [ebp-4]
mov
        esp, ebp
mov
        ebp
pop
retn
```

Typical question:

Can it be broken?



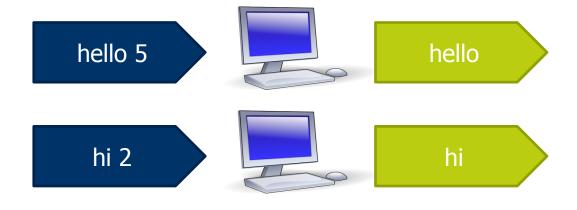
What will you learn

- What is testing and reversing research all about?
- State-of-the-art software testing and reversing tools
 - and the underlying technology
- Apply these tools to real software:
 - Own projects
 - Open source software
 - Communication protocols
 - CrackMe and/or Malware
 - Challenges



Finding tests – what would you test? 2 mins https://www.socrative.com/

Testing a response system:



. . .



```
/* Read type and payload length first */
hbtype = *p++;
n2s(p, payload);
pl = p;
unsigned char *buffer, *bp; int r;
buffer = OPENSSL malloc(1 + 2 + payload + padding);
bp = buffer;
*bp++ = TLS1 HB RESPONSE;
s2n(payload, bp);
memcpy(bp, pl, payload);
r = ssl3 write bytes(s, TLS1 RT HEARTBEAT, buffer, 3 + payload + padding);
```



```
/* Read type and payload length first */
hbtype = *p++;
                          put payload length in payload,
n2s(p, payload);
                          pl is pointer to actual payload
pl = p;
unsigned char *buffer, *bp; int r;
buffer = OPENSSL malloc(1 + 2 + payload + padding);
bp = buffer;
*bp++ = TLS1 HB RESPONSE;
s2n(payload, bp);
memcpy(bp, pl, payload);
r = ssl3 write bytes(s, TLS1 RT HEARTBEAT, buffer, 3 + payload + padding);
```



```
/* Read type and payload length first */
hbtype = *p++;
                          put payload length in payload,
n2s(p, payload);
                          pl is pointer to actual payload
pl = p;
unsigned char *buffer, *bp; int r;
buffer = OPENSSL malloc(1 + 2 + payload + padding);
bp = buffer;
                        allocate up to 65535+1+2+16 of memory
*bp++ = TLS1 HB RESPONSE;
s2n(payload, bp);
memcpy(bp, pl, payload);
r = ssl3 write bytes(s, TLS1 RT HEARTBEAT, buffer, 3 + payload + padding);
```



```
/* Read type and payload length first */
hbtype = *p++;
                          put payload length in payload,
n2s(p, payload);
                          pl is pointer to actual payload
pl = p;
unsigned char *buffer, *bp; int r;
buffer = OPENSSL malloc(1 + 2 + payload + padding);
bp = buffer;
                        allocate up to 65535+1+2+16 of memory
*bp++ = TLS1 HB RESPONSE;
                             copy memory from pl pointer to
s2n(payload, bp);
                             bp pointer of length payload
memcpy(bp, pl, payload);
r = ssl3 write bytes(s, TLS1 RT HEARTBEAT, buffer, 3 + payload + padding);
```

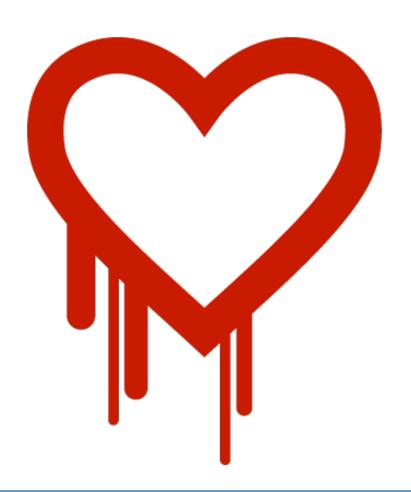


pl and payload are input and should not be trusted!

```
ayload length first */
/* Read typ
hbtype = *p++;
                          put payload length in payload,
n2s(p, payload);
                          pl is pointer to actual payload
pl = p;
unsigned char *buffer, *bp; int r;
buffer = OPENSSL malloc(1 + 2 + payload + padding);
bp = buffer;
                        allocate up to 65535+1+2+16 of memory
*bp++ = TLS1 HB RESPONSE;
                             copy memory from pl pointer to
s2n(payload, bp);
                             bp pointer of length payload
memcpy(bp, pl, payload);
r = ssl3 write bytes(s, TLS1 RT HEARTBEAT, buffer, 3 + payload + padding);
```



Heartbleed OpenSSL bug





April 7, 2014: discovered that 2/3d of all web servers in world leak passwords. Programming oversight due to insufficient testing. #heartbleed #openssl

```
@@ -330,6 +330,10 @@ status_t SampleTable::setTimeToSampleParams
...

mTimeToSampleCount = U32_AT(&header[4]);
    uint64_t allocSize = mTimeToSampleCount * 2 * sizeof(uint32_t);
    if (allocSize > SIZE_MAX) {
        return ERROR_OUT_OF_RANGE;
    }

mTimeToSample = new uint32_t[mTimeToSampleCount * 2];
    size_t size = sizeof(uint32_t) * mTimeToSampleCount * 2;
```



in C, multiplying two 32-bit ints, gives a 32-bit int

