

## Fuzzing Adoption at Facebook

## Agenda

- 1) A walk down memory lane
- 2) Case study: Fuzzing for correctness
- 3) Driving proactive fuzzing usage

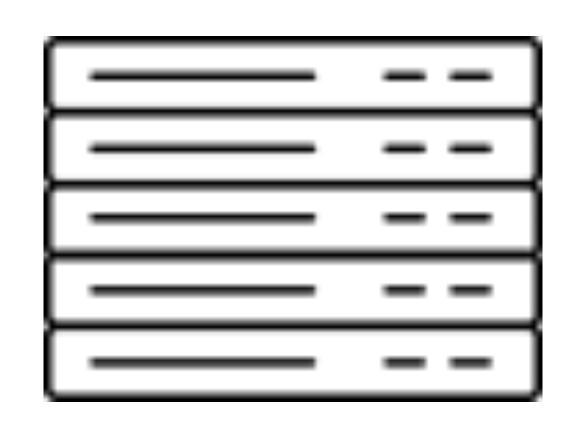
# A walk down memory lane

## Fuzzing at Facebook, circa 2013

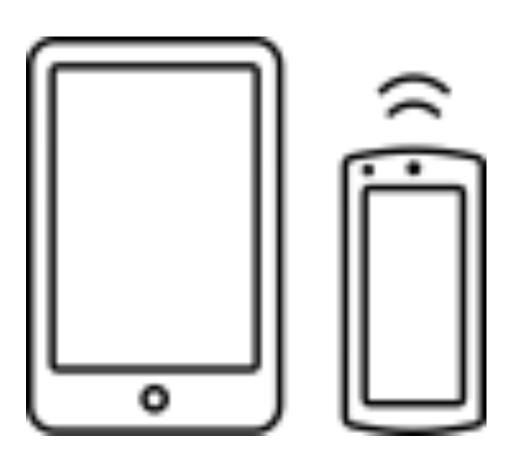


Otto!

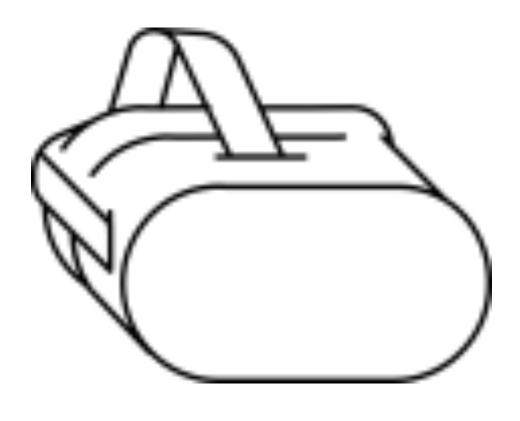
## Native code at Facebook, circa 2018



Backend services



Cross-platform on mobile



Oculus, Portal, ...

## Case Study: Fuzzing for Correctness

#### Fuzzing for correctness

- Folly contains a variety of core library components used extensively at Facebook.
- Tested the JSON parser for correctness
- Tested F14, a memory-efficient hash-table

https://github.com/facebook/folly https://engineering.fb.com/developer-tools/f14/

#### Fuzzing folly::json

```
extern "C" int LLVMFuzzerTestOneInput(const uint8 t* Data, size t Size) {
 try {
   folly::StringPiece sp(reinterpret cast<const char*>(Data), Size);
   folly::parseJson(sp);
  catch (const std::runtime error&) {
  // Throwing is ok.
 return 0;
```

#### Fuzzing folly::json

```
extern "C" int LLVMFuzzerTestOneInput(const uint8 t* Data, size t Size) {
 try {
   FuzzDataProducer producer (Data, Size);
   json::serialization opts opts;
   // Use XOR so that 0 keeps the default setting
   opts.allow non string keys ^= producer.produceBool();
   // 0 means default recursion limit
   opts.recursion limit = 100 - producer.produceUint32Range(0, 100);
   folly::parseJson(producer.remainingBytes(), opts);
  catch (std::runtime error& e) {
   // Throwing is ok.
 return 0;
```

#### Fuzzing F14, a memory-efficient hash-set

- What is an appropriate bug oracle?
  - Differential testing against `std::set`
- What operations do we need to find these bugs?
  - Standard set operations (insert, remove, etc)
- How do we make the fuzzer generate these?
  - Structure aware fuzzing!

#### **Encoding operations**

```
union SetOperation {
 1: InsertKeyMutation insertKeyMutation;
 2: InsertRangeMutation insertRangeMutation;
 3: EraseKeyMutation eraseKeyMutation;
 4: EraseRangeMutation eraseRangeMutation;
 5: ClearMutation clearMutation;
 6: ConstructRangeMutation constructRangeMutation;
 7: ConstructIListMutation constructIListMutation;
 8: LookupCheck lookupCheck;
 9: InvariantCheck invariantCheck;
struct SetOperations {
 1: required list<SetOperation> operations;
```

#### **Encoding operations**

```
struct InsertionKey {
 1: required i32 key;
 2: required bool throwOnCopy;
enum InsertKeyMethod {
 INSERT COPY = 1,
 INSERT MOVE = 2,
 EMPLACE = 3,
struct InsertKeyMutation {
 1: required InsertionKey key;
 2: required InsertKeyMethod method;
 3: optional i32 hint;
```

#### Writing the harness

```
DEFINE THRIFT FUZZER (SetOperations const& input) {
 SetOperationsInterpreter<
     BaseSet,
     F14VectorSet,
     SetOrdering::UNORDERED,
     SetExceptions::EXCEPTIONS>::go(input);
```

#### Executing an operation

```
void run(InsertRangeMutation const& op) {
  auto keys = FuzzKey::keys(op.keys, Exceptions);
  bool threw = false;
  try {
   base.insert(keys.begin(), keys.end());
   catch (FuzzException const&) {
    threw = true;
  try {
    test.insert(keys.begin(), keys.end());
   catch (FuzzException const&) {
    threw = true;
  if (threw) {
   base.clear();
    test.clear();
  CHECK EQ(base.size(), test.size());
```

#### **Customizing mutations**

```
mutator::Settings MutatorSettings() {
 mutator::Settings settings;
 // We aren't fuzzing the enums, we need them to be valid.
 settings.pInvalidEnum = 0;
 // Keep offset and size in reasonable ranges
 settings.setNumericRange(".operations.eraseRangeMutation.offset", 0, 1000);
 settings.setNumericRange(".operations.eraseRangeMutation.size", 0, 1000);
 // Don't throw too often
 settings.setPTrue(".operations.insertKeyMutation.key.throwOnCopy", 0.1);
 settings.setPTrue(".operations.insertRangeMutation.keys.throwOnCopy", 0.01);
 // Keep the keys in [0, 255] to promote collisions
 settings.setNumericRange(0, 255);
 return settings;
```

### Does this actually find bugs?

- F14:
  - o [folly][F14] Fix memory leak when exception is thrown
  - [folly] Improve sorted\_vector\_types standard compliance
  - [folly] Remove unnecessary copy in sorted\_vector\_types
     insert with hint
- JSON:
  - [folly] Remove unnecessary copies in dynamic::hash()
  - reduce key comparisons in map and set operator==
    - https://gcc.gnu.org/bugzilla/show\_bug.cgi?id=91263
    - https://bugs.llvm.org/show\_bug.cgi?id=42761

#### Hashing a folly::dynamic

```
std::size t dynamic::hash() const {
 switch (type()) {
   case NULLT:
     return 0xBAAAAAD;
   case OBJECT: {
     auto h = std::hash<std::pair<dynamic, dynamic>>{};
     return std::accumulate(
         items().begin(),
         items().end(),
         size t{0x0B1EC7},
         [&] (auto acc, auto item) { return acc + h(item); });
   case ARRAY:
     return folly::hash::hash_range(begin(), end());
   case INT64:
     return std::hash<int64_t>() (getInt());
   case DOUBLE:
     return std::hash<double>() (getDouble());
   case BOOL:
     return std::hash<bool>() (getBool());
   case STRING:
     // keep consistent with detail::DynamicHasher
     return Hash()(getString());
 assume unreachable();
```

### Hashing a folly::dynamic

```
case OBJECT:
 auto h = std::hash<std::pair<dynamic, dynamic>>{};
 return std::accumulate(
      items().begin(),
      items().end(),
      size t{0x0B1EC7},
      [&] (auto acc, auto item) {
         return acc + h(item);
```

### Implicit copies are evil

```
case OBJECT:
 auto h = std::hash<std::pair<dynamic, dynamic>>{};
 return std::accumulate(
     items().begin(),
     items().end(),
      size t{0x0B1EC7},
      [&] (auto acc, auto const& item) {
         return acc + h(item);
```

### Implicit conversions can result in implicit copies

```
case OBJECT:
 auto h = std::hash<std::pair<dynamic const, dynamic>>{};
 return std::accumulate(
      items().begin(),
      items().end(),
      size t{0x0B1EC7},
      [&] (auto acc, auto const& item) {
         return acc + h(item);
```

#### Net result

- "I counted dynamic::destroy() calls in the fuzzer before this fix and there were 2120497 calls, now there are only 8633 calls, which is 245x less calls."
- "Please apply this fuzzing magic to as much code as you can!"

#### Recap

- Team came to us at the right time
- "early enough" in the development cycle
- Adapted fuzzing to align with team's goals
- Found (non-trivial) bugs



#### Lesson #1: Integrate into people's standard workflows

- Building harnesses is surprisingly hard
  - Mono-repos + a standard build environment make this easier
  - Simplify it: build\_harness.sh \$HARNESS\_NAME
- Bug reports need to be clear and actionable
  - Simplify reproduction: reproduce\_crash.sh \$BUG\_ID
  - Simplify debugging: debug\_crash.sh \$BUG\_ID

#### Lesson #2: Focus on self-service

- "Fuzzing has a low/zero false positive rate"\*
  - \*: If you have the same entry point as production
- Code owners will always write better harnesses than you
- If it's not documented, it might as well not exist
  - It should be simple enough to not need documentation

#### Lesson #3: Focus on a few power users first

- Iterate very quickly to keep momentum high
  - or, How to stop worrying and love CI/CD
- Turn them into advocates
- Where do you find power users?

#### Lesson #4: Engage (application|product) security engineers

- Find code which needs fuzzing
- Write fuzzable code
- Go over all the active bugs, triage for security impact
- Find false negatives

# Recap

#### **Facebook Product Security**

#### Defense in Depth

Keeping Facebook safe requires a multi-layered approach to security Secure frameworks Security experts write libraries of code and new programming languages to prevent or remove entire classes of bugs Automated testing tools Analysis tools scan new and existing code for potential issues Peer & design reviews Human reviewers inspect code changes and provide feedback to engineers Red team exercises Internal security experts stage attacks to surface any points of vulnerability Bug bounty program Outside researchers are incentivized to find and report security flaws This layered approach greatly reduces the number of bugs live on the platform

#### What's next?



# Thank you!