## **American Fuzzy Lop**

Introduction & technical presentation

## What is "fuzz testing"?

## What is "fuzz testing"?

- A way to test software products
  - test safety: try to find out lot of crash cases that you have not imagined yet
  - test security: in case of crash, be sure user cannot use your soft to break some things around

## What is "fuzz testing"?

- The way:
  - providing unexpected, invalid or random data
    - usual inputs : keyboard, mouse, API calls
    - unusual input but think to it : databases, SHM and all other ways I didn't think of yet

## Two types of fuzzing

- Generation based

- Mutation based

## **American Fuzzy Lop**

#### **AFL** in few words

**Mutation based fuzzer** 

**Genetic algorithm** 

**High efficiency** 

**Code instrumentation** 

note: every "cf." notifications, refer to the documentation of afl given with the package afl-2.10b from this link.

#### In which case can it be used?

#### For white box usage

- 1st step: compile your soft with AFL's compilators (based on gcc or clang)
- 2nd step: launch your test
- 3rd step : explore found crash cases

#### For black box usage

- instrumentation possible under QEMU
- 2-5x slower than classic instrumentation
- some issues with parallelism

## Compilation

#### 2 levels of code instrumentation for target binary

classic: intrumented at assembly level (near native execution speed)

```
afl-gcc & afl-g++
```

afl-clang & afl-clang++

fast: <u>clang only</u>, intrumented at compiler level (+/-10% better than native speed)

```
afl-clang-fast ->should replace afl-clang someday
```

afl-clang-fast++

#### What's needed to run some tests?

#### Must provide

One or few *valid* input case file(s)

#### Keep it simple

- **Shortest files**, are better to get good perfs (in term of test efficiency)

#### What's needed to run some tests?

#### For a good efficiency

A piece of software

- to test a very specific thing
- it should be think and written to be fast

**Command line: level 1** 

basic: give input files on stdin

afl-fuzz -i valid\_inputs\_folder/ -o afl\_output\_folder/ ./binary\_to\_test

**AFL** simply **send inputs** on **stdin** of your binary

**Command line: level 1** 

basic: give input files as parameter

afl-fuzz -i valid\_inputs\_folder/ -o afl\_output\_folder/ ./binary\_to\_test @@

@@ symbolize the place of the input file in your command

**Command line: level 2** 

Some options:

-x a\_dictionary: put a dictionary to help fuzzer

```
# Lines starting with '#' and empty lines are ignored.

# Adds "blah" (w/o quotes) to the dictionary.
kw1="blah"
# Use \\ for backslash and \" for quotes.
kw2="\"ac\\dc\""
# Use \xAB for hex values
kw3="\xF7\xF8"
# the name of the keyword followed by '=' may be omitted:
"foo\x0Abar"
```

image from : <a href="http://llvm.org/docs/LibFuzzer.html">http://llvm.org/docs/LibFuzzer.html</a>

**Command line: level 2** 

Some **options**:

-T 50 : set timeout to : 5x reference time + 50 ms

(basic timeout is : 5x reference time + 20 ms)

## And then, pull the trigger...

```
@sdkt048-jessie-fuzzy 11:18:59 test2 $ ./test2.sh hey
                                                                                  (my script just want name as param
afl-fuzz 2.10b by <lcamtuf@google.com>
  You have 12 CPU cores and 4 runnable tasks (utilization: 33%).
                                                                                  do not pay attention)
   Try parallel jobs - see docs/parallel_fuzzing.txt.
   Using specified CPU affinity: main = 1, child = 1
   Checking core_pattern...
                                                                       one core selected
   Checking CPU scaling governor...
   Setting up output directories...
   Output directory exists but deemed OK to reuse.
   Deleting old session data...
   Output dir cleanup successful.
                                                                    no -x given
   Scanning 'in'...
  No auto-generated dictionary tokens to reuse.
   Creating hard links for all input files...
   Validating target binary...
                                                                  test binary with given input case(s)
   Attempting dry run with 'id:000000,orig:myInk.jink'...
   Spinning up the fork server...
  All right - fork server is up.
[+] All test cases processed.
[+] Here are some useful stats:
   Test case count: 1 favored, 0 variable, 1 total
                                                                  what it's written
      Bitmap range: 6095 to 6095 bits (average: 6095.00 bits)
       Exec timing: 3313 to 3313 us (average: 3313 us)
   No -t option specified, so I'll use exec timeout of 20 ms.
     1 set and ready to roll!
```

Everything is ok!

