

# Lec10: Fuzzing and Symbolic Execution

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# Administrivia

- In-class CTF on **Dev 1** (24 hours)!
- Submit your team's challenge by **Nov 27**
- But submit it early for our feedback!
- Or you can brainstorm your challenge during the office hours!

# Emphasis on Exploitation (so far)

- In practice, it's more important to ask: how to find bugs?
  - With source code
  - With only binaries

# Two Pre-conditions for Exploitation

1. Locating a bug (i.e., bug finding)
2. Triggering the bug (i.e., reachability)

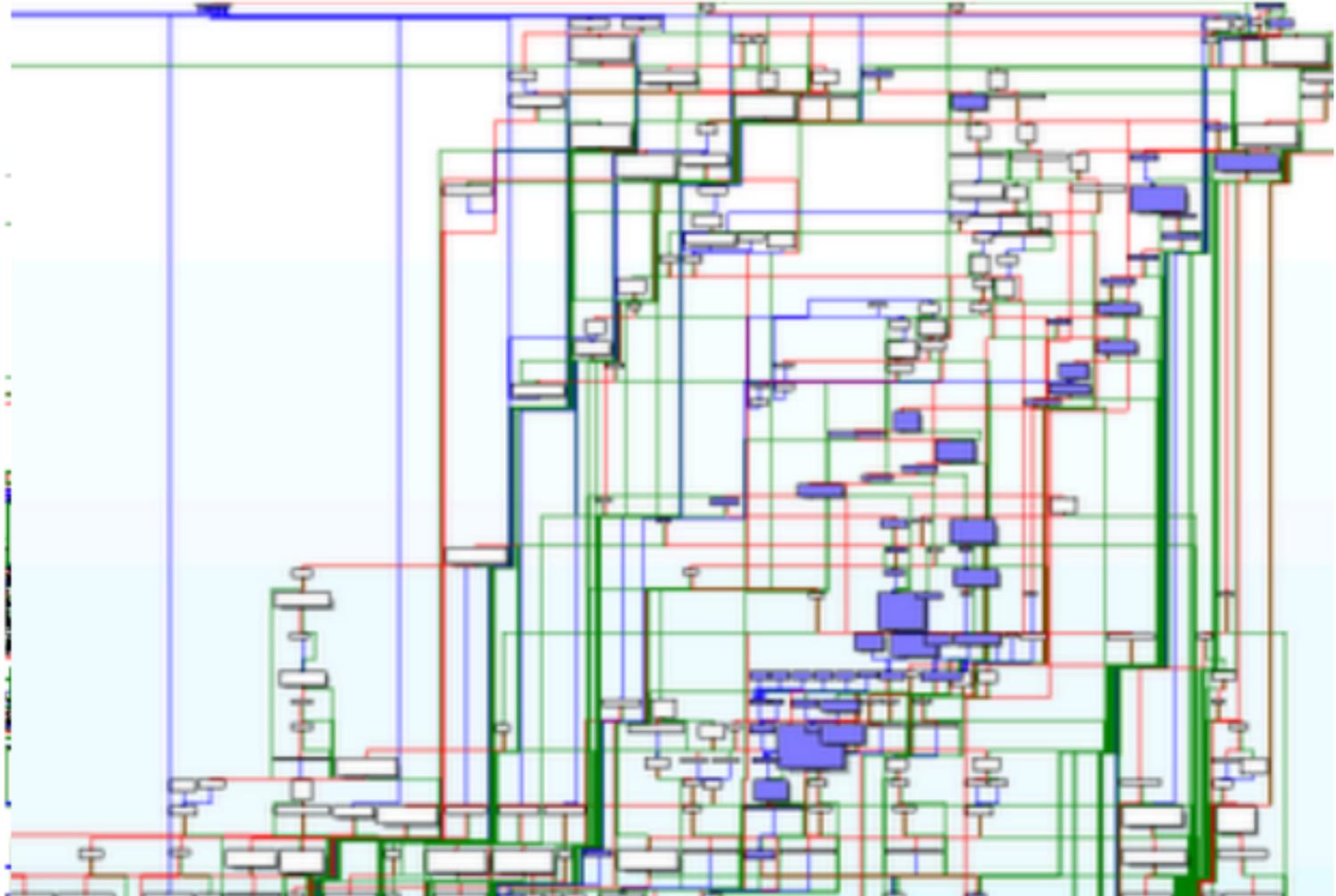
```
1 // Q2. How to reach this path?  
2 if (magic == 0xdeadbeef) {  
3     // Q1. Is this buggy?  
4     memcpy(dst, src, len)  
5 }
```