```
@@ -330,6 +330,10 @@ status_t SampleTable::set%

mTimeToSampleCount = U32_AT(&header[4]);

uint64_t allocSize = mTimeToSampleCount * 2 * sizeof(uint32_t);

if (allocSize > SIZE_MAX) {

    return ERROR_OUT_OF_RANGE;
}

mTimeToSample = new uint32_t[mTimeToSampleCount * 2];

size_t size = sizeof(uint32_t) * mTimeToSampleCount * 2;
```



in C, multiplying two 32-bit ints, gives a 32-bit int

check for security problem does not work since upper 32-bits are not checked!



Android bug, open July 2015





```
int stdcall SrvOs2FeaListSizeToNt( DWORD *a1) {
    WORD *v1; unsigned int v2; unsigned int v3; int v4; int v6;
   v1 = a1; v6 = 0;
   v2 = (unsigned int)a1 + *a1;
   v3 = (unsigned int)(a1 + 1);
   if ( (unsigned int) (a1 + 1) < v2 ) {
       while (v3 + 4 < v2) {
           v4 = *(WORD *)(v3 + 2) + *(BYTE *)(v3 + 1);
           if (v4 + v3 + 4 + 1 > v2) break;
           if (RtlSizeTAdd(v6, (v4 + 12) & 0xFFFFFFFC, &v6) < 0 ) return 0;
           v3 += v4 + 5;
           if (v3 >= v2) return v6;
           v1 = a1;
    *v1 = (WORD)(v3 - v1);
} return v6; }
```



```
int __stdcall SrvOs2FeaListSizeToNt(_DWORD *a1) {
    _WORD *v1; unsigned int v2; unsigned int v3; int v4; int v6;
    v1 = a1; v6 = 0;
    v2 = (unsigned int)a1 + *a1;
    v3 = (unsigned int) (a1 + 1);
    if ( (unsigned int) (a1 + 1) < v2 ) {
        while ( v3 + 4 < v2 ) {
            v4 = *(_WORD *) (v3 + 2) + *(_BYTE *) (v3 + 1);
            if ( v4 + v3 + 4 + 1 > v2 ) break;
            if ( RtlSizeTAdd(v6, (v4 + 12) & OxFFFFFFFC, &v6) < 0 ) return 0;
            v3 += v4 + 5;</pre>
```

puts a WORD (16 bits) into what is at address v1

```
*v1 = (_WORD) (v3 - v1);
} return v6; }
```



```
int stdcall Srv
   WORD *v1; u
   v1 = a1; v6
                          But *v1 is
   v2 = (unsign
                          SMB_FEA_LIST->SizeOfListInBytes
   v3 = (unsign
                          which is a DWORD (32 bits)
   if ( (unsign
       while (
           v4 = *(WORD *)(v3 + 2) + *(BYTE *)(v3 + 1);
           if (v4 + v3 + 4 + 1 > v2) break;
           if (RtlSizeTAdd(v6, (v4 + 12) & 0xFFFFFFFC, &v6) < 0 ) return 0;
           v3 += v4 + 5;
```

puts a WORD (16 bits) into what is at address v1

```
*v1 = (_WORD) (v3 - v1);
} return v6; }
```



```
__stdcall Srv
_WORD *v1; u
v1 = a1; v6
v2 = (unsign SMB_FEA_LIST->SizeOfListInBytes
```

So if *v1 contains a large value 0x10000 and the assignment puts 0x0FFFF (MAX WORD) into it the result is 0x1FFFF, instead of the intended 0x0FFFF

urn 0;