## And then, pull the trigger...

```
american fuzzy lop 2.10b (more_heterogeneous_jink)
process timing
                                                        overall results
                 0 days, 17 hrs, 45 min, 22 sec
                 0 days, 0 hrs, 27 min, 23 sec
                                                              paths : 2072
last uniq crash : 0 days, 0 hrs, 6 min, 54 sec
                 0 days, 5 hrs, 28 min, 54 sec
                                                         uniq hangs : 40
cycle progress
                                       map coverage
                 2042 (98.55%)
                                                       9497 (14.49%)
                                                       2.62 bits/tuple
                 0 (0.00%)
                                       findings in depth
stage progress
now trying : interest 32/8
                                                      328 (15.83%)
                                       favored paths :
stage execs : 133k/198k (67.07%)
                                        total hangs : 1558 (40 unique)
 exec speed : 332.5/sec
                                                       path geometry
             600/3.27M, 75/3.27M, 16/3.27M
byte flips: 0/408k, 2/408k, 5/407k
                                                                  1683
arithmetics: 117/22.7M, 2/2.31M, 0/4549
                                                                  16
known ints : 21/1.93M, 18/11.2M, 12/17.7M
                                                                  1087
             95/22.1M, 46/22.3M, 48/20.1M
                                                                  984
     havoc: 120/2.87M, 0/0
                                                                  n/a
              34.22%/167k, 0.09%
                                                                cpu@00: 19%]
```

total path : unique call stacks found
total execs : number of tests done
"90 unique" : means 90 differents ???
levels : deepness of the mutation

**exec speed**: number of tests / sec

cf.: status\_screen.txt

### **AFL** output format

#### The output/ folder

```
build@sdkt048-jessie-fuzzy 11:20:45 math_1_simple_file_no_persistent $ 11 total 1056 drwx----- 2 build build 24576 Jul 11 05:24 crashes -rw----- 1 build build 65536 Jul 11 09:49 fuzz_bitmap -rw----- 1 build build 873 Jul 11 11:20 fuzzer_stats drwx----- 2 build build 24576 Jul 11 11:08 hangs -rw----- 1 build build 605909 Jul 11 11:18 plot_data drwx----- 3 build build 266240 Jul 11 09:49 queue
```