# Solution 1: Code Auditing (w/ code)

```
1  static OSStatus SSLVerifySignedServerKeyExchange(...) {
2    ...
3    if (err = SSLHashSHA1.update(&hashCtx, &clientRandom))
4        goto fail;
5    if (err = SSLHashSHA1.update(&hashCtx, &serverRandom))
6        goto fail;
7    if (err = SSLHashSHA1.update(&hashCtx, &signedParams))
8        goto fail;
9        goto fail;
10   if (err = SSLHashSHA1.final(&hashCtx, &hashOut))
11       goto fail;
12
13   err = sslRawVerify(...);
14   fail:
15       return err;
16 }
```



# Problem: Too Complex (e.g., browser)



# Two Popular Directions

- Symbolic execution (static)
- Fuzzing (dynamic)

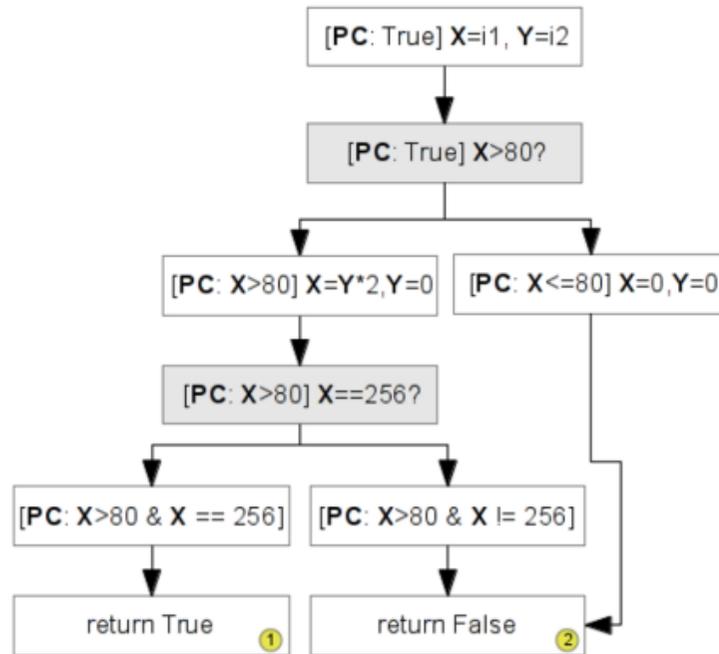
# Symbolic Execution

```

int foo(int i1, int i2)
{
    int x = i1;
    int y = i2;

    if (x > 80){
        x = y * 2;
        y = 0;
        if (x == 256)
            return True;
    }
    else{
        x = 0;
        y = 0;
    }
    /* ... */
    return False;
}

```



return True (1)

PC:  $i1 > 80 \ \& \ (i2 * 2) == 256$

return False (2)

PC:  $i1 \leq 80 \ | \ (i1 > 80 \ \& \ (i2 * 2) \neq 256)$

# Problem: State Explosion

- Too many path to explore (e.g., strcmp(input1, input2))
- Too huge input/state space (e.g., browser? OS?)
- Solving constraints is a hard problem (i.e., slow)

