

# WAFL

Keno Haßler & Dominik Maier

Binary-Only WebAssembly Fuzzing  
with Fast Snapshots

Reversing and Offensive-oriented Trends Symposium 2021 (ROOTS)



# Overview

1. WebAssembly Intro
2. Fuzzing Intro
3. Evolution of WAFL
4. Evaluation
5. Demo

# WebAssembly

# WebAssembly

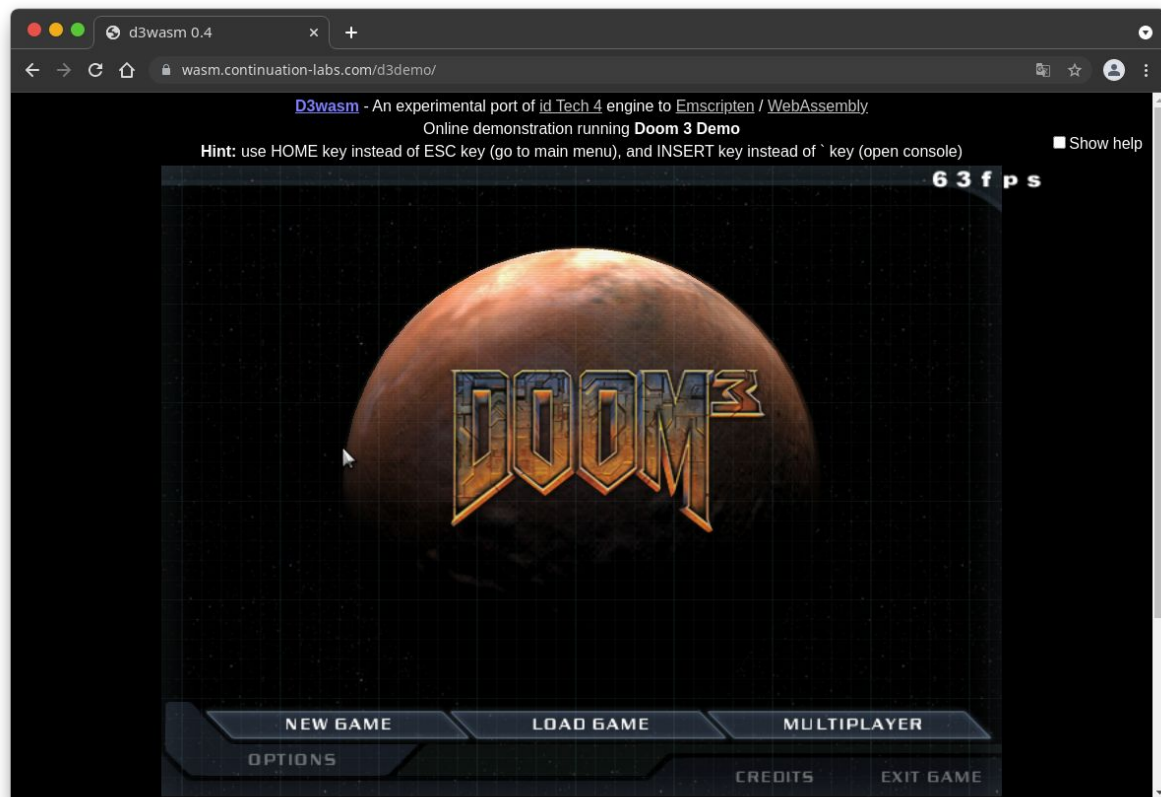
JS is slow

⇒ computation intensive workloads  
(encoding/decoding, crypto, ...) are slow

Solution:

- Write stuff in low-level languages
- Compile for a safe, portable, performant VM
- Profit

# Does it run Doom?



Yes, it does!  
(quite well, actually)

Ported by Continuation Labs  
(<https://www.continuation-labs.com/projects/d3wasm/>)



# WebAssembly System Interface

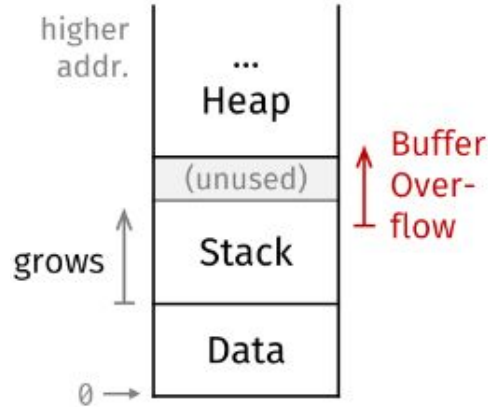
Standalone binaries possible (think Java):