```
v3 += v4 + 5;
```

puts a WORD (16 bits) into what is at address v1

```
*v1 = (_WORD) (v3 - v1);
} return v6; }
```



```
int stdcall Srv
          WORD *v1; u
          v1 = a1; v6
                                  But *v1 is
          v2 = (unsign
                                  SMB_FEA_LIST->SizeOfListInBytes
             So if *v1 contains a large value 0x10000
                          When SMB_FEA_LIST->SizeOfListInBytes
                                                                                 0;
                         with incorrect value is used in later code,
                         it can be used to create a buffer overflow,
puts a WOR
                         and allows arbitrary code execution...
```

TUDelft

*v1

} return v6; }





Payment will be raised on

5/16/2017 00:47:55

Time Left

02:23:57:37

Your files will be lost on

5/20/2017 00:47:55

Time Left

Ø6:23:57:37

About bitcoin

How to buy bitcoins?

Contact Us

Ooops, your files have been encrypted!

English

What Happened to My Computer?

Your important files are encrypted.

Many of your documents, photos, videos, databases and other files are no longer accessible because they have been encrypted. Maybe you are busy looking for a way to recover your files, but do not waste your time. Nobody can recover your files without our decryption service.

Can I Recover My Files?

Sure. We guarantee that you can recover all your files safely and easily. But you have not so enough time.

You can decrypt some of your files for free. Try now by clicking < Decrypt>.

But if you want to decrypt all your files, you need to pay.

You only have 3 days to submit the payment. After that the price will be doubled.

Also, if you don't pay in 7 days, you won't be able to recover your files forever.

We will have free events for users who are so poor that they couldn't pay in 6 months.

How Do I Pay?

Payment is accepted in Bitcoin only. For more information, click <About bitcoin>.

Please check the current price of Bitcoin and buy some bitcoins. For more information, click <How to buy bitcoins>.

And send the correct amount to the address specified in this window.

After your payment, click <Check Payment>. Best time to check: 9:00am - 11:00am OLET 6 M. ... J. ... L. P... J. ...



Send \$300 worth of bitcoin to this address:

12t9YDPgwueZ9NyMgw519p7AA8isjr6SMw

Check Payment

Decrypt

It's a kind of magic...

- Given an arbitrary software program
- Without any understanding of what it is supposed to do
- (Logic-Based) Artificial Intelligence can:
 - Discover bugs
 - Create good tests
 - Reverse program logic
- and even:
 - Generate patches



have a look at: http://archive.darpa.mil/cybergrandchallenge/ and the winner:

https://forallsecure.com/blog/2016/02/09/unleashing-mayhem/



What will you do (1)

- Team up with one fellow student
- Work on labs 1 and 2:
 - 1. You will be randomly assigned to the testing or reversing assignment.
 - 2. If you did testing for Lab 1, you will do reversing for Lab 2.
 - 3. If you did reversing for Lab 1, you will do testing for Lab 2.
 - 4. Investigate code using the taught tools
 - 5. Write a report (max 4 pages) including:
 - Small (toy) examples demonstrating the use of the tools
 - What kind of input you provide and its importance
 - Experiments performed, how results are obtained
 - An analysis of the results
 - Grade a report focusing on the opposite focus area



What will you do (2)

- Work on lab 3:
 - 1. You are free to choose between reversing and testing
 - 2. Investigate an App or Webpage using one of the taught tools
 - 3. Thoroughly analyze the results in depth
 - 4. Simply running the tools is insufficient!
 - Create a video (+-10 mins), on private youtube, describing:
 - The setup (input, scripts, code) used to make everything work
 - The inputs (data and program) provided to the tool(s)
 - The obtained results, explain clearly what you demonstrate and what impact it could have
 - 6. We grade all videos



Grading

Lab 1: 20%

Lab 2: 20%

Video: 60%

- Criteria will be published on Github, in essense:
 - correctness the techniques are explained and used correctly
 - understandability easy to understand examples
 - validity the obtained comparisons/tests are sound
 - reproducibility someone should be able to follow the same steps to obtain your results
 - depth do not just apply the tools, try to obtain either:
 - measurable confidence that the code is solid
 - an investigation of the severity of a discovered bug

NO EXAM!



Program - tentative

Week	Lecture - Lecture hall Chip		
1	13 Feb	Today, Fuzzing	
2	20 Feb	Mutation testing	
3	27 Feb	Tainting and Concolic	Deadline Assign. 1
4	6 Mar	Replay testing	
5	13 Mar	State Machine Learning	
6	20 Mar	Search-based Testing	Deadline Assign. 2
7	27 Mar	Instrumenting Apps	
8	3 Apr	TBD	
9			Deadline Video

Lectures on Tuesday, 13:45 till 15:45

Contact teachers and TAs through Slack/e-mail



Collaboration

- Git:
 - https://github.com/TUDelft-CS4110-2018/
- Slack:
 - https://cs4110-2018.slack.com/
- Blackboard/Brightspace is not used during this course



Topics

Tools for automated testing

- Mutation testing
- 2. Replay testing
- 3. Test case generation

and automated reverse engineering

- 1. Fuzzing
- 2. Tainting/Concolic execution
- 3. State machine learning
- 4. App analysis



Topics

Tools for automated testing

- Mutation testing
- 2. Replay testing
- Test case generation

and automated reverse engineering

- 1. Fuzzing
- 2. Tainting/Concolic execution
- 3. State machine learning
- 4. App analysis



These tools use the same underlying techniques!

Topics

Tools for

1. Muta

2. Repla

Test

No Red-Teaming (!)
But, if interested to play CTFs
mail me at s.e.verwer@tudelft.nl
or message on Slack

and automated reverse engineering

- 1. Fuzzing
- Tainting/Concolic execution
- State machine learning
- App analysis



These tools use the same underlying techniques!

Fuzzing (Black-Box or Grey-box)



Security/penetration testing

- Normal testing investigates correct behavior for sensible inputs, and inputs on borderline conditions
- Security testing involves looking for the incorrect behavior for really silly inputs
- Try to crash the system!
 - and discover why it crashed!
- In general, this is very hard



Basic technique: random fuzzing

- Essense:
 - Test different inputs at random, until the system crashes
- What is the probability of reaching line 11 with random input?

