#### **FuzzChick**

Beck, Calvin Huang, Jiani Li, Yishuai

December 5, 2018

# FuzzChick!

# FuzzChick!

What is FuzzChick...? [fuzzchick]

# FuzzChick!

What is FuzzChick...? [fuzzchick]

FuzzChick is an experiment to improve QuickChick using ideas from fuzzing. This combines QuickChick with AFL [3].

# FuzzChick!

What is FuzzChick...? [fuzzchick]

FuzzChick is an experiment to improve QuickChick using ideas from fuzzing. This combines QuickChick with AFL [3].

# We'll come back to this...

#### QuickChick: A Brief Review

QuickChick is a properties based testing framework for Coq.

- You build (or derive) generators for data types.
- Using those generators you can feed data into test cases.
- These test cases can be any arbitrary predicate.

#### QuickChick: Pros and Cons

So what's great about QuickChick?

- Relatively easy to build / derive generators.
- Can generate lots of tests for specific properties automatically.

#### QuickChick: Pros and Cons

So what's great about QuickChick?

- Relatively easy to build / derive generators.
- Can generate lots of tests for specific properties automatically.

What's not so great about QuickChick?

#### QuickChick: Pros and Cons

So what's great about QuickChick?

- Relatively easy to build / derive generators.
- Can generate lots of tests for specific properties automatically.

What's not so great about QuickChick?

Getting good generators can be hard!

## What makes a good generator?

The basic idea of what makes a generator "good" can vary somewhat based on the context.

## What makes a good generator?

The basic idea of what makes a generator "good" can vary somewhat based on the context.

In general you want good coverage. How can you achieve that with minimal work?

## Finally, FuzzChick!

FuzzChick uses AFL to make the choices between constructors for building data types for tests.

## Finally, FuzzChick!

FuzzChick uses AFL to make the choices between constructors for building data types for tests.

Why is this good?

#### FuzzChick Intuition

AFL uses DSE to attempt to get good coverage while fuzzing...

#### FuzzChick Intuition

AFL uses DSE to attempt to get good coverage while fuzzing... Maybe we can utilize AFL's smarts to achieve better test coverage.

# QuickChick: Now With Coverage!

We instrumented QuickChick using bisect\_ppx to get coverage estimates!

## QuickChick: Now With Coverage!

We instrumented QuickChick using bisect\_ppx to get coverage estimates!

This mostly went smoothly...

Compiling with absolute paths cause an infinite loop #180

**Chobbes** opened this issue 2 days ago ⋅ 7 comments

## QuickChick: Now With Coverage!

We instrumented QuickChick using bisect\_ppx to get coverage estimates!

This *mostly* went smoothly...

Compiling with absolute paths cause an infinite loop #180

(F) Closed Chobbes opened this issue 2 days ago · 7 comments

Maintainer fixed this issue promptly, which was awesome!

QuickChick with coverage is cool, but it still does need some polish.

QuickChick with coverage is cool, but it still does need some polish.

Includes a lot of excessive extracted Coq code.

QuickChick with coverage is cool, but it still does need some polish.

- Includes a lot of excessive extracted Coq code.
  - ► Like... All of QuickChick :(.
  - ► So, the percentages are a little off.

QuickChick with coverage is cool, but it still does need some polish.

- Includes a lot of excessive extracted Coq code.
  - ► Like... All of QuickChick :(.
  - ▶ So, the percentages are a little off.
- QuickChick generates "random" files for each test, and the names aren't all that useful
  - Modified QuickChick to include test case in name, but still not ideal.

QuickChick with coverage is cool, but it still does need some polish.

- Includes a lot of excessive extracted Coq code.
  - ► Like... All of QuickChick :(.
  - ▶ So, the percentages are a little off.
- QuickChick generates "random" files for each test, and the names aren't all that useful
  - Modified QuickChick to include test case in name, but still not ideal.

But...

QuickChick with coverage is cool, but it still does need some polish.