- standardized system interface
- wasi-libc: POSIX-like API
- compile standard CLI tools to WebAssembly

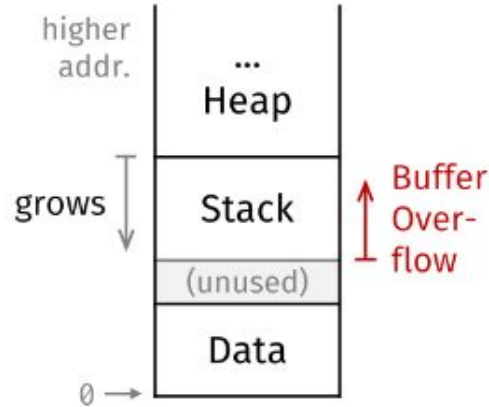
# WebAssembly | Technical Overview

- Stack machine
  - No registers
  - Globals, locals, linear memory
- Compilers create stack, heap, data sections
  - Unmanaged, no VM-based protections
  - Returns are safe

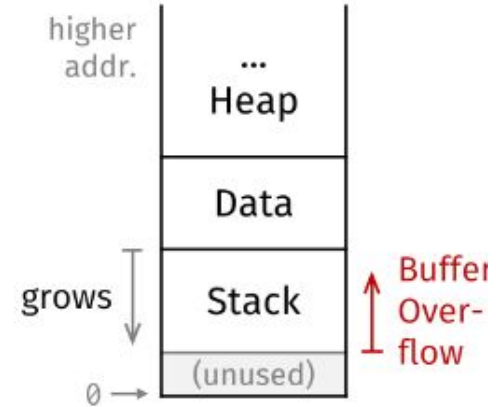
# WebAssembly | Memory Organization



(a) emcc 1.39.7  
(*fastcomp* backend,  
deprecated).



(b) emcc 1.39.7  
(*upstream* backend),  
clang 9 (WASI).



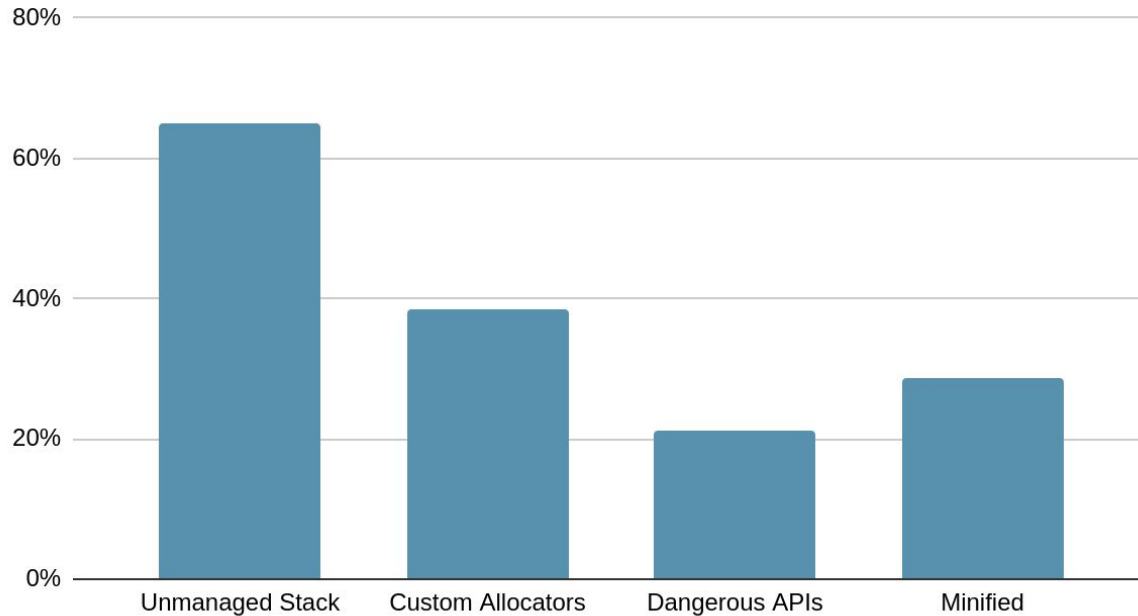
(c) clang 9 (WASI  
with stack-first),  
rustc 1.41 (WASI).

Image Source: Lehmann et al. *Everything Old is new Again* (2020)



# WebAssembly | In the wild

## Security Analysis



Source: Hilbig et al. *An Empirical Study of Real-World WebAssembly Binaries* (2021)

# Motivation

- WebAssembly widely used
  - riddled with bugs from source langs
- Minimal binary security tooling
- We need a Fuzzer for unknown binaries!