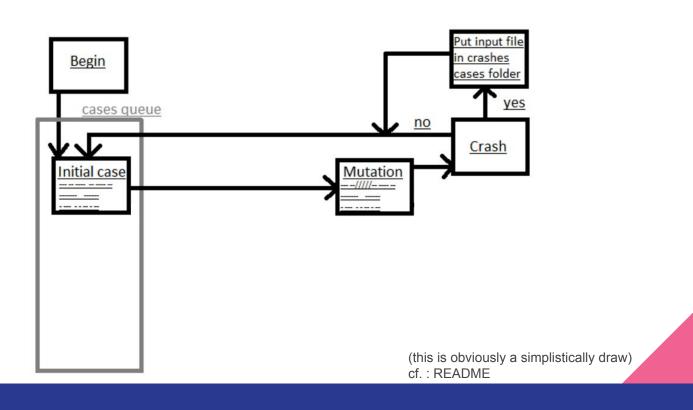
### **AFL** output format

#### Folder content

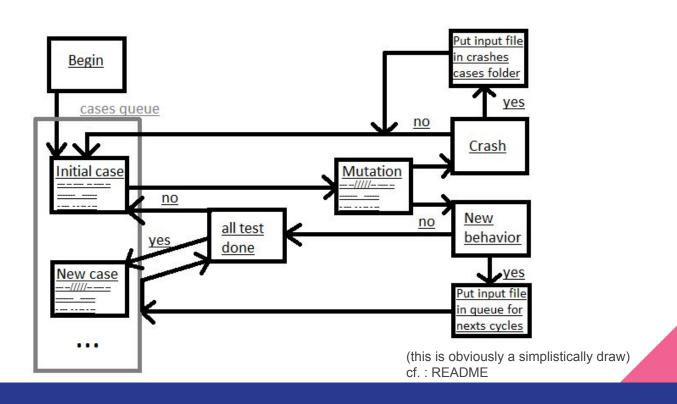
```
5 17:37 id:000347,sig:11,src:004768,op:havoc,rep:2
                                  5 17:38 id:000348,sig:11,src:004768,op:havoc,rep:2
-rw----- 1 build build 195 Jul
                                  5 17:56 id:000349,sig:11,src:004797,op:flip1,pos:31
     ---- 1 build build 189 Jul
            build build 189
                                  5 17:57 id:000350,sig:11,src:004797,op:flip4,pos:5
                                  5 17:57 id:000351,sig:11,src:004797,op:flip4,pos:12
                                  5 17:57 id:000352.sig:11.src:004797.op:flip4.pos:77
                                         id:000353,sig:11,src:004797,op:flip4,pos:108
                                         id:000354,sig:11,src:004797,op:arith8,pos:14,val:+6
                                         id:000355,sig:11,src:004797,op:arith8,pos:27,val:+13
                                  5 17:58 id:000356,sig:11,src:004797,op:arith8,pos:43,val:+14
                                  5 17:58 id:000357,sig:11,src:004797,op:arith8,pos:101,val:-5
                                  5 17:58 id:000358,sig:11,src:004797,op:arith8,pos:108,val:-7
                                  5 18:00 id:000359,sig:11,src:004797,op:int16,pos:187,val:be:-128
                                  5 18:01 id:000360,siq:11,src:004797,op:ext_AO,pos:12
                                  5 18:01 id:000361,sig:11,src:004797,op:ext_A0,pos:108
            build build 192 Jul
                                  5 18:05 id:000362,sig:11,src:004797,op:havoc,rep:2
                                 5 18:05 id:000363,sig:11,src:004797,op:havoc,rep:2
rw----- 1 build build 192 Jul
```

# Dive more into AFL & its ecosystem

## Nice! It works:) But... what's really happening?



## Nice! It works:) But... what's really happening?



#### **Mutations? What's mutation?**

bitflip L/S

- havoc

- arith L/8

- slice

interest L/8

- extras

cf.: status\_screen.txt

#### Multi thread tests

#### For multi thread test:

- -M a\_name : specify *master* fuzzer (deterministic)
- -S an\_other\_name : specify slave fuzzer (random)

Only one master and as many slaves as you want

**All fuzzers** must **share** the same **input\_folder** as well as the **output\_folder**.

### One more thing ...

**Software** with **heavy initial load** can **get huge performance boost** with :

#### **AFL** persistent mode

For me, it make the fuzzer increase by **1000**% the average speed execution.

From 300 to 3000 executions / second...

It's easy to set up, just go read README.llvm.

#### **Persistent mode**

```
int main(int argc, char** argv)
      while ( AFL LOOP(1000))
            * Reset state. */
            memset(buf, 0, 100);
            /* Read input data. */
            read(0, buf, 100);
            /* Parse it in some vulnerable way. You'd normally call a library here.
*/
            if (buf[0] != 'p') puts("error 1"); else
             if (buf[1] != 'w') puts("error 2"); else
            if (buf[2] != 'n') puts("error 3"); else
                   abort();
exemple from: https://lcamtuf.blogspot.se/2015/06/new-in-afl-persistent-mode.htm
```

