# Going Beyond Coverage-Guided Fuzzing with Structured Fuzzing

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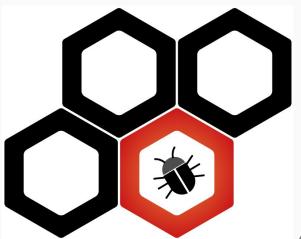
#### Unstructured Fuzzing = Magic

```
american fuzzy lop 2.52b (target)
      run time : 0 days, 0 hrs, 1 min, 13 sec
 last new path : 0 days, 0 hrs, 0 min, 35 sec
                                                        total paths : 7
last uniq crash : 0 days, 0 hrs, 0 min, 25 sec
last uniq hang : none seen yet
                                                        uniq hangs : 0
now processing : 5 (71.43%)
                                         map density : 0.02% / 0.04%
                                      count coverage : 1.00 bits/tuple
paths timed out : 0 (0.00%)
                                      favored paths : 7 (100.00%)
now trying : havoc
stage execs: 306/512 (59.77%)
                                      new edges on : 7 (100.00%)
                                      total crashes : 11 (4 unique)
total execs : 33.2k
exec speed: 467.6/sec
                                       total tmouts : 0 (0 unique)
 bit flips : 0/304, 0/297, 1/283
                                                        levels : 5
byte flips: 0/38, 0/31, 0/18
                                                       pending: 0
arithmetics : 3/2127, 0/143, 0/0
                                                       pend fav : 0
known ints: 0/208, 0/827, 0/792
                                                      own finds: 6
dictionary: 0/0, 0/0, 0/0
                                                      imported : n/a
     havoc : 6/24.3k, 0/3488
                                                      stability : 100.00%
      trim : 30.43%/8, 0.00%
                                                               [cpu000: 17%]
```

```
void Visit(const ImageFilterChild&);
void Visit(const ImageFilterParent&, const int num inputs required);
void Visit(const MatrixImageFilter&);
void Visit(const Matrix&, bool is local = false);
void Visit(const SpecularLightingImageFilter&);
void Visit(const PaintImageFilter&);
void Visit(const Paint&);
void Visit(const PaintEffects&);
void Visit(const PathEffectChild&);
void Visit(const LooperChild&);
void Visit(const LayerDrawLooper&);
void Visit(const LayerInfo&);
void Visit(const ColorFilterChild&);
void Visit(const ComposeColorFilter&);
void Visit(const OverdrawColorFilter&);
void Visit(const ToSRGBColorFilter&);
void Visit(const ColorFilterMatrix&);
void Visit(const ColorMatrixFilterRowMajor255&);
void Visit(const MergeImageFilter&);
void Visit(const XfermodeImageFilter&);
void Visit(const DiffuseLightingImageFilter&);
void Visit(const XfermodeImageFilter Base&);
void Visit(const TileImageFilter&);
void Visit(const OffsetImageFilter&);
void Visit(const ErodeImageFilter&);
void Visit(const DilateImageFilter&);
void Visit(const DiscretePathEffect&);
void Visit(const MatrixConvolutionImageFilter&);
void Visit(const MagnifierImageFilter&);
```

#### Bio

- Jonathan Metzman
  - Representing myself, not Google.
- Chrome Security
  - ClusterFuzz



# What is Structured Fuzzing?

	Structure Unaware	Structure Aware
Unguided	/dev/urandom	Script that generates HTML files
Coverage-Guided	AFL/libFuzzer (Unstructured Fuzzing)	Structured Fuzzing

#### Why Structured Fuzzing?

# More Bugs!

```
==158261==ERROR: AddressSanitizer: heap-buffer-overflow on address 0x60d0000023c0 at pc 0x55a4fea33789 bp 0x7ffef81
4b590 sp 0x7ffef814ad40

READ of size 72 at 0x60d0000023c0 thread T0

#0 0x55a4fea33788 in __asan_memcpy /b/swarming/w/ir/kitchen-workdir/src/third_party/llvm/compiler-rt/lib/asan/a
san_interceptors_memintrinsics.cc:23:3

#1 0x7f4f564790fd in exprCodeBetween third_party/sqlite/amalgamation/sqlite3.c:100476:11

#2 0x7f4f56472410 in sqlite3ExprCodeTarget third_party/sqlite/amalgamation/sqlite3.c:100031:7

#3 0x7f4f56470012 in sqlite3ExprCode third party/sqlite/amalgamation/sqlite3.c:100305:13
```