# Fuzzing

TL;DR: Throw corner-case input at a program until it breaks.

# Fuzzing | Intro

- Fuzzing idea: random input may trigger corner cases
- Greybox fuzzing: use **coverage feedback** to reach more code
- Our focus is on AFL++

# Fuzzing | AFL 101

- Instrument source code with compiler
  - insert feedback mechanism, shared mem
- execute program
- repeat

# Fuzzing | AFL's Improvement Strategies


- Instrumentation: less edges (InsTrim, SanCov)
  - improved hard case handling (e.g. comparisons)
- fork server instead of execve
- *Persistent mode* instead of fork


# Fuzzing | WebAssembly SOTA

- Metzman: instrument source code using libFuzzer
- Result: OSS-Fuzz programs fuzzing in the browser
- Drawback: needs source

# Fuzzing | WebAssembly SOTA

Emscripten-Generated Code × +

← → ↺  [https://jonathanmetzman.github.io/wasm-fuzzing-demo/brotli/decode\\_fuzzer.html](https://jonathanmetzman.github.io/wasm-fuzzing-demo/brotli/decode_fuzzer.html) ☆

 **powered by**  
**emscripten**

☐ Resize canvas ☒ Lock/hide mouse

```
#19745 NEW ft: 1634 corp: 358/3126b lim: 17 exec/s: 789 rss: 0Mb L: 17/17 MS: 5 CopyPart-InsertByte-ChangeByte-ChangeBit-CrossOver-
#19766 NEW ft: 1637 corp: 359/3141b lim: 17 exec/s: 790 rss: 0Mb L: 15/17 MS: 1 CopyPart-
#19773 REDUCE ft: 1638 corp: 360/3158b lim: 17 exec/s: 790 rss: 0Mb L: 17/17 MS: 2 PersAutoDict-CrossOver- DE: "\x01\x00"-
#19799 NEW ft: 1656 corp: 361/3172b lim: 17 exec/s: 791 rss: 0Mb L: 14/17 MS: 1 ChangeBit-
#19820 NEW ft: 1657 corp: 362/3186b lim: 17 exec/s: 792 rss: 0Mb L: 14/17 MS: 1 ChangeByte-
#19846 REDUCE ft: 1657 corp: 362/3185b lim: 17 exec/s: 793 rss: 0Mb L: 12/17 MS: 1 EraseBytes-
#19896 NEW ft: 1681 corp: 363/3202b lim: 17 exec/s: 795 rss: 0Mb L: 17/17 MS: 5 InsertByte-ShuffleBytes-InsertByte-ChangeBit-CrossOver-
#19927 NEW ft: 1683 corp: 364/3218b lim: 17 exec/s: 797 rss: 0Mb L: 16/17 MS: 1 PersAutoDict- DE: "\xff\xff\xff\xff"-
#20033 NEW ft: 1694 corp: 365/3232b lim: 17 exec/s: 801 rss: 0Mb L: 14/17 MS: 1 ChangeBit-
#20036 NEW ft: 1695 corp: 366/3243b lim: 17 exec/s: 801 rss: 0Mb L: 11/17 MS: 3 ChangeASCIIInt-ChangeBit-ChangeBinInt-
```

[More Demos](#)  
[README.md](#)





# Motivation

- We want to fuzz real-world Wasm binaries
  - without source code access
  - at a reasonable performance level

WAFL

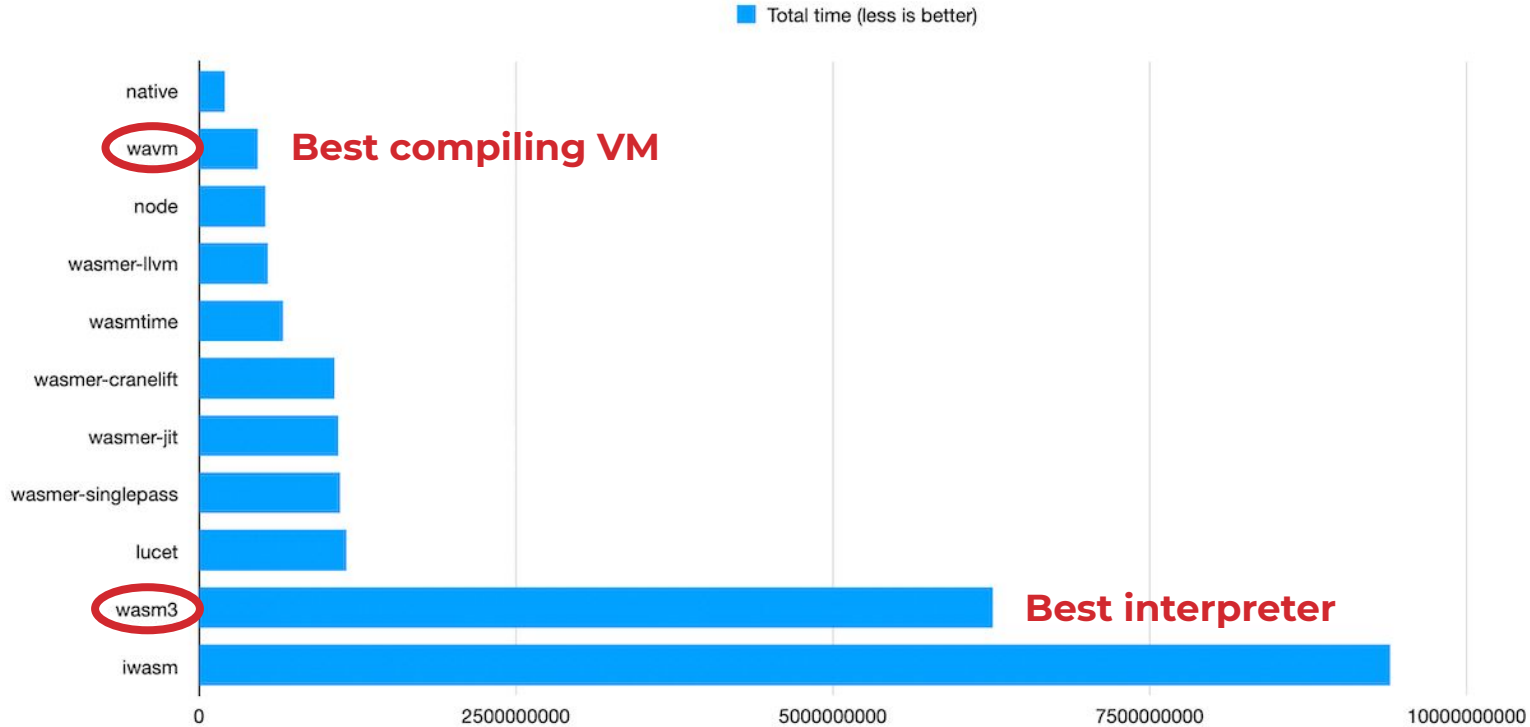
Binary-only WebAssembly Fuzzing  
with Fast Snapshots

# First Steps

We need

1. a performant Wasm VM
2. to insert instrumentation code
3. to communicate with AFL

# WebAssembly VM performance



Graph & Data by Frank Denis (<https://00f.net/2021/02/22/webassembly-runtimes-benchmarks/>)



# Inserting Instrumentation 1

- Straightforward for interpreted VMs
  - Modify implementation for *control instructions*
  - Create coverage information

```
if (condition) {  
    afl_maybe_log(branch); // log the branch target address  
    return jumpOp (branch);  
} else {  
    afl_maybe_log(_pc + 1); // log the next operation  
    nextOp ();  
}
```

# “Hello, AFL”

- Insert into VM startup:
  - Function to map AFL’s shared memory
  - *Fork server* code

# It works!

```
american fuzzy lop ++3.12c (default) [fast] {0}11 results
┌─────────── process timing ───────────┐ ┌─────────── overall results ───────────┐
│ run time : 0 days, 0 hrs, 8 min, 26 sec │ │ cycles done : 58 │
│ last new path : 0 days, 0 hrs, 7 min, 47 sec │ │ total paths : 13 │
│ last uniq crash : 0 days, 0 hrs, 1 min, 58 sec │ │ uniq crashes : 1 │
│ last uniq hang : none seen yet │ │ uniq hangs : 0 │
└─────────── cycle progress ───────────┐ ┌─────────── map coverage ───────────┐
│ now processing : 3.637 (23.1%) │ │ map density : 0.44% / 0.49% │
│ paths timed out : 0 (0.00%) │ │ count coverage : 1.13 bits/tuple │
└─────────── stage progress ───────────┐ ┌─────────── findings in depth ───────────┐
│ now trying : havoc │ │ favored paths : 7 (53.85%) │
│ stage execs : 165/291 (56.70%) │ │ new edges on : 9 (69.23%) │
│ total execs : 409k │ │ total crashes : 1 (1 unique) │
│ exec speed : 771.5/sec │ │ total tmouts : 2 (1 unique) │
└─────────── fuzzing strategy yields ───────────┐ ┌─────────── path geometry ───────────┐
│ bit flips : n/a, n/a, n/a │ │ levels : 3 │
│ byte flips : n/a, n/a, n/a │ │ pending : 1 │
│ arithmetics : n/a, n/a, n/a │ │ pend fav : 0 │
│ known ints : n/a, n/a, n/a │ │ own finds : 12 │
│ dictionary : n/a, n/a, n/a │ │ imported : 0 │
│ havoc/splice : 11/284k, 2/124k │ │ stability : 100.00% │
│ py/custom : 0/0, 0/0 │ │ │
│ trim : 0.00%/37, n/a │ │ │
└───────────┐ ┌───────────┐
[cpu000: 25%]
```



# Can we do better?

Status quo:

- Interpreted runtime
- Fork syscalls
- Inputs passed via FS



# WAVM internals

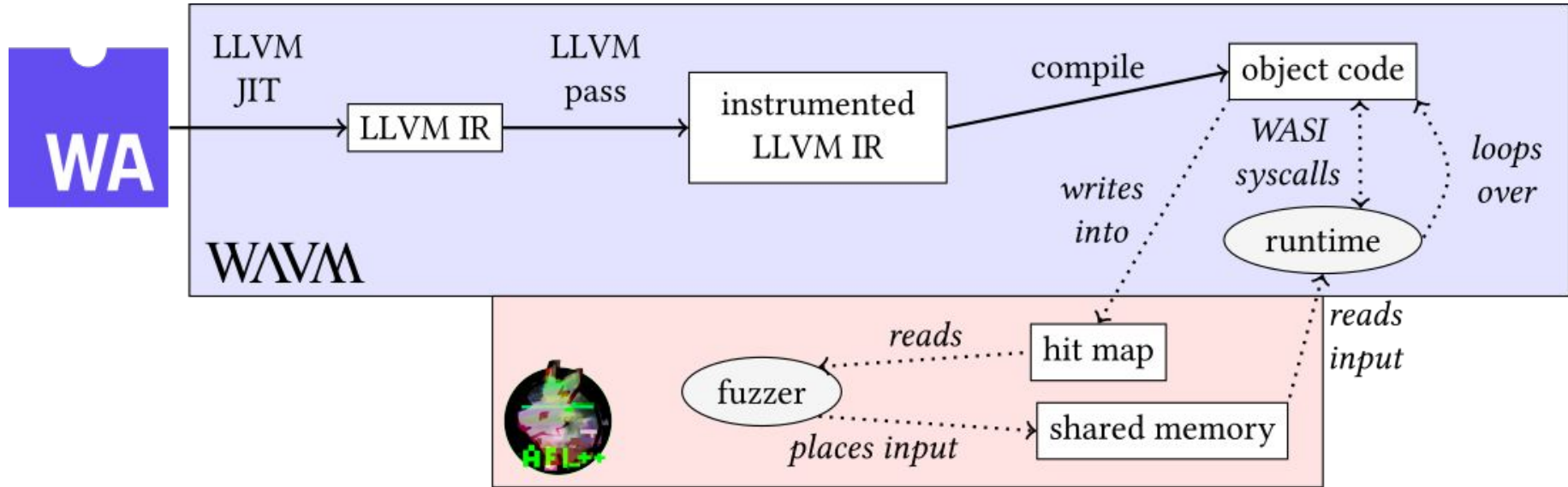
- LLVM-JIT based, currently fastest runtime
- Ahead-of-time compilation:
- WebAssembly -> LLVM IR -> native code
  - Still needs the WAVM runtime, not standalone

# Using WAVM

- Re-use the startup and fork server code
- How to instrument?
  - Runtime uses LLVM optimizer passes
  - AFL compilers use LLVM optimizer passes



# WAFL: high-level overview



## Inserting Instrumentation 2

- Can use standard afl-llvm-pass!
  - run it after optimization passes
- Need to provide data structures (shared map)
- works!

# Improving Performance

- We need to get rid of forking
- *AFL persistent mode* fits our application
  - Loop over interesting code region
  - Reset the runtime

# Snapshot & Reset

- Hard part: proper VM reset
- Could just reinitialize -> too costly!
- sufficient to reset only WebAssembly Memory
  - backup after initialization
  - restore on every loop iteration

# Boom!

```

american fuzzy lop ++3.12c (default) [fast] {}ll results
process timing ----- overall results
    run time : 0 days, 0 hrs, 1 min, 38 sec
    last new path : 0 days, 0 hrs, 1 min, 37 sec
    last uniq crash : 0 days, 0 hrs, 1 min, 17 sec
    last uniq hang : none seen yet
    cycle progress -----
    now processing : 1.1719 (33.3%)
    paths timed out : 0 (0.00%)
    stage progress -----
    now trying : havoc
    stage execs : 219/291 (75.26%)
    total execs : 1.06M
    exec speed : 11.0k/sec
    fuzzing strategy yields -----
    bit flips : n/a, n/a, n/a
    byte flips : n/a, n/a, n/a
    arithmetics : n/a, n/a, n/a
    known ints : n/a, n/a, n/a
    dictionary : n/a, n/a, n/a
    havoc/splice : 3/1.06M, 0/0
    py/custom : 0/0, 0/0
    trim : 33.33%/1, n/a
    map coverage -----
    map density : 0.01% / 0.01%
    count coverage : 1.00 bits/tuple
    findings in depth -----
    favored paths : 3 (100.00%)
    new edges on : 3 (100.00%)
    total crashes : 1 (1 unique)
    total tmouts : 4 (1 unique)
    path geometry -----
    levels : 2
    pending : 0
    pend fav : 0
    own finds : 2
    imported : 0
    stability : 100.00%
    [cpu000: 50%]

```



# More improvement 1

- Input is still passed via FS -> Kernel
- Want to use the shared memory
  - Modify the readv WASI implementation
  - if (fd == 0) then read\_from\_shmem



## More improvement 2

- Other AFL passes preferred upstream
- We can integrate InsTrim
- AFL SanitizerCoverage not working
  - Vanilla LLVM version works with a small hack\*

\*may cost some performance



## More improvement 3

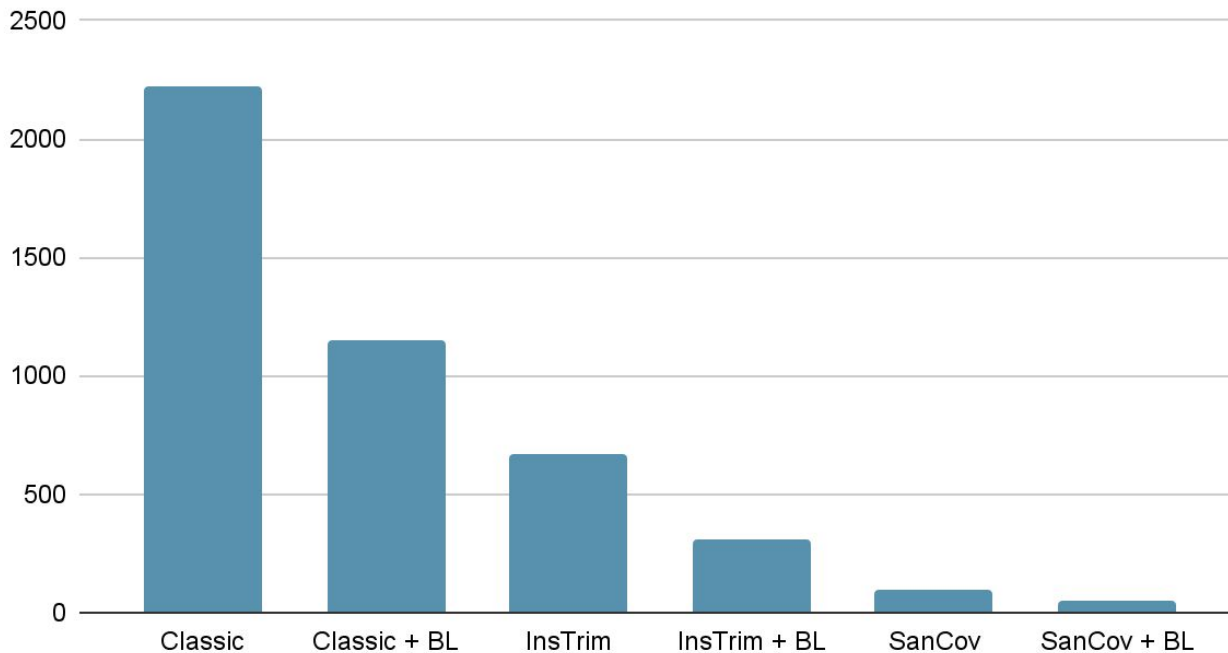
- We instrument libc, it's part of the binary
  - probably not main interest
- Non-stripped binaries: can identify function names
  - we provide a blocklist\*