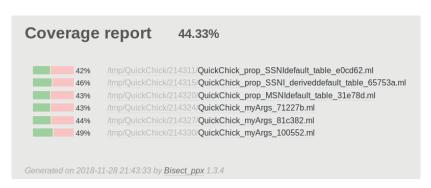
- Includes a lot of excessive extracted Coq code.
  - ► Like... All of QuickChick :(.
  - ▶ So, the percentages are a little off.
- QuickChick generates "random" files for each test, and the names aren't all that useful
  - Modified QuickChick to include test case in name, but still not ideal.

But...

# It works! We can measure stuff!

## QuickChick Coverage: ifc-basic

#### Coverage with QuickChick in the ifc-basic example:



### QuickChick vs FuzzChick: ifc-basic

#### QuickChick:

42% /tmp/QuickChick/214311/QuickChick\_prop\_SSNldefault\_table\_e0cd62.ml

#### QuickChick vs FuzzChick: ifc-basic

#### QuickChick:

42% /tmp/QuickChick/214311/QuickChick\_prop\_SSNldefault\_table\_e0cd62.ml

#### FuzzChick:

39% /tmp/QuickChick/225637/QuickChick\_prop\_SSNldefault\_table\_732ea6.ml

For some reason it seems that FuzzChick actually gets worse coverage than QuickChick on this test case... At least in the time I let it run (I'm not terribly patient)

- Just need to let it run longer?
  - ► AFL needs a while to "warm up"?

- Just need to let it run longer?
  - ▶ AFL needs a while to "warm up"?
- QuickChick test already managed to get good coverage in this instance, so fuzzing doesn't give us much on top of it?
  - ▶ Hard to tell what "good coverage" is due to the extraneous code extracted by QuickChick.

- Just need to let it run longer?
  - ▶ AFL needs a while to "warm up"?
- QuickChick test already managed to get good coverage in this instance, so fuzzing doesn't give us much on top of it?
  - ▶ Hard to tell what "good coverage" is due to the extraneous code extracted by QuickChick.
- Something's not instrumented correctly?

- Just need to let it run longer?
  - ▶ AFL needs a while to "warm up"?
- QuickChick test already managed to get good coverage in this instance, so fuzzing doesn't give us much on top of it?
  - ▶ Hard to tell what "good coverage" is due to the extraneous code extracted by QuickChick.
- Something's not instrumented correctly?
- This test case, for whatever reason, is fuzzer unfriendly?
  - ▶ Maybe extracted Coq could be fuzzer unfriendly? Lots of inefficient data types like like nat (basically a linked list whose length represents a number).
  - Could result in excessively long paths and hard to solve predicates for DSE?
  - Not sure that having pointers everywhere would be AFL's strength...

## Some Further Coverage Testing...

#### Test case:

```
Extract Constant unlikely_branch =>
" fun i ->
 if (0 < i)
  then if (i mod 100 == 0)
       then if (i mod 1000 == 0)
            then if (i mod 10000 == 0)
                 then if (i \mod 100000 == 0)
                       then if (i \mod 1000000 == 0)
                            then if (i < 1000001)
                                 then 42
                                 else 0
                            else 0
                       else 0
                 else 0
            else 0
       else O
  else 0
Definition always_zero := forAll (choose (0%Z, 9999999%Z)) (fun n =>
     unlikely_branch n =? 0).
```

## Some Further Coverage Testing...

#### Test case:

```
Extract Constant unlikely_branch =>
" fun i ->
 if (0 < i)
 then if (i mod 100 == 0)
       then if (i mod 1000 == 0)
            then if (i mod 10000 == 0)
                 then if (i mod 100000 == 0)
                       then if (i \mod 1000000 == 0)
                            then if (i < 1000001)
                                 then 42
                                 else 0
                            else O
                      else 0
                 else 0
            else 0
       else O
 else 0
Definition always_zero := forAll (choose (0%Z, 9999999%Z)) (fun n =>
     unlikely_branch n =? 0).
```

Trying to give AFL a good chance to find the failing branch...

#### Results

In the equivalent C code AFL does quite well...

#### Results

In the equivalent C code AFL does quite well...

#### QuickChick:

```
then if (i mod 1000000 == 0) then if (i < 1000001)
```

#### FuzzChick:

```
then if (i mod 10000 == 0) then if (i mod 100000 == 0) then if (i mod 1
```

#### Results

In the equivalent C code AFL does quite well...