$\langle -n8 \vee n5 \vee n3 \vee -n18 \vee n8 \vee -n5 \rangle \wedge \langle n3 \vee -n12 \vee n4 \vee -n8 \vee n2 \vee -n11 \rangle \wedge$   
 $\langle -n18 \vee -n1 \vee -n6 \vee n12 \vee -n11 \vee -n7 \rangle \wedge \langle -n18 \vee n2 \vee n3 \vee -n11 \vee n4 \vee -n4 \rangle \wedge$   
 $\langle n1 \vee n3 \vee n18 \vee -n1 \vee -n7 \vee -n11 \rangle \wedge \langle n2 \vee -n7 \vee n12 \vee n8 \vee -n8 \vee -n12 \rangle \wedge \langle -n11 \vee -n18 \vee n7 \vee -n2 \vee n2 \vee -n8 \rangle \wedge$   
 $\langle -n1 \vee -n18 \vee -n2 \vee -n5 \vee n8 \vee n18 \rangle \wedge \langle n2 \vee -n1 \vee n18 \vee -n12 \vee -n8 \vee -n11 \rangle \wedge \langle -n18 \vee n12 \vee n11 \vee -n7 \vee n3 \vee n7 \rangle \wedge$   
 $\langle -n12 \vee n8 \vee n5 \vee n6 \vee n4 \vee n12 \rangle \wedge \langle n8 \vee n6 \vee -n18 \vee n18 \vee n7 \vee -n5 \rangle \wedge \langle n11 \vee -n6 \vee -n8 \vee n8 \vee n8 \vee n6 \rangle \wedge$   
 $\langle -n6 \vee n1 \vee -n11 \vee n3 \vee n8 \vee -n11 \rangle \wedge \langle n8 \vee n2 \vee -n2 \vee n18 \vee n12 \vee -n4 \rangle \wedge \langle -n11 \vee n6 \vee n8 \vee -n18 \vee -n7 \vee -n8 \rangle \wedge$   
 $\langle -n8 \vee n5 \vee n7 \vee n12 \vee n3 \vee -n1 \rangle \wedge \langle n8 \vee -n12 \vee n1 \vee -n2 \vee -n8 \vee n5 \rangle \wedge \langle -n3 \vee -n4 \vee n5 \vee -n12 \vee n2 \vee n8 \rangle \wedge$   
 $\langle n6 \vee -n8 \vee -n12 \vee n8 \vee -n7 \vee -n6 \rangle \wedge \langle n8 \vee -n18 \vee n8 \vee -n2 \vee -n12 \vee -n6 \rangle \wedge \langle -n8 \vee -n3 \vee n7 \vee -n2 \vee n4 \vee n18 \rangle \wedge$   
 $\langle -n6 \vee -n3 \vee -n11 \vee -n2 \vee n4 \vee n12 \rangle \wedge \langle n11 \vee -n11 \vee n7 \vee n8 \vee n2 \vee -n8 \rangle \wedge \langle -n18 \vee n6 \vee n8 \vee n3 \vee -n4 \vee n7 \rangle \wedge$   
 $\langle n7 \vee -n8 \vee n11 \vee n6 \vee -n3 \vee n8 \rangle \wedge \langle n6 \vee -n4 \vee n18 \vee -n12 \vee n7 \vee n5 \rangle \wedge \langle n5 \vee -n12 \vee n3 \vee -n3 \vee n11 \vee n18 \rangle \wedge$   
 $\langle -n4 \vee -n7 \vee n18 \vee n1 \vee -n2 \vee -n11 \rangle \wedge \langle n6 \vee n8 \vee n8 \vee n12 \vee n3 \vee -n6 \rangle \wedge \langle n6 \vee n1 \vee n8 \vee -n6 \vee -n12 \vee -n8 \rangle \wedge$   
 $\langle -n1 \vee -n4 \vee n4 \vee n6 \vee n1 \vee -n18 \rangle \wedge \langle -n18 \vee -n6 \vee -n8 \vee n5 \vee -n8 \vee n18 \rangle \wedge \langle -n1 \vee n18 \vee n6 \vee -n12 \vee n11 \vee -n8 \rangle \wedge$   
 $\langle -n18 \vee -n8 \vee n18 \vee -n2 \vee -n3 \vee n2 \rangle \wedge \langle n8 \vee n8 \vee -n11 \vee -n2 \vee n7 \vee -n12 \rangle \wedge \langle -n8 \vee n5 \vee n2 \vee n8 \vee -n8 \vee -n4 \rangle \wedge$   
 $\langle -n6 \vee -n1 \vee -n7 \vee -n12 \vee -n2 \vee -n8 \rangle \wedge \langle -n7 \vee n2 \vee n4 \vee n8 \vee -n5 \vee -n1 \rangle \wedge \langle -n5 \vee n8 \vee n12 \vee -n12 \vee n11 \vee -n2 \rangle \wedge$   
 $\langle -n11 \vee -n18 \vee -n8 \vee n8 \vee -n7 \vee n11 \rangle \wedge \langle n2 \vee -n4 \vee -n11 \vee n18 \vee -n12 \vee n4 \rangle \wedge \langle n3 \vee -n12 \vee -n6 \vee n1 \vee n11 \vee n8 \rangle \wedge$   
 $\langle -n8 \vee n4 \vee n8 \vee -n6 \vee n11 \vee n6 \rangle \wedge \langle -n4 \vee -n8 \vee n3 \vee n1 \vee -n18 \vee -n11 \rangle \wedge \langle n8 \vee n8 \vee -n3 \vee -n2 \vee n12 \vee -n5 \rangle \wedge$   
 $\langle n6 \vee -n11 \vee n12 \vee -n5 \vee n1 \vee n11 \rangle \wedge \langle n5 \vee -n11 \vee n7 \vee n8 \vee n8 \vee -n8 \rangle \wedge \langle n11 \vee -n12 \vee n8 \vee -n7 \vee n1 \vee n12 \rangle \wedge$