\*derived from wasi-libc symbol list



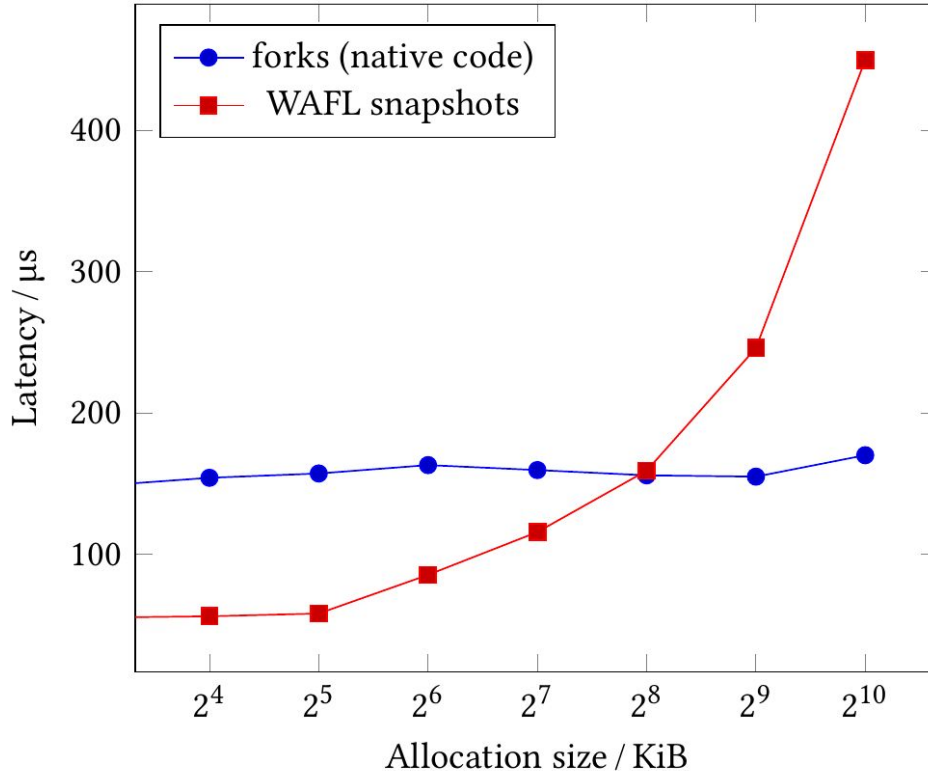
# Result (brotli)

## Instrumented Edges



# Evaluation

# Snapshot efficiency



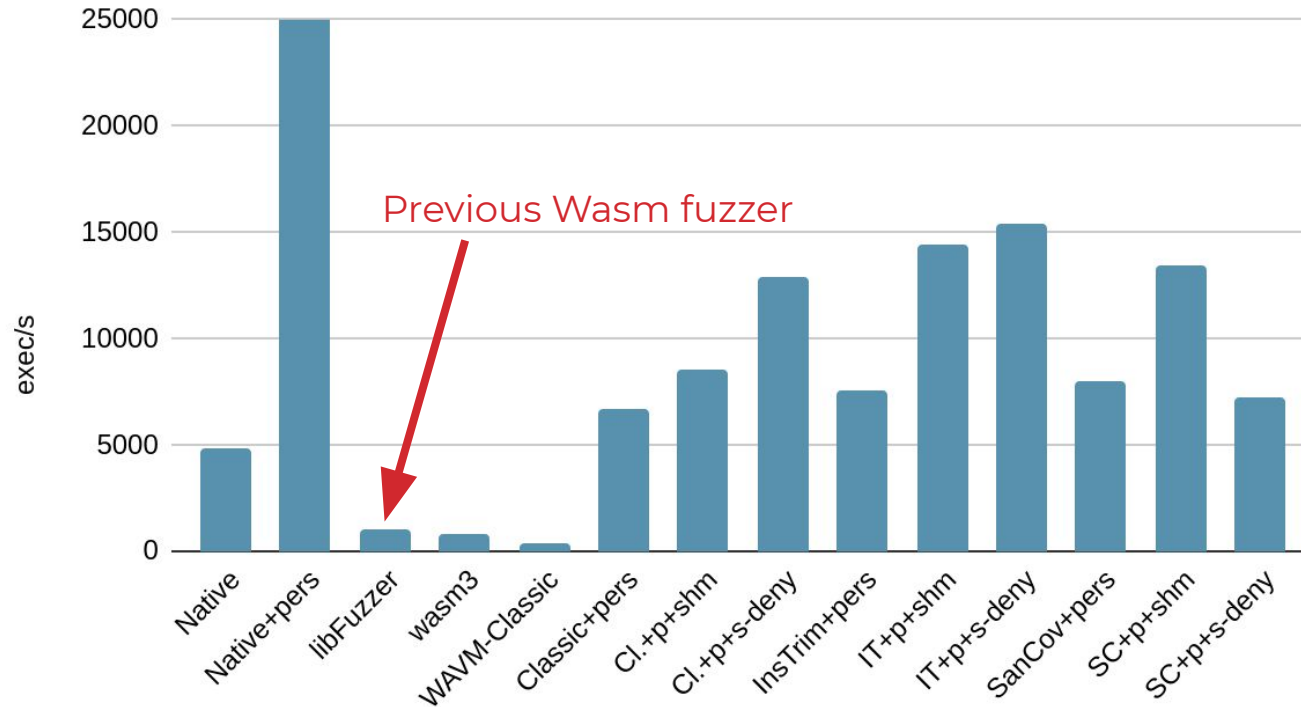
- depends on allocation size (memory copy)
- if  $< 256\text{KiB}$ :
  - faster than `fork()`