```
1:int parse(FILE *fp)
   char cmd[256], *url, buf[5];
    fread(cmd, 1, 256, fp);
    int i, header ok = 0;
     if (cmd[0] == 'G')
      if (cmd[1] == 'E')
 6:
 7:
         if (cmd[2] == 'T')
           if (cmd[3] == '')
             header ok = 1;
10: if (!header_ok) return -1;
11:
    url = cmd + 4;
12:
    i=0;
    while (i<5 && url[i]!='\0' && url[i]!='\n') {
     buf[i] = tolower(url[i]);
14:
15:
      i++;
16:
     buf[i] = '\0';
17:
18:
     printf("Location is %s\n", buf);
     return 0; }
18:
```



Structured input

- When input has to start with e.g. 'http', testing all possible strings that start differently is a waste of time
- Fortunately, we often know:
 - Example input files or strings
 - Protocol specifications, or test implementations
- Solutions:
 - Generate random permutations from example files
 - Mutation-based fuzzing
 - Fuzz only values but keep in line with the specification
 - Protocol (generative) fuzzing



Mutation-based fuzzing example

- Google for .pdf
- 2. Crawl pages to build a test set
- Use mutation-based fuzzing tool (eg. AFL) or script:
 - a) Load pdf file
 - b) Mutate file (eg. randomly flipping bits, adding random chars)
 - c) Feed to program
 - d) Record if it crashed and what crashed it

A piece of cake, and it can find many real-world bugs!



Mutation-based fuzzing example 2

Fuzzing with 5 lines of Python code:

Given sufficient time/power this will crash your system!

Code by Charlie Miller



AFL

- AFL is a fast mutation-based fuzzer
 - http://lcamtuf.coredump.cx/afl/
- Video from last year more later
 - https://www.youtube.com/watch?v=ibjkz7GTT3I

- Also check out:
 - https://imagetragick.com/
 - https://writeups.easyctf.com/

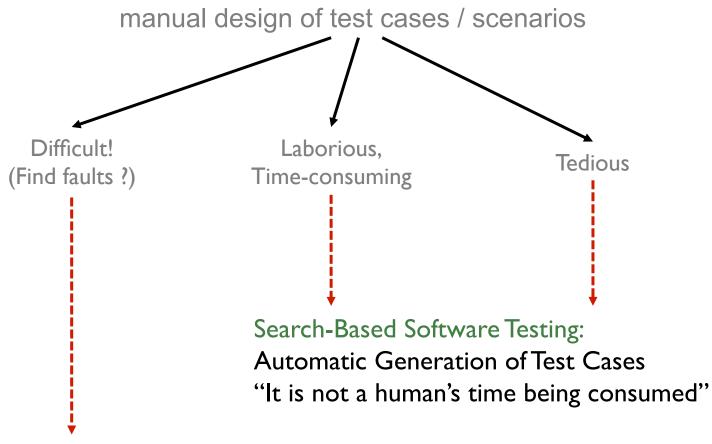




Automated Test Case Generation (White-Box)



Traditional Testing



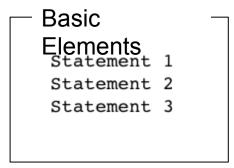


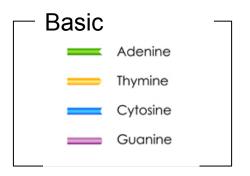
Using good fitness function to reach/expose the faults



Evolutionary Testing

```
@Test
public void test(){
   Statement 1
   Statement 2
   Statement 3
   . . .
   Assertion 1
   Assertion 2
   . . .
}
```







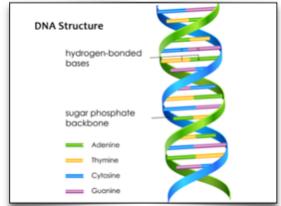
Evolutionary Testing

Recombination

@Test public void test(){ Statement 1 Statement 2 Statement 3 . . . Assertion 1 Assertion 2 . . . }

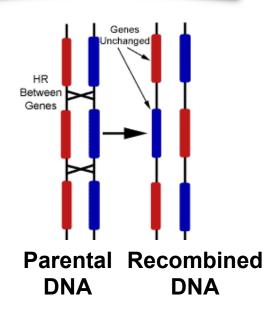
Tests

Recombination



```
@Test
public void test1(){
                                   public void test1(){
 Statement 1
                                    Statement 1
  Statement 2
                                    Statement 5
  Statement 3
                                    Statement 3
@Test
                                   @Test
public void test2(){
                                   public void test2(){
  Statement 4
                                    Statement 1
  Statement 5
                                    Statement 2
  Statement 6
                                    Statement 3
   Parental
                                    Recombined
```

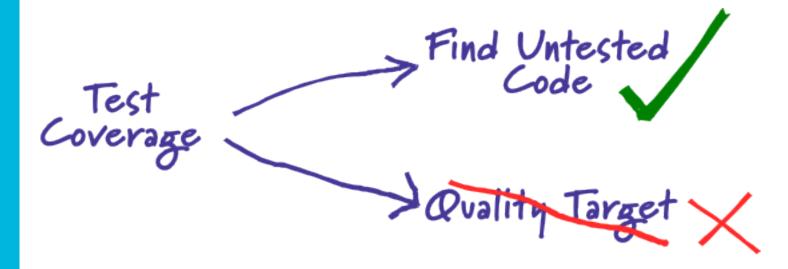
Tests





Mutation Testing (Grey-Box)





- Production code can be covered, yet the tests covering it might still miss a bug (i.e., the tests are not of sufficient quality)
- Is there another way of looking into the quality of tests?



Mutation testing by example

Original

```
if( i >= 0 ) {
                                           Test
       return "foo";
  } else {
       return "bar";
                  Code is transformed,
                                                Tests remain identical
                  mutant introduced
Mutant
                                           Test
  if( i < 0 ) {
                                     Scenario 1
       return "foo";
  } else {
                                         → Mutant alive
       return "bar";
                                     Scenario 2
                                         → Mutant killed
```

Tainting, or Instrumentation (White-Box)



Software Understanding

- Core in any reverse engineering task is understanding what a piece of software is doing
- Example:

```
int main(int ac, char **av)
{
    std::cerr << "hello world" << std::endl;
}</pre>
```

- Questions:
 - 1. How many system calls does this code make?
 - 2. How many instructions does this code execute?



compiled on my Macbook using g++

Answers

- 132 system calls
- 1906462 instructions
- Many stat64 syscalls, checking the availability of required libraries
- Obtained by creating a log whenever a syscall/instruction is executed (tracing)
- Using instrumentation:
 - Intercept every such execution, call callback code, and continue



Answers

Simple but powerful

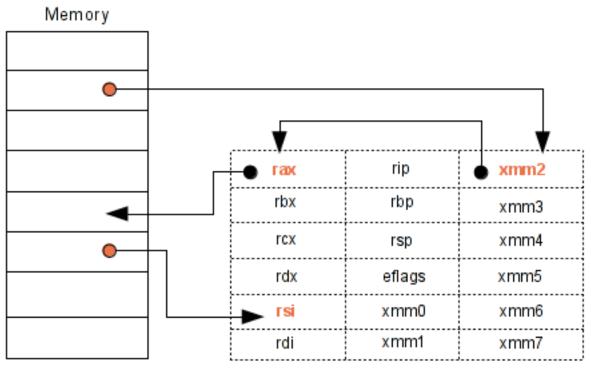
We discovered two years ago that all Mac Malware use the shell to execute and fork processes, this can be used to detect Malware

- Obtained by creating a log whenever a syscall/instruction is executed (tracing)
- Using instrumentation:
 - Intercept every such execution, call callback code, and continue



Tainting

 takes it one step further and monitors the flow of data throughout a programs execution, identifying bugs that can be influenced by input data





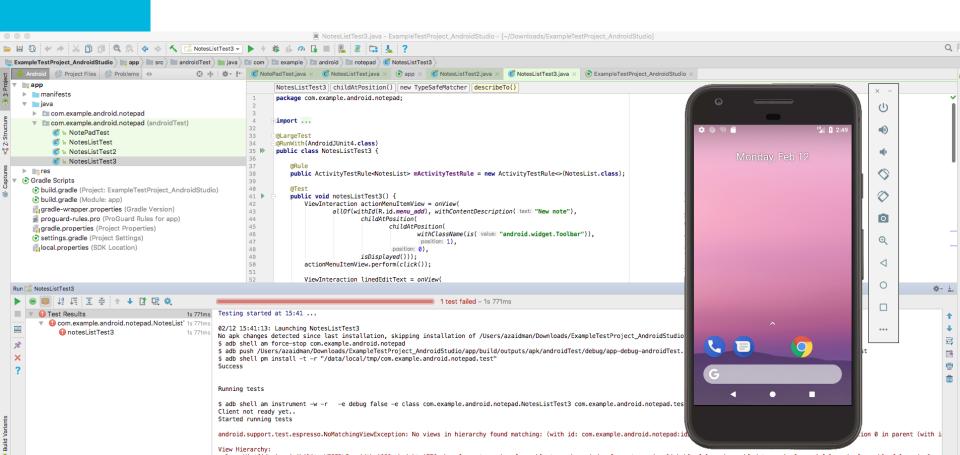
Internal CPU register

Capture/Replay testing (Black-Box)



Capture / replay testing

 Typically "functional testing" at the Graphical User Interface level



Why capture/replay?

 Originally: used for testing embedded devices, as these devices often did not have sufficient resources to test them

Nowadays:

Web: Selenium IDE

Mobile: Espresso, Appium, Robotium



How

Capture

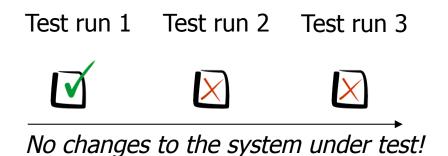
- You capture normal execution + input values by user
- You define assertions on events, output values, ...

Replay

 You replay what you captured, checking that the system behaves in the same was as when you recorded it



Flaky tests



Flaky tests: Test cases that exhibit both a passing and failing result with the same code

Flaky Tests at Google

Google has around 4.2 million tests that run on our continuous integration system. Of these, around 63 thousand have a flaky run over the course of a week. While this represents less than 2% of our tests, it still causes significant drag on our engineers.

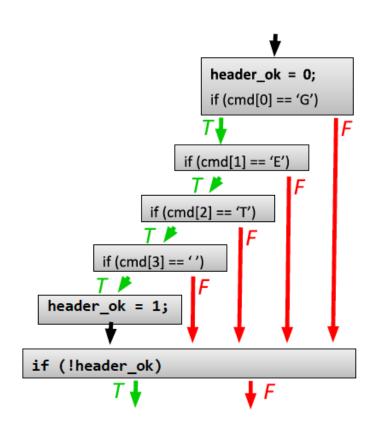


Concolic testing concrete and symbolic testing (White-Box)



Smarter fuzzing: use system code!