# Today's Topic: Fuzzing

- Key ideas
    1. Execute the program with pseudo-random inputs (i.e., input corpus)
    2. Check if the input crashes (i.e., crashing input)
    3. Observe the program execution (i.e., code coverage)
    4. Make a better guess for the input (i.e., input mutation)
- **Reachability** is free since we are executing with a concrete input!

# How well fuzzing can explore all paths?

```
1  int foo(int i1, int i2) {
2      int x = i1;
3      int y = i2;
4
5      if (x > 80) {
6          x = y * 2;
7          y = 0;
8          if (x == 256) {
9              * __builtin_trap();
10             return 1;
11         }
12     } else {
13         x = 0; y = 0;
14     }
15     return 0;
16 }
```

# DEMO: LibFuzzer

```
1 // $ clang++ -g -fsanitize=fuzzer ex.cc
2 // $ ./a.out
3 #include <stddef.h>
4 #include <stdint.h>
5
6 extern "C" int
7 LLVMFuzzerTestOneInput(const uint8_t *data, size_t size) {
8     if (size < 8)
9         return 0;
10
11     int i1, i2;
12     i1 = *(int *)&data[0];
13     i2 = *(int *)&data[4];
14     foo(i1, i2);
15
16     return 0;
17 }
```

# DEMO: Afl

```
1 // $ afl-gcc ex-afl.c
2 // $ afl-fuzz -i input -o output ./a.out
3 int main(int argc, char* argv[]) {
4     int i1 = 0;
5     int i2 = 0;
6
7     read(0, &i1, sizeof(i1));
8     read(0, &i2, sizeof(i2));
9
10    foo(i1, i2);
11
12    return 0;
13 }
```

# DEMO: tut01/crackme0x00 (Ref. [AFLplusplus](#))!

15

```
// -Q: for qemu wrapper  
$ afl-fuzz -i input -o output -Q ./crackme0x00
```

→ Q. how to find the password?

# Let's Compare Two Approaches

- To crash this example, both need to meet `i1 > 80` and `i2 == 128`:
    - Symbolic execution needs to resolve just two conditions (sounds easy)
    - Fuzzing needs to scan an entire **int** to find a proper `i2` (`i1` is easy)
  - However, LibFuzzer/AFL/AFLplusplus are much faster thanks to numerous heuristics!
  - Also, testing one fuzzing input is x10k faster!
- Q. what about `strcmp(buf, "250382")` in `crackme0x00`?

# Importance of High-quality Corpus

- In fact, fuzzing is really bad at exploring paths
  - e.g., if (a == 0xdeadbeef)
- So, paths should be (or mostly) given by corpus (sample inputs)
  - e.g., pdf files utilizing full features
  - but, not too many! (do not compromise your performance)
- A fuzzer will trigger the exploitable state
  - e.g., len in malloc()

# AFL (American Fuzzy Lop)

- VERY well-engineered fuzzer w/ lots of heuristics

## american fuzzy lop (2.52b)

My latest book, [Practical Doomsday](#), is now out. Please check it out!