# Test setup

- We test lots of configurations
  - Persistent, shmем, BL, different instrumentation
  - Also, native binaries for comparison
- No changes to the fuzzer
  - **Short** fuzzing runs, evaluating raw **speed**

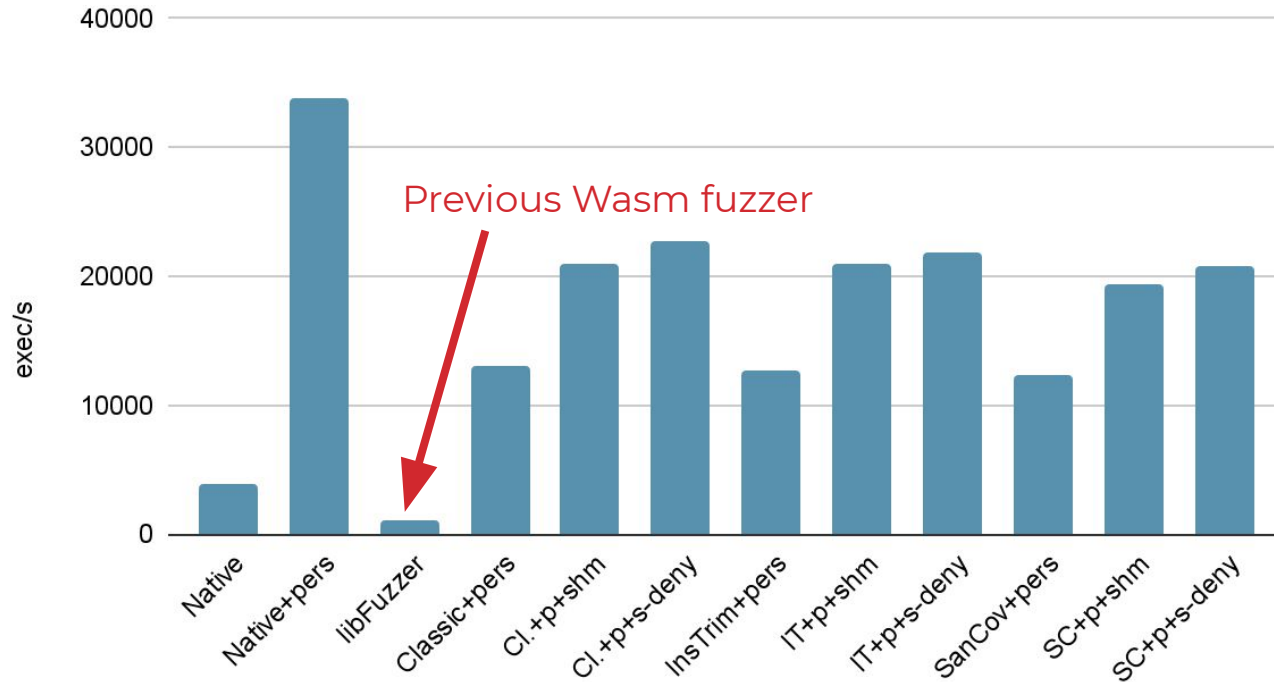
# Speed Test 1

brofliSpeed



# Speed Test 2

IzmaSpeed





# Bottom Line

- **WAFL >> native** (forking harness)
- **Snapshots** are a must-have
- SanitizerCoverage underperforms
  - Is preferred upstream -> our problem
  - Potential for optimization

# Conclusion

- First binary-only WebAssembly fuzzer
- Fast snapshots make high performance
- Can profit from further AFL++ optimizations
- Open-source code available at  
<https://github.com/fgsect/WAFL>

```
while (questions());  
  
char buf[16];  
strncpy(buf, "  
    Thank you for your attention.  
    \n", sizeof(buf));  
printf("%s", buf);
```