### QuickChick:

```
then if (i mod 1000000 == 0) then if (i < 1000001)
```

#### FuzzChick:

```
then if (i mod 10000 == 0) then if (i mod 100000 == 0) then if (i mod 1
```

Here not so much? FuzzChick doesn't make it as far...

#### Results

In the equivalent C code AFL does quite well...

### QuickChick:

```
then if (i mod 1000000 == 0) then if (i < 1000001)
```

#### FuzzChick:

```
then if (i mod 10000 == 0) then if (i mod 100000 == 0) then if (i mod 1
```

Here not so much? FuzzChick doesn't make it as far...

Well, in fairness, it does eventually, but it takes a good 30 minutes. QuickChick was much faster.

### Results

In the equivalent C code AFL does quite well...

### QuickChick:

```
then if (1 mod 1888888 == 8) then if (1 < 1888881)
```

#### FuzzChick:

```
then if (i mod 10000 == 0) then if (i mod 100000 == 0) then if (i mod 1
```

Here not so much? FuzzChick doesn't make it as far...

Well, in fairness, it does eventually, but it takes a good 30 minutes. QuickChick was much faster.

Suggests maybe the extracted OCaml is harder for AFL to analyze? The C branches were discovered very quickly by AFL.

### Performance

- Fuzzing is an order of magnitude slower than random testing.
- Performance bottleneck: disk access.
- Experiments to see whether the instrumentation overhead is worth it are still in preliminary stages.

How do QuickChick and FuzzChick perform on a large scale project?

How do QuickChick and FuzzChick perform on a large scale project?

And unfortunately they performed not so well...

Setting up the experiment:

$$\mathsf{Coq} \xrightarrow{???} \mathsf{C} (\mathsf{Apache})$$

Setting up the experiment:

$$\mathsf{Coq} \xrightarrow{???} \mathsf{C} \; (\mathsf{Apache})$$

$$\mathsf{Coq} \xrightarrow{\mathit{Extract}} \mathsf{Ocaml} \xrightarrow{\mathit{Unixcall}} \mathsf{C} \; (\mathsf{Apache})$$

### Target:

I want the fuzzers to help me capture what is a string that will make the patched Apache run successfully (exit with 0).

#### **Quickchick:**

- **Pros:** Quickchick runs pretty fast at generating test cases.
- Cons: Quickchick fails to capture the successful case I want when we generate 10000 random strings. (That sounds natural I guess).

#### FuzzChick:

- Pros: FuzzChick runs AFL and AFL does not generate random string, but it can cheat on having some test script that people wrote.
- Cons: It runs pretty slowly (1.2s per test case). Maybe the string it comes up with is meaningful to the server.

What if we specify a richer spec to Coq?

What if we specify a richer spec to Coq?

Instead of getting the label that whether the Apache exit normally or not, we tried to obtain the stdout string from Apache to Coq.

What if we specify a richer spec to Coq?

Instead of getting the label that whether the Apache exit normally or not, we tried to obtain the stdout string from Apache to Coq.

It's too messy to specify in the OCaml library that the extracted OCaml function is using. We cannot compile the program. :(

What if we specify a richer spec to Coq?

Instead of getting the label that whether the Apache exit normally or not, we tried to obtain the stdout string from Apache to Coq.

It's too messy to specify in the OCaml library that the extracted OCaml function is using. We cannot compile the program. :(

Aborted.

### Takeaway:

It is not yet very practical to fuzz large real world project with Coq and OCaml.

### Honourable Mentions: Some Other Stuff We Did

- Honggfuzz!
- Plain AFL!

Conclusion! Questions?

Whew! Questions?

### References

- Calvin Beck, Jiani Huang, and Yishuai Li. Quick700. 2018. URL: https://github.com/Quick700/Quick700 (visited on 11/29/2018).
- Leonidas Lampropoulos, Zoe Paraskevopoulou, and Benjamin C Pierce. "Generating Good Generators for Inductive Relations". In: ().
- Michal Zalewski. AFL. URL: http://lcamtuf.coredump.cx/afl/ (visited on 11/29/2018).

These are all good resources! You should look at them!