

# On Test Repair Using Symbolic Execution

Brett Daniel  
Darko Marinov

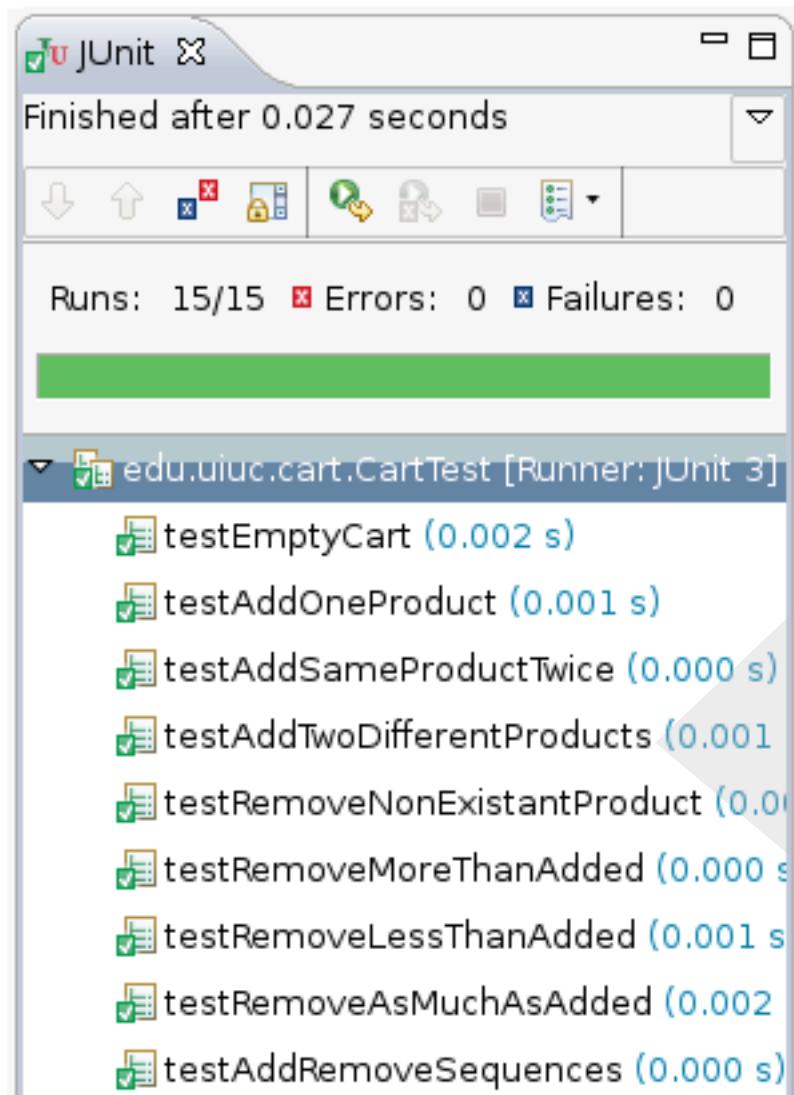


Tihomir Gvero



ISSTA 2010: International Symposium on Software Testing and Analysis  
July 15, 2010  
Trento, Italy