## **AFL**: fuzzing process

Launch a first run,

```
american fuzzy lop 0.47b (readpng)
process timing
                                                          overall results
       run time : 0 days, 0 hrs, 4 min, 43 sec
                                                          cycles done : 0
  last new path : 0 days, 0 hrs, 0 min, 26 sec
                                                          total paths: 195
last uniq crash : none seen yet
last uniq hang : 0 days, 0 hrs, 1 min, 51 sec
                                                         uniq crashes: 0
                                                           unia hangs : 1
cycle progress
                                        map coverage
now processing: 38 (19.49%)
                                          map density: 1217 (7.43%)
paths timed out : 0 (0.00%)
                                       count coverage : 2.55 bits/tuple
                                        findings in depth
stage progress
now trying : interest 32/8
                                       favored paths : 128 (65.64%)
stage execs : 0/9990 (0.00%)
                                        new edges on :
                                                       85 (43.59%)
                                                       0 (0 unique)
                                       total crashes:
 exec speed: 2306/sec
                                         total hangs :
                                                        1 (1 unique)
fuzzing strategy yields
                                                         path geometry
  bit flips: 88/14.4k, 6/14.4k, 6/14.4k
byte flips: 0/1804, 0/1786, 1/1750
                                                         pending: 178
              31/126k, 3/45.6k, 1/17.8k
arithmetics:
                                                        pend fav : 114
known ints: 1/15.8k, 4/65.8k, 6/78.2k
                                                        imported: 0
      havoc: 34/254k, 0/0
                                                        variable: 0
              2876 B/931 (61.45% gain)
                                                          latent: 0
```

## **AFL**: fuzzing process

Launch a first run,

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american fuzzy lop 0.47b (readpng)
 process timing
                                                          overall results
                                                                                           cycle counter
       run time : 0 days, 0 hrs, 4 min, 43 sec
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now trying : interest 32/8
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     flips: 88/14.4k, 6/14.4k, 6/14.4k
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                                                        imported: 0
      havoc: 34/254k, 0/0
                                                        variable: 0
              2876 B/931 (61.45% gain)
                                                          latent: 0
```

## **Interesting env variables**

• AFL\_DONT\_OPTIMIZE

AFL\_SKIP\_CPUFREQ

• AFL\_EXIT\_WHEN\_DONE

• AFL\_HARDEN

## "Sanitize, Fuzz, and Harden Your C++ Code" conference by Kostya Serebryany

#### Kostya Serebryany

- Software engineer and software systems at google research department
- Kostya's team develops dynamic testing tools, of "The LLVM Compiler Infrastructure": the sanitizers
  And also, another fuzzing tool little bit different from AFL,
  which is LibFuzzer

cf. the conference : <a href="https://www.youtube.com/watch?v=FP8zFhB\_cOo">https://www.youtube.com/watch?v=FP8zFhB\_cOo</a>

## "Sanitize, Fuzz, and Harden Your C++ Code" conference by Kostya Serebryany

#### **About fuzzing**

- At google, several thousand of cpu cores are fuzzing something every minutes.
- While the development of chromium, they found more than 5000 bugs with fuzzing

## Sanitizers: description

ASan: Address Sanitizer detects use-after-free, buffer-overflow, and leaks.

TSAN: Thread Sanitizer detects data races, deadlocks.

MSAN: Memory Sanitizer detects uses of uninitialized memory.

UBSan: Undefined Behavior Sanitizer detects... that.

New tools, based on **compiler** instrumentation. Available in LLVM and GCC (both open-source)

Sanitizers

Image from the conference of the previous slide :

https://www.youtube.com/watch?v=FP8zFhB\_cOo

## My experience

#### What did i found with fuzz testing:

- forgotten checks
- floating point exceptions
- conception problems
- I found some cases that could never happen, but they did!

## Lot of other things

Just go to <a href="http://lcamtuf.coredump.cx/afl/">http://lcamtuf.coredump.cx/afl/</a> get the last release and read all the documentation available.

### Participate to the AFL project

Be part of the AFL project by asking questions and proposing ideas

for this project, on the google group next here:

https://groups.google.com/forum/#!forum/afl-users

## Thank you for your attention!

I hope you have learnt some interesting things.

This is a completely subjective "documentation". It is absolutely not the official one or the unique and right way to use AFL.

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