```
1:int parse(FILE *fp) {
 2: char cmd[256], *url, buf[5];
    fread(cmd, 1, 256, fp);
     int i, header ok = 0;
     if (cmd[0] == 'G')
       if (cmd[1] == 'E')
 6:
 7:
         if (cmd[2] == 'T')
           if (cmd[3] == '')
 8:
             header ok = 1;
 9:
     if (!header ok) return -1;
    url = cmd + 4;
11:
    i=0;
12:
13:
    while (i<5 && url[i]!='\0' && url[i]!='\n') {
       buf[i] = tolower(url[i]):
14:
15:
       i++;
16:
     buf[i] = '\0';
17:
    printf("Location is %s\n", buf);
18:
    return 0; }
```

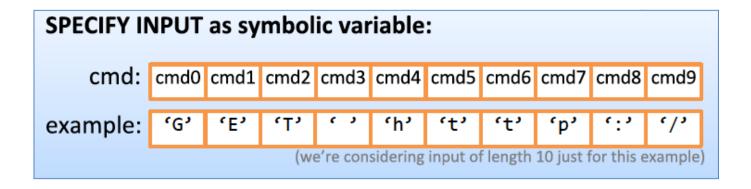




Can we automatically generate interesting input values?

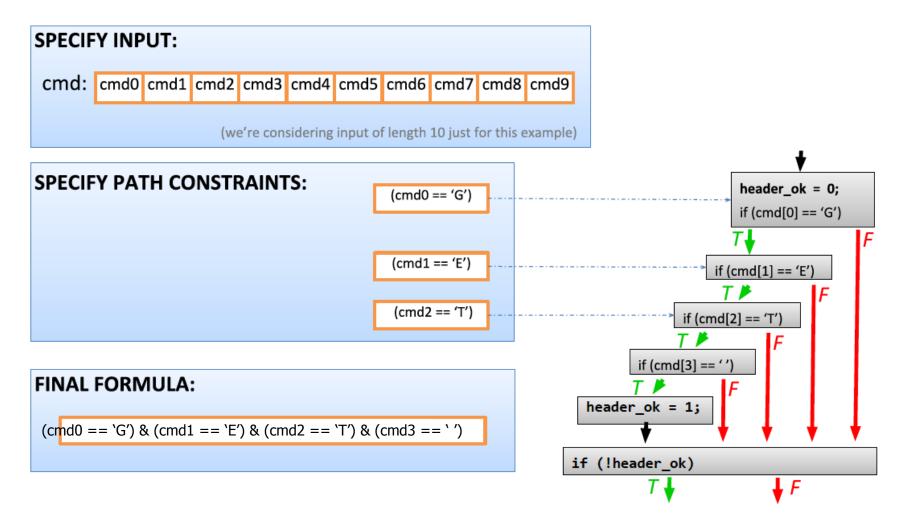
Path exploration

- Try to assignments to all values in cmd that make the program reach line 11:
 - Represent all values as symbolic variables
 - Write down a formula describing all paths through the program that reach line 11





Path exploration





Symbolic execution

- Represent all inputs as symbolic values and perform operations symbolically
 - cmd0, cmd1, ...
- Path predicate: is there a value for command such that (cmd0 == 'G') & (cmd1 == 'E') & (cmd2 == 'T') & (cmd3 == ' ') ?
- Provide all constraints to a combinatorial solver, eg. Z3
 - Answer: YES, with cmd0 = 'G', cmd1 = 'E', ..., cmd9 = x
- Only fuzz inputs that satisfy the provided answer!
- And only call the solver on tainted values!



State machine learning (Black-Box)



Learning (reverse-engineering)

- One last piece of information are all the examples that are tested while fuzzing, or collected from logs
- This form a big data set from which can be used to gain information about a system or protocol

This can help to

- analyze your own code and hunt for bugs, or
- reverse-engineer someone else's unknown protocol, e.g., a botnet, to fingerprint or to analyze



A simple state machine

```
int current state = 0;
char step(char input) {
  switch (current_state) {
    case 0:
      switch (input) {
        case 'A':
          current state = 1;
          return 'X';
        case 'B':
          current state = 2;
          return 'Y';
        case 'C':
          return 'Z';
        default:
          invalid_input();
    case 1:
      switch (input) {
        case 'A':
          current_state = 3;
          return 'Z';
        case 'B':
```

```
return 'Y';
      case 'C':
        return 'Z';
      default:
        invalid_input();
    }
  case 2:
    switch (input) {
      case 'A':
        return 'Z';
      case 'B':
        return 'Y';
      case 'C':
        current_state = 0;
        return 'Z';
      default:
        invalid input();
    }
return 0;
```

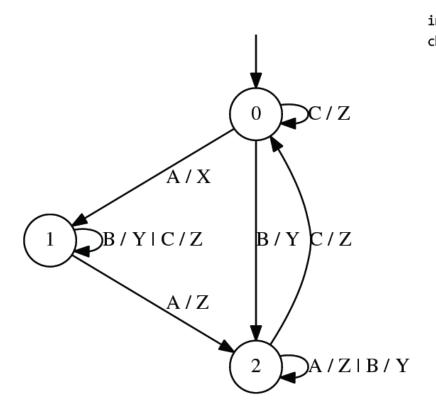


The same code – obfuscated