*American fuzzy lop* is a security-oriented [fuzzer](#) that employs a novel type of compile-time instrumentation to generate interesting test cases that trigger new internal states in the targeted binary. This substantially improves the quality of [synthesized corpora](#) produced by the tool are also useful for seeding other, more labor- or resource-

```
american fuzzy lop 0.47b (readpng)
```

# Examples of Mutation Techniques

- interest: -1, 0x80000000, 0xffff, etc
- bitflip: flipping 1,2,3,4,8,16,32 bits
- havoc: random tweak in fixed length
- extra: dictionary, etc
- etc

# Idea 1: Map Input to State Transitions

- Input  $\rightarrow$  [IPs] (problem?)

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- Input  $\rightarrow$  map[blockIPs % len] (problem?  $A \rightarrow B$  vs  $B \rightarrow A$ )

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- Input  $\rightarrow$  map[((prevBlockIP >> 1) ^ curBlockIP) % len] (problem?)

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- Input  $\rightarrow$  [IPs] (problem?)
  - Input  $\rightarrow$  map[blockIPs % len] (problem?  $A \rightarrow B$  vs  $B \rightarrow A$ )
  - Input  $\rightarrow$  map[((prevBlockIP >> 1) ^ curBlockIP) % len] (problem?)
  - Input  $\rightarrow$  map[((rand1 >> 1) ^ rand2) % len] (problem?)
- $\rightarrow$  It also normalize (or bucketize) the map to handle loops better!

# Idea 2: Avoiding Redundant Paths

- If you see the duplicated state, throw out
  - e.g.,  $i1 = 1, 2, 3$
- If you see the new path, keep it for further exploration
  - e.g.,  $i1 = 81$

# How to Create Mapping?

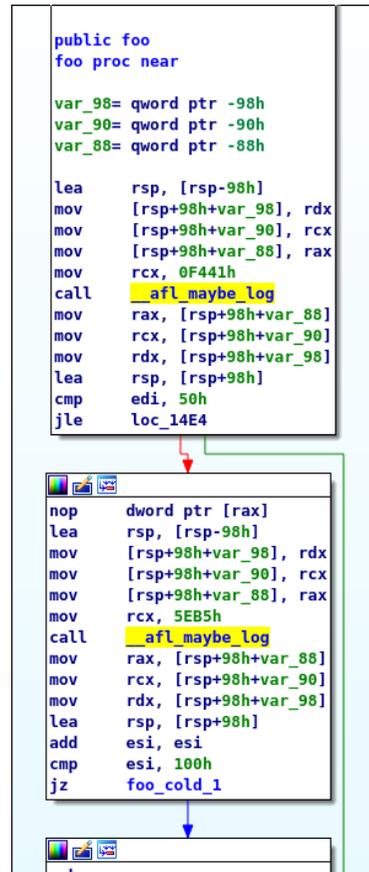
- Instrumentation
  - Source code → by compiler (e.g., gcc, clang)
  - Binary → via binary instrumentation (e.g., QEMU)

;

```
1  if (block_address > elf_text_start
2      && block_address < elf_text_end) {
3      cur_location = (block_address >> 4) ^ (block_address <<
4
5      shared_mem[cur_location ^ prev_location] ++;
6      prev_location = cur_location >> 1;
7  }
```

# Source Code Instrumentation

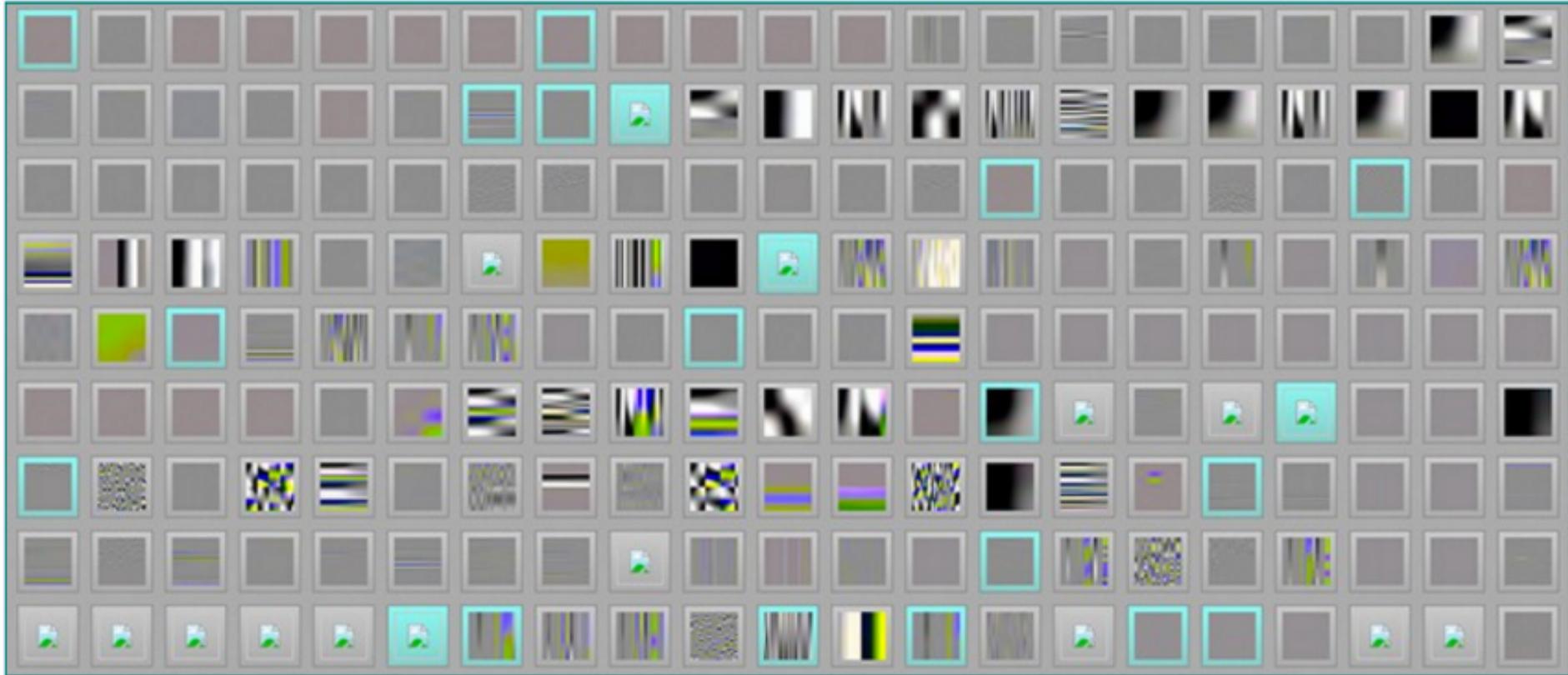
```
1436: mov    rcx,0xf441
143d: call  1520 <__afl_maybe_log>
```



# afl\_maybe\_log()

```
00000000000001440 <__afl_store>:
    # rcx = __afl_cur_loc
    xor     rcx,QWORD PTR [rip+0x2c51]    # rcx = __afl_cur_loc ^
__afl_prev_loc
    xor     QWORD PTR [rip+0x2c4a],rcx    # __afl_prev_loc = __afl_cur_loc
    shr     QWORD PTR [rip+0x2c43],1     # __afl_prev_loc =
__afl_prev_loc >> 1
    add     BYTE PTR [rdx+rcx*1],0x1     # __afl_area_ptr[rcx] += 1
```

# AFL Arts



Ref. <http://lcamtuf.coredump.cx/afl/>

# Other Types of Fuzzer

- Radamsa: syntax-aware fuzzer
- Cross-fuzz: function syntax for Javascript
- langfuzz: fuzzing program languages
- Driller/QSYM: fuzzing + symbolic execution

# Today's Tutorial

- Fuzzing with AFL/LibFuzzer
- Fuzzing with Angr/KLEE (optional)

```
$ wget https://t.ly/qPOLG
$ unxz fuzzing.tar.xz
$ docker load -i fuzzing.tar
$ docker run --privileged -it fuzzing /bin/bash
```

# References

-Sanitize, Fuzz, and Harden Your C++ Code