# **Kex in 2021: Ups and Downs**

Azat Abdullin December 13, 2021

#### Kex

- · white box fuzzer for JVM bytecode
- based on symbolic execution
- test generation for Java and Kotlin

### What happened in 2021

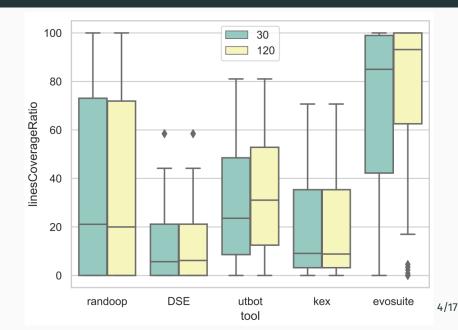
- 1. Participation in SBST Java tool competition 2021<sup>1</sup>
- 2. Work towards better Java standard library support
- 3. Reanimator evaluation

<sup>&</sup>lt;sup>1</sup>Panichella S. et al. Sbst tool competition 2021 //2021 IEEE/ACM 14th International Workshop on Search-Based Software Testing (SBST). – IEEE, 2021. – C. 20-27.

#### **SBST 2021**

- · Automatic test case generation competition
- evaluation on 6 projects with 98 benchmarks
- each tool evaluated on 30 and 120 second time budgets

### **SBST 2021 results**



### SBST 2021: Kex results<sup>2</sup>

- · Kex was ranked fifth with score of 44.21
- Kex achieved any coverage only on one project
  - average coverage of ~20%
- Kex failed on 5 out of 6 projects
  - · 1 project failed because of unhandled ASM error
  - 2 projects failed because Kfg encoutered some unexpected bytecode
  - 2 projects failed because Kex required too much RAM
- Kex (and Reanimator) failed on some of the more complex language features (abstract classes, inner classes, etc.)
- · Kex required too much of disk space

#### Main teakeaway: Kex had a low level of maturity

<sup>&</sup>lt;sup>2</sup>Abdullin A., Akhin M., Belyaev M. Kex at the 2021 SBST Tool Competition //2021 IEEE/ACM 14th International Workshop on Search-Based Software <sub>5/17</sub> Testing (SBST). – IEEE, 2021. – C. 32-33.

## SBST 2021: implications

- Kfg and Kex were optimized w.r.t. RAM usage:
  - Kfg currently uses ~2 times less RAM
  - · Kex uses only one copy of each classes of PUT
- Kex and Reanimator were extended to support some new language features
- applied for SBST 2022 Java tool competition

	30s	<b>120s</b>
line coverage	21.70%	25.29%
branch coverage	14.69%	17.95%



### Java standard library support

- · Java standard library is used almost everywhere
- despite having access to standard library sources, Kex struggles to simulate it
- many of the standard library methods and classes can be approximated in SMT

# Intrinsics library<sup>3</sup>

#### Intrinsics for basic operations and checks:

- assertions and assumes
- unknown values with no constraints
- · array operations:
  - contains checks
  - · array generation methods
- etc.

<sup>&</sup>lt;sup>3</sup>https://github.com/vorpal-research/kex-intrinsics

### kex-rt4

#### Proof-of-concept implementation:

- · wrappers for primitive types
- · string builders
- some collections (all based on ArrayList approximation)
- utility methods from Arrays and System classes

Kex substitutes all Java runtime operations with kex-rt analogs if they are available

<sup>4</sup>https://github.com/AbdullinAM/kex-rt

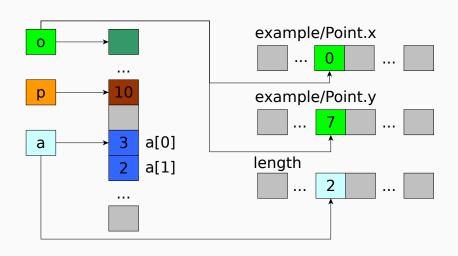
### Exmaple of ArrayList::add method

```
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public void add(int index, E element) {
  AssertIntrinsics.kexNotNull(elementData);
  int oldLength = elementData.length;
  elementData = CollectionIntrinsics.generateObjectArray(
    oldLength + 1,
    i -> {
      if (i < index) return elementData[i];</pre>
      else if (i == index) return null;
      else return elementData[i - 1];
  }):
  elementData[index] = element;
```

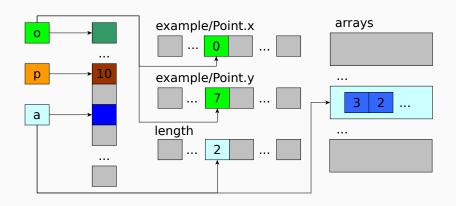
## **SMT support of intrinsics**

- arrays are now represented as SMT arrays
- $\exists$  and  $\forall$  quantors for array operations
- $\lambda$  expressions for array generation
- experimented with SMT string theory (unsuccessfully)

# **SMT support of intrinsics**



# **SMT support of intrinsics**



## Java standard library support: takeaways

- · prototype implementation
  - · limited in expressivness
  - limited number of supported classes
- no thorough evaluation



## Reanimator

#### **Contact information**

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