

# Generating Tests by Example

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# Parametric unit tests(PUT)

- Symbolically executed or instantiated
- Instantiated
  - Based on whitebox knowledge of the program
  - Value generator, usually hand-crafted by an expert, which generates appropriate values on demand(Property based test)

# Property based test(PBT)

- Property: input
- Generalizes existing unit testing by finding tests with a similar structure
- Use an abstract domain
- Over-approximation for the positive examples, while excluding negative examples

# Challenges

- Identify which tests should be generalized together to obtain parametric tests
- Generalize matching tests to find an over-approximation that represents all positive examples but none of the negative ones

# Our approach

- We define a partial order on the set of tests, that captures the generality of the test data
- This order allows our technique to use the same unit test as an example for several different PBTs.

# Definitions

**Definition 1 (Parameter mapping).** *A parameter mapping for a parameterized test is a function  $f$  that maps every parameter  $x$  to a constant  $c = f(x)$  s.t.  $\text{type}(x) = \text{type}(c)$ . Additionally,  $f$  maps a new variable  $\text{res}$  to  $\{+, -\}$ .*

**Definition 2 (Scenario).** *A scenario  $S$  is a set of parameterized tests which execute the same sequence of statements, differing only by their parameters. The code of a scenario  $S$ , is the sequence of statements mutual to all parameterized tests in  $S$ , after discarding parameter information. We say that a parameterized test  $pt$  belongs to a scenario  $S$  if the code of  $S$  is obtained by discarding  $pt$ 's parameter information.*

# Definitions

**Definition 3 (Sequence of parameters).** *Given a parameterized test  $pt$ , let  $params(pt)$  be the sequence of parameters across all statements in the parameterized test  $pt$  (with repetitions).*

This notion is needed so that we may compare two parameterized tests in the same scenario with a different number of parameters or with equality constraints in different places in the test trace. E.g., for  $pt = \text{foo}(x,y);\text{assert}(\text{bar}(x,z))$ ; we have  $params(pt) = x \cdot y \cdot x \cdot z$ .

**Definition 4 (generality of parameterized tests,  $\sqsubseteq$ ).** *For two parameterized tests  $pt_1, pt_2$  with  $params(pt_k) = x_1^k \cdots x_n^k$  for  $k \in \{1, 2\}$ , both belonging to the same scenario  $S$ , we say that  $pt_1 \sqsubseteq pt_2$  if  $\forall i, j \in \{1 \dots n\}$ :*

1.  $type(x_i^1) \sqsubseteq type(x_i^2)$  (we use the standard notion of this relation, e.g.  $int \sqsubseteq double$ ,  $String \sqsubseteq Object$ .)
2.  $name(x_i^2) = name(x_j^2) \Rightarrow name(x_i^1) = name(x_j^1)$

# Examples

- `pt1 = int prev = x.size(); x.add(y); assert(x.size() == prev + 1)`
- `type(x) = List<String>` and `type(y) = String`
- `pt2: type(x) = ArrayList<String>`
- `pt3: type(x) = Set<String>`
- `params(pt1) = params(pt2) = params(pt3) = x · x · y · x`      $pt_2 \sqsubseteq pt_1$



# Abstracting the data

- Abstraction candidates

**Definition 5 (Abstraction candidates).** *Let  $T \subseteq S$  be the set of parameterized tests in a scenario  $S$  such that for every  $pt \in T$ ,  $\neg \exists pt' \in S. pt \sqsubseteq pt' \wedge pt \neq pt'$ . We define the abstraction candidates for  $S$  to be the sets of parameter mappings  $AC_S = \{\{f \in pt' \mid pt' \sqsubseteq pt\} \mid pt \in T\}$ . When performing abstraction, each  $s \in AC_S$  will be abstracted on its own.*

# Examples

```
1 Assert.assertTrue(Precision.equals(153.0000, 153.0000, .0625));  
2 Assert.assertTrue(Precision.equals(153.0000, 153.0625, .0625));  
3 Assert.assertTrue(Precision.equals(152.9375, 153.0000, .0625));  
4 Assert.assertFalse(Precision.equals(153.0000, 153.0625, .0624));  
5 Assert.assertFalse(Precision.equals(152.9374, 153.0000, .0625));
```

**Fig. 1.** Several unit tests from the test suite of the Apache commons-math project, using the JUnit testing framework.

$$C^+ = \{(153.0, 153.0, .0625), (153.0, 153.0625, .0625), (152.9375, 153.0, .0625)\},$$
$$C^- = \{(153.0, 153.0625, .0624), (152.9374, 153.0, .0625)\}.$$

# Examples

- Compute the SG(Safe Generalization)

$$\begin{aligned} C^+ &= \{f \in a \mid f(res) = +\} & C^- &= \{f \in a \mid f(res) = -\} \\ C_{cex}^+ &= \bigcup_{b \in AC_s} \{f \in b \mid f(res) = -\} & C_{cex}^- &= \bigcup_{b \in AC_s} \{f \in b \mid f(res) = +\} \end{aligned}$$

# Examples

```
1  val gen_double_1_pos = for(  
2    y <- Arbitrary.arbitrary[Double].map(Math.abs);  
3    x <- Arbitrary.arbitrary[Double];  
4    z <- Gen.choose[Double](x - y, x + y)  
5  ) yield (x,y,z)  
6  forAll (gen_double_1_pos) {_ match {  
7    case (d1: Double,d3: Double,d2: Double) =>  
8      Precision.equals(d1, d2, d3)  
9  }}  
10 val gen_double_1_neg = for(  
11   y <- Arbitrary.arbitrary[Double].map(Math.abs);  
12   x <- Arbitrary.arbitrary[Double];  
13   z <- Gen.oneOf(  
14     Gen.choose[Double](Double.MinValue,x - y).suchThat(_ < x - y),  
15     Gen.choose[Double](x + y,Double.MaxValue).suchThat(_ > x + y))  
16 ) yield (x,y,z)  
17 forAll (gen_double_1_neg) {_ match {  
18   case (d1: Double,d3: Double,d2: Double) =>  
19     !(Precision.equals(d1, d2, d3))  
20  
21 }}
```