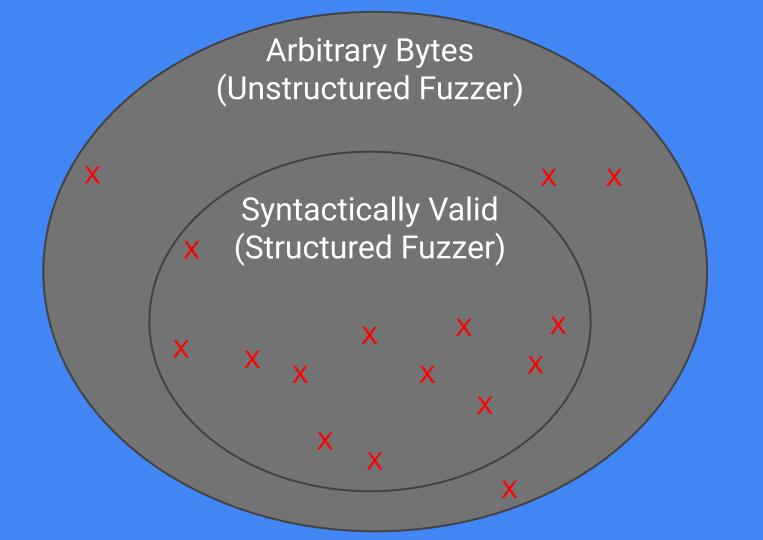
- #4 0x7f4f56460f9c in sqlite3Insert third\_party/sqlite/amalgamation/sqlite3.c:116578:9 #5 0x7f4f56443301 in yy reduce third party/sqlite/amalgamation/sqlite3.c
- #6 0x7f4f5643e209 in sqlite3Parser third party/sqlite/amalgamation/sqlite3.c:150805:15
- #7 0x7f4f5638b257 in sqlite3RunParser third party/sqlite/amalgamation/sqlite3.c:151965:5
- #8 0x7f4f56439d0d in sqlite3Prepare third party/sqlite/amalgamation/sqlite3.c:123386:5
- #9 0x7f4f56389c26 in sqlite3LockAndPrepare third\_party/sqlite/amalgamation/sqlite3.c:123479:10
- #10 0x7f4f56375483 in chrome sqlite3 prepare v2 third party/sqlite/amalgamation/sqlite3.c:123850:8
- #11 0x55a4fea9a689 in sql\_fuzzer::RunSqlQueriesOnConnection(sqlite3\*, std::\_\_1::vector<std::\_\_1::basic\_string<char, std::\_\_1::char\_traits<char>, std::\_\_1::allocator<char> >, std::\_\_1::allocator<std::\_\_1::basic\_string<char, std::\_\_1::char\_traits<char>, std::\_\_1::allocator<char> > >) third party/sqlite/fuzz/sql run queries.cc:73:10
- #12 0x55a4fea9b1fb in sql\_fuzzer::RunSqlQueries(std::\_\_1::vector<std::\_\_1::basic\_string<char, std::\_\_1::char\_traits<char>, std::\_\_1::allocator<char> >, std::\_\_1::allocator<std::\_\_1::basic\_string<char, std::\_\_1::char\_traits<char>, std::\_\_1::allocator<char> > >) third party/sqlite/fuzz/sql run queries.cc:130:3
- #13 0x55a4fea646c9 in TestOneProtoInput(sql\_query\_grammar::SQLQueries const&) third\_party/sqlite/fuzz/sql\_fuzze r.cc:41:3
  - #14 0x55a4fea64043 in LLVMFuzzerTestOneInput third party/sqlite/fuzz/sql fuzzer.cc:28:1
- #15 0x55a4feaaefb5 in fuzzer::Fuzzer::ExecuteCallback(unsigned char const\*, unsigned long) third\_party/libFuzzer/src/FuzzerLoop.cpp:571:15
- #16 0x55a4feaa626c in fuzzer::RunOneTest(fuzzer::Fuzzer\*, char const\*, unsigned long) third\_party/libFuzzer/src/FuzzerDriver.cpp:280:6
- #17 0x55a4feaa892b in fuzzer::FuzzerDriver(int\*, char\*\*\*, int (\*)(unsigned char const\*, unsigned long)) third\_p arty/libFuzzer/src/FuzzerDriver.cpp:713:9
  - #18 0x55a4feab4ca2 in main third party/libFuzzer/src/FuzzerMain.cpp:20:10

# More Bugs: The Data

948944	High	CHECK failure: !address.is_initialized()    sizeof(*data_) == address.BlockSize() in storage_bl Reproducible allpublic Clusterfuzz
946539	High	Heap-buffer-overflow in disk_cache::EntryImpl::UserBuffer::Write Reproducible allpublic Clusterfuzz
946434	High	Heap-use-after-free in base::LinkNode <disk_cache::mementryimpl>::RemoveFromList Reproducible allpublic Clusterfuzz</disk_cache::mementryimpl>
940205	High	Heap-use-after-free in renameTokenCheckAll Reproducible allpublic Clusterfuzz
<u>923675</u>	High	DCHECK failure in candidate->location.lsValid() in modules.cc Reproducible allpublic Clusterfuzz
908196	High	DCHECK failure in !has_error() implies FunctionKind::kArrowFunction == next_arrow_function_kind_ i Reproducible allpublic Clusterfuzz
<u>791256</u>	High	DCHECK failure in kNoSourcePosition != start_position() in scopes.cc Reproducible allpublic Clusterfuzz
<u>787712</u>	High	Use After Free (write) in SkPerlinNoiseShaderImpl allpublic Clustefuzz

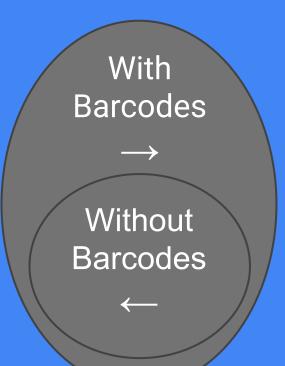
Fuzz Where (you think) the Bugs are





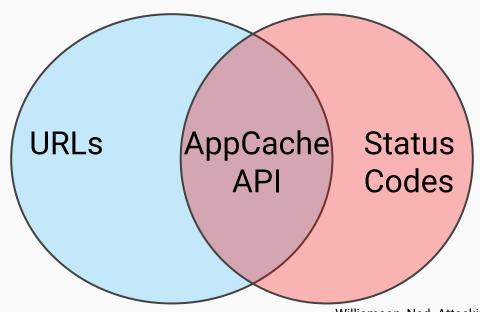
```
for (let i = 0; \underline{i} < \underline{I}nfinity; i++)
doSomethingScary(); // Crash!
              With all Loops
                 Without
              Infinite Loops
for (let i = 0; \underline{i} < 10; i++)
doSomethingScary(); // Crash!
```

<u>cbc_eancode.cpp</u>	0.00% (0/44)
<u>cbc_onecode.cpp</u>	0.00% (0/32)
<u>cbc_pdf417i.cpp</u>	0.00% (0/22)
<u>cbc_qrcode.cpp</u>	0.00% (0/20)
<u>cbc_upca.cpp</u>	0.00% (0/11)



<pre>cbc_eancode.cpp</pre>	93.18% (41/44)
<pre>cbc_onecode.cpp</pre>	71.88% (23/32)
<u>cbc_pdf417i.cpp</u>	100.00% (22/22)
<u>cbc_qrcode.cpp</u>	80.00% (16/20)
cbc_upca.cpp	100.00% (11/11)

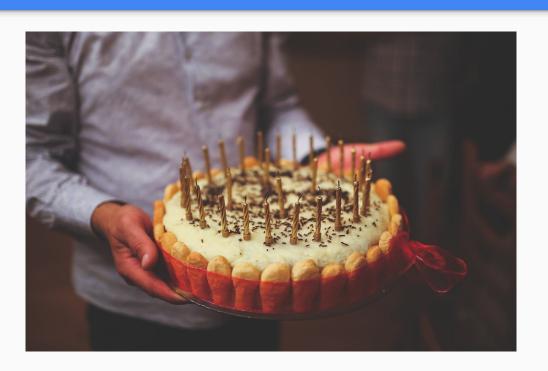
#### Integration Test Style Fuzzing



### Why Structured Fuzzing?

- More bugs
- Fuzzing where the bugs are
- Integration test style fuzzing

## How?



#### **Custom Mutators**

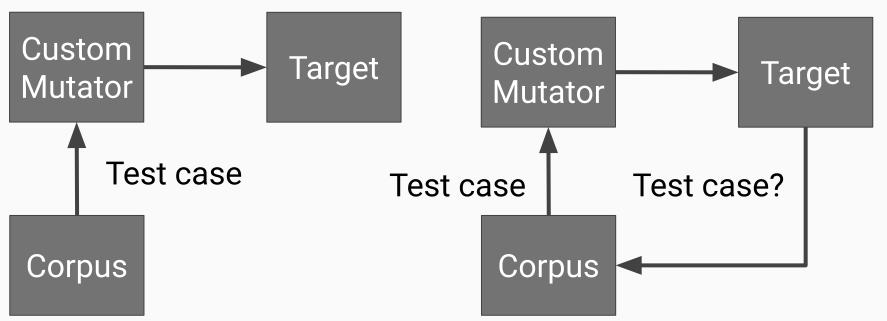
#### Libprotobuf-mutator

```
message AddExpression {
  int32 operand1 = 1;
  int32 oprerand2 = 2;
}
```

```
add_expression {
  operand1: 10
  operand2: 9
}
```

```
std::string ToString(const AddExpression& add_expression) {
   std::string operand1 = std::to_string(add_expression.operand1());
   std::string operand2 = std::to_string(add_expression.operand2());
   return operand1 + " + " + operand2;
}
```

#### Converting to a LibFuzzer Custom Mutator



#### How: Three Options

- Custom mutator
- Libprotobuf-mutator
- Converting to a custom mutator

#### Conclusion

- Find more bugs with structured fuzzing
- Use libprotobuf-mutator or custom mutators

#### Links

- Structure Aware Fuzzing
- <u>Libprotobuf-mutator</u>
- Examples:
  - Appcache fuzzer
  - o Skia fuzzer
  - o SQLite fuzzer