```
1 2314 = 0 11 != 0 20 ? 7 : 10;
                                                                  1 \quad 2307 = 0 \quad 12(1 \quad 2303);
                                                                  1 2314 = 0 11 == (struct t__ 8 *) 0UL ? 13 &
while (1) {
                                                             1 2304 : 13;
  switch (1___2314) {
                                                                   break;
    case 12:
                                                                 case 7:;
     o___28(2, o___16);
                                                                  if ((unsigned int) ((((1 2304
     1 2314 = 11 - ((o 11 != o 20) + (o 11 !=
o 20));
                                                                      - (-1 & (o __20 != (struct t____8 *) 0UL))
                                                                          * (-1 | (o 20 != (struct t 8 *) 0UL)))
     break;
                                                                      + (-0x7FFFFFFFF - 1)) + (((1 2304))
    case 15:
                                                                      - (-1 & (o 20 != (struct t 8 *) 0UL))
     1 2305 = scanf((char const */* restrict */)
(o__19), &l__2303);
                                                                          * (-1 | (o___20 != (struct t___8 *) 0UL)))
     1 2314 = 14 + !(o_11 == o_20);
                                                                      + (-0x7FFFFFFF - 1)) >> 31)) ^ (((1 2304
     break;
                                                                      - (-1 & (o__20 != (struct t__ 8 *) 0UL))
    case 2:;
                                                                          * (-1 | (o__20 != (struct t_ 8 *) 0UL)))
     1___2314 = (unsigned long) (o___20 != (struct t___8 *)
                                                                      + (-0x7FFFFFFF - 1)) >> 31)) >> 31U) {
0UL )
                                                                    1___2314 = o___20 == (struct t___8 *) 0UL ? 7 : 6;
         - (unsigned long) (o___11 == (struct t___8 *) 0UL);
                                                                   } else {
      break:
                                                                    1 2314 = 0 20 != (struct t 8 *) 0UL ? 5 : 7;
    case 13:
                                                                  }
     1 \quad 2306 = 1 \quad 2307;
                                                                   break;
     1_2314 = 12 - ((o_20 = (struct t_8 *) 0UL)
                                                                // ...
         + (o 20 == (struct t 8 *) 0UL));
      break;
    case 1:
     o 13 = ((1 2304 & ~o 13) << 1) - (1 2304 ^
o 13);
      1 2314 = 0 20 == (struct t 8 *) 0UL ? 8 : 8;
     break;
    case 3:
```



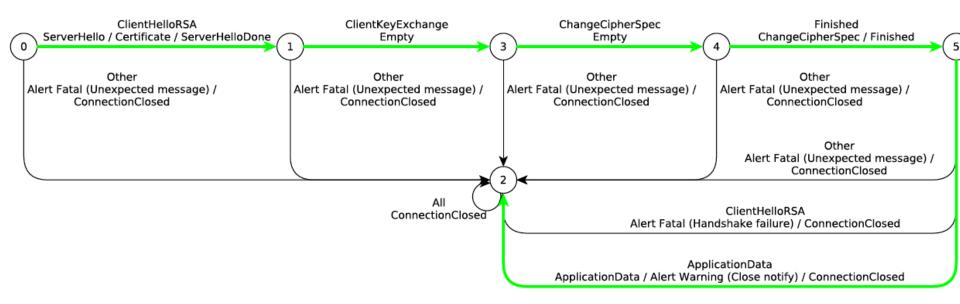
After learning



```
int current_state = 0;
                                               return 'Y';
char step(char input) {
                                             case 'C':
  switch (current_state) {
                                               return 'Z';
    case 0:
                                             default:
      switch (input) {
                                               invalid_input();
        case 'A':
          current_state = 1;
                                         case 2:
          return 'X';
                                           switch (input) {
        case 'B':
                                             case 'A':
          current_state = 2;
                                               return 'Z';
                                             case 'B':
          return 'Y';
        case 'C':
                                               return 'Y';
                                             case 'C':
          return 'Z';
        default:
                                               current_state = 0;
          invalid_input();
                                               return 'Z';
                                             default:
    case 1:
                                               invalid_input();
      switch (input) {
        case 'A':
          current_state = 3;
                                       return 0;
          return 'Z';
        case 'B':
```



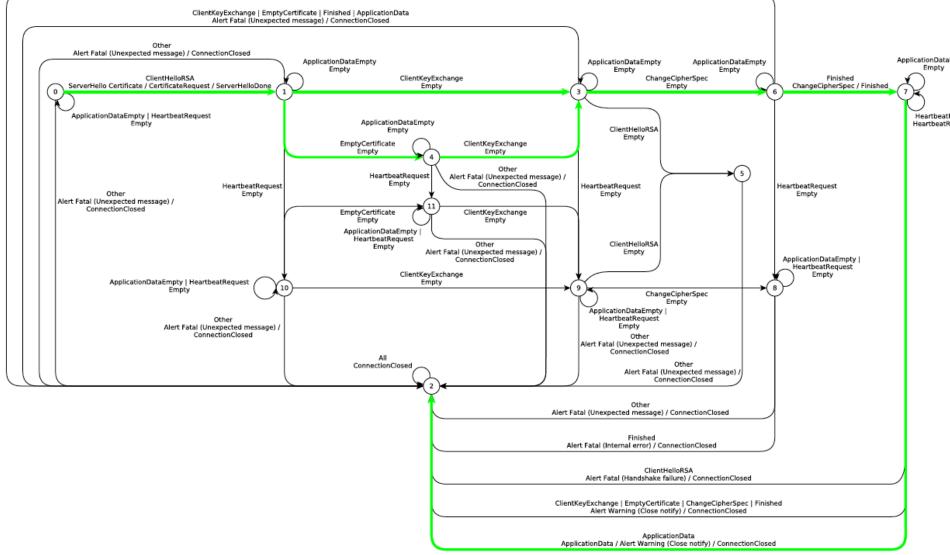
TLS RSA BSAFE



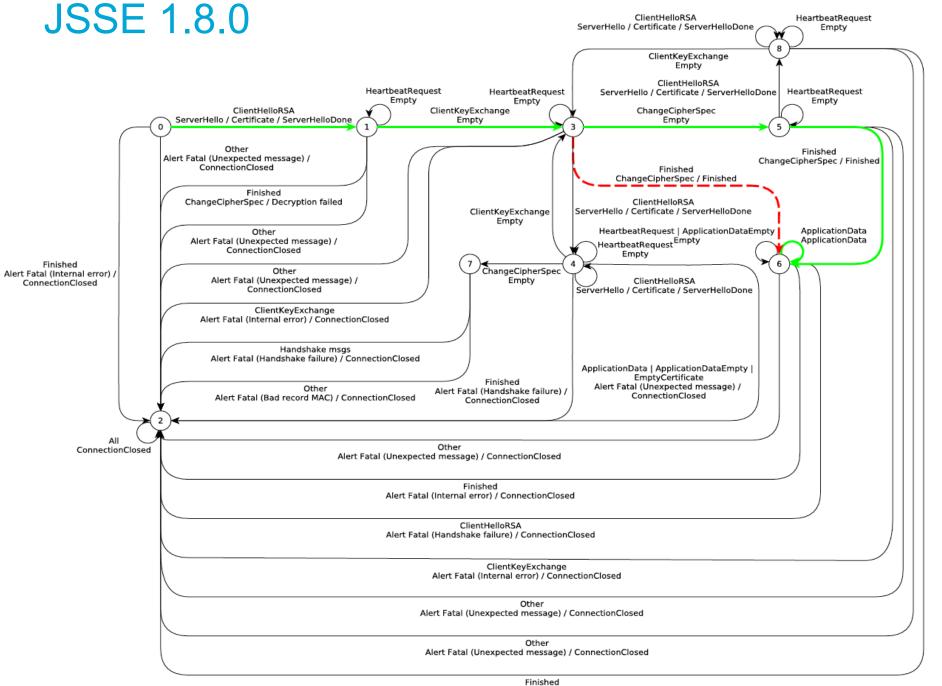


GNU TLS 3.3.8





TUDelft



Alert Fatal (Handshake failure) / ConnectionClosed Joeri de Ruiter & Erik Poll 201

In conclusion

- Get an overview of state-of-the-art research in testing and reversing
- Use testing and reversing tools in practice
 - Important for receiving a high grade is to not only apply these tools,
 but to demonstrate the ability to analyze their output
- We form groups on Google Forms, please register:
 - https://docs.google.com/forms/d/e/
 1FAIpQLSfPP57E6vCRASSUjmaTvpCUyu5GqaigmDM14gvJoZr6Rqtyw/viewform?usp=sf_link
- Slides and papers/topics will be available at:
 - https://github.com/TUDelft-CS4110-2018/
 - Also register on Slack, also for forming groups:
 - https://cs4110-2018.slack.com
- Email/Slack me if you need help forming a group:
 - s.e.verwer@tudelft.nl



Would automated testing have found Heartbleed?

- The root cause is memory management, but it is not a standard buffer overflow since it reads memory instead of writes
- Why was it not discovered immediately?
 - Only manifests itself on malicious input, works fine normally
 - Does not cause a crash, reads memory from the same process
 - (strange) heartbeat requests are not logged
- Fuzzing will definitely trigger the bug, but since it does not crash, or leave a trace, it is necessary to also test assertions/logic



Would automated testing have found Stagefright?

- It did!
- Using American Fuzzy Lop:
 - By Michal Zalewski "Icamtuf" (Google)
 - http://lcamtuf.coredump.cx/afl/
- Mutation based with genetic algorithm
 - Aims to maximize branch-coverage
- run for about 3 weeks, ~3200 tests per second
- Total CPU hours was over 6 months!



Would automated testing have found WannaCry?

- Probably not...
- Requires the SMB server to be in a very specific state before the mistake occurs, and then it only leads to an error after additional steps...
- Fuzzers are not (yet) capable of testing this
- But the tools you learn in this course might be used for this purpose!



Fuzzing Workshop



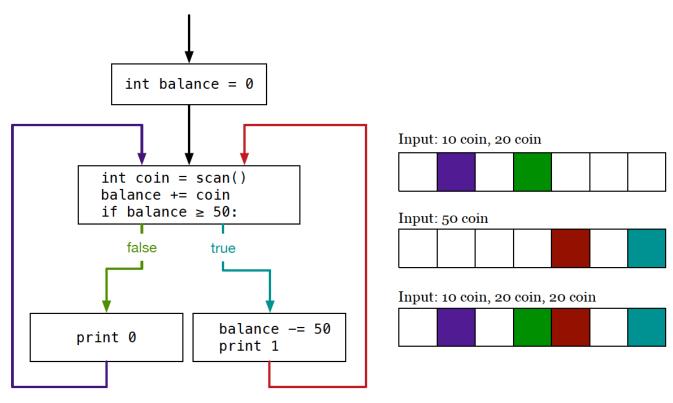
AFL Fuzzer

- A mutation-based fuzzer
- Mostly random, but some "smart" strategies for generating new inputs
- Very efficient, forks processes for quick resets
- Works out-of-the-box, no parameter tuning
- Finds real bugs



How AFL generates inputs

 Every trace sets different bits in a "bitmap", essentially a hashset of Booleans





- Try to generate traces that result in very different bitmaps
- Maximize branch-coverage

RERS Challenge

- An international challenge for code analysis tools
- Given highly obfuscated code, determine:
 - 1. whether certain conditions are met (logical statements)
 - 2. whether certain code parts can be reached
- Most participants focus on static analysis (not in this course)
 - interpreting the code
- In 2016, we won the challenge using dynamic analysis
 - running the code and observing what happens

We can already see a lot by simply fuzzing the code...