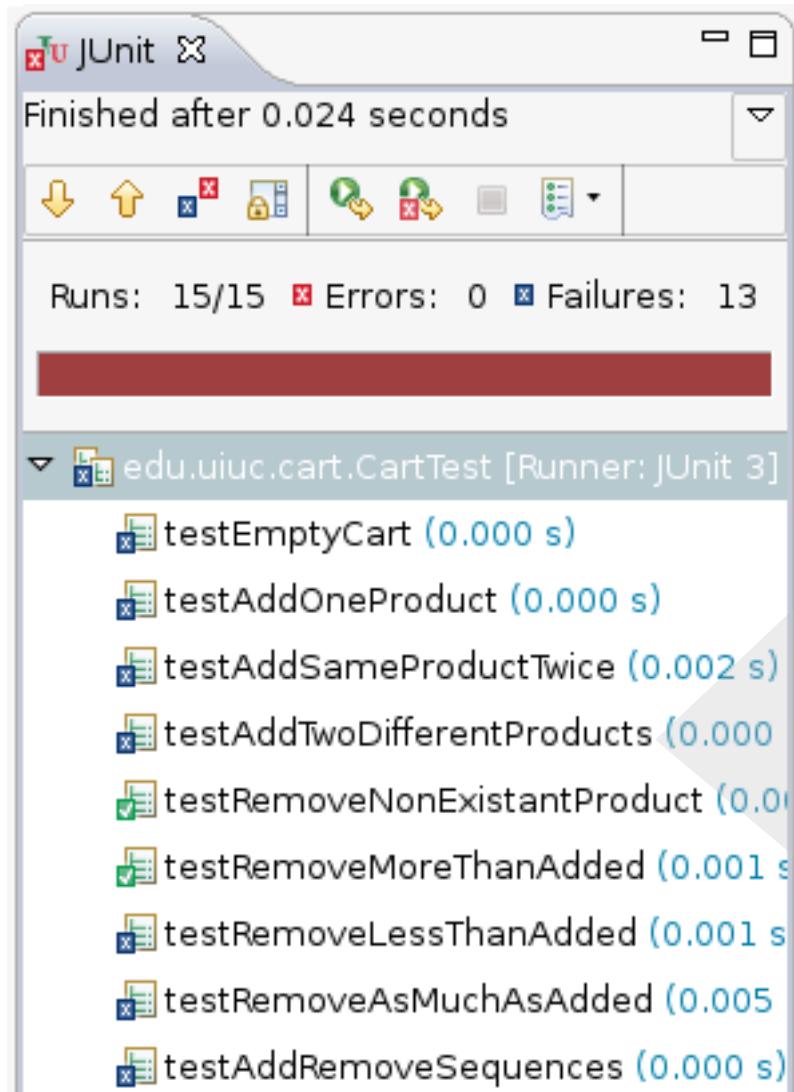
# Passing Unit Tests



```
public class Cart {  
    ...  
    public double getTotalPrice() {...}  
    public String getPrintedBill() {...}  
    ...  
}
```

```
public void testAddTwoDifferentProducts() {  
    Cart cart = ...  
    assertEquals(3.0, cart.getTotalPrice());  
    assertEquals(  
        "Discount: -$3.00, Total: $3.00",  
        cart.getPrintedBill());  
}
```

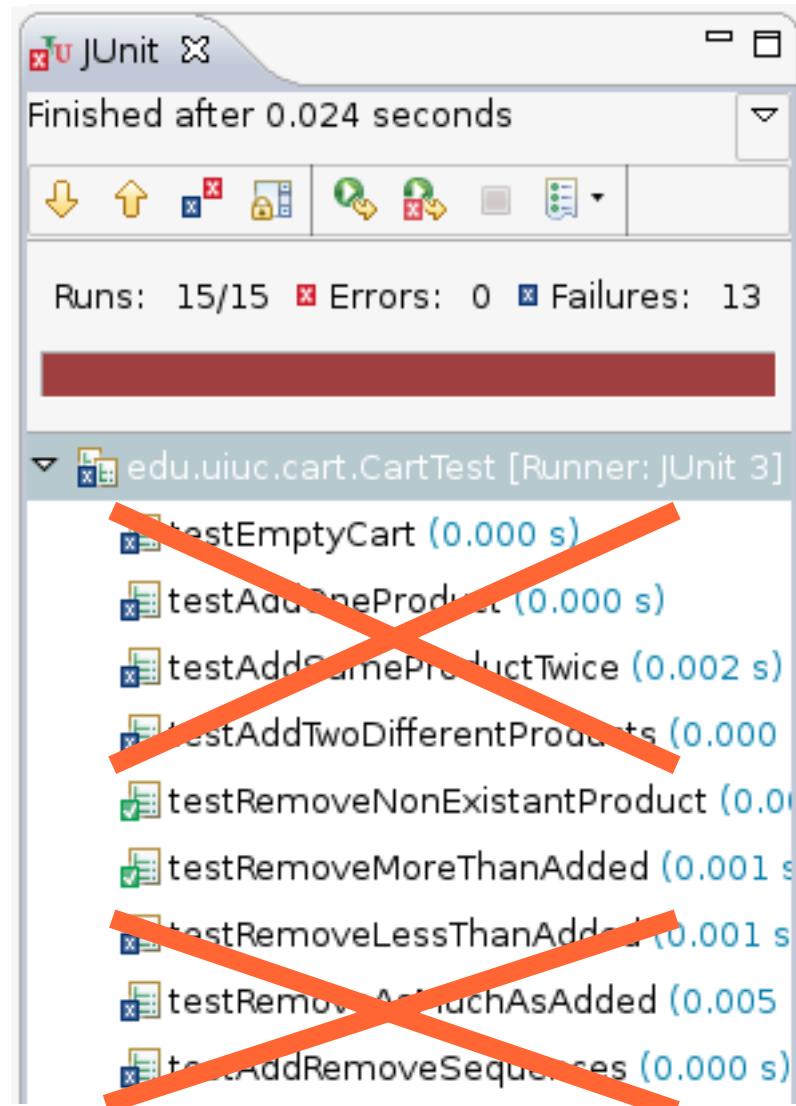
# Requirements Change



```
public class Cart {  
    ...  
    public double getTotalPrice() {...}  
    public String getPrintedBill() {...}  
    ...  
}
```

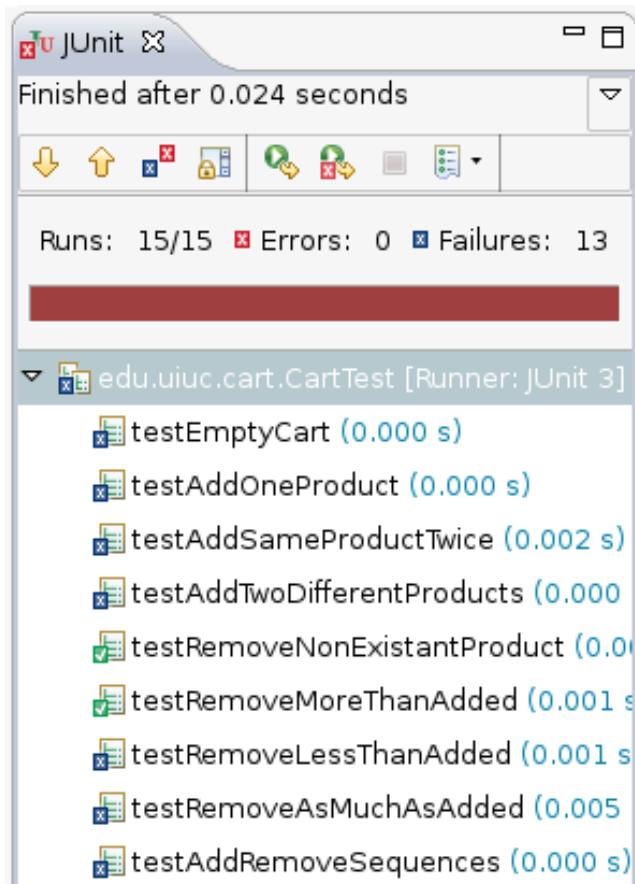
```
public void testAddTwoDifferentProducts() {  
    Cart cart = ...  
    assertEquals(3.0, cart.getTotalPrice());  
    assertEquals(  
        "Discount: -$3.00, Total: $3.00",  
        cart.getPrintedBill());  
}
```

# Delete Broken Tests?



But that reduces  
the quality of the  
test suite

# Repairing Tests is Preferable



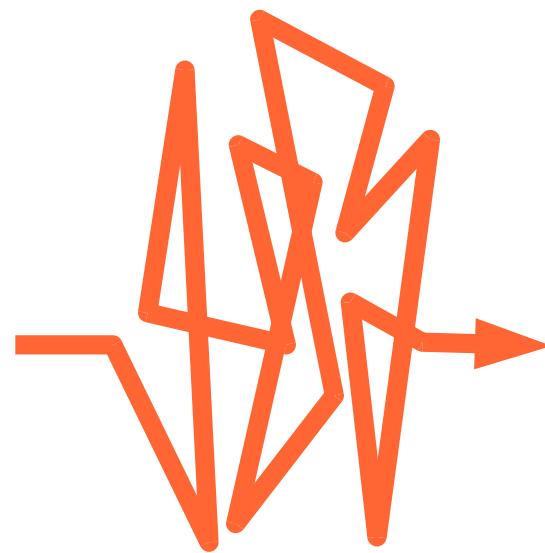
JUnit

Finished after 0.024 seconds

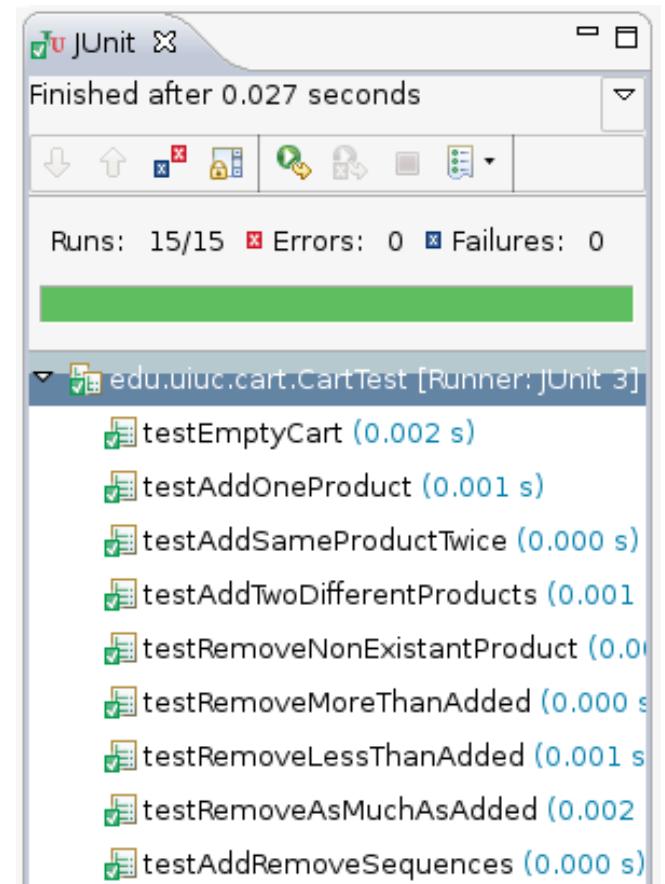
Runs: 15/15 Errors: 0 Failures: 13

edu.uiuc.cart.CartTest [Runner: JUnit 3]

- testEmptyCart (0.000 s)
- testAddOneProduct (0.000 s)
- testAddSameProductTwice (0.002 s)
- testAddTwoDifferentProducts (0.000 s)
- testRemoveNonExistantProduct (0.000 s)
- testRemoveMoreThanAdded (0.001 s)
- testRemoveLessThanAdded (0.001 s)
- testRemoveAsMuchAsAdded (0.005 s)
- testAddRemoveSequences (0.000 s)



But that requires  
a lot of time  
and effort



JUnit

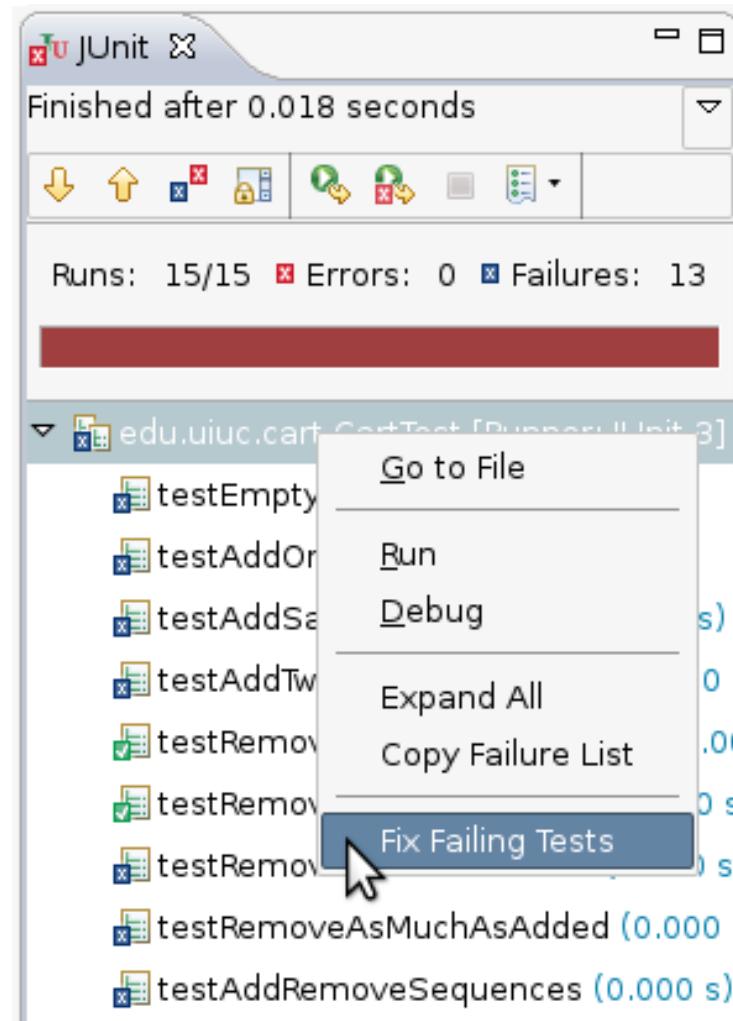
Finished after 0.027 seconds

Runs: 15/15 Errors: 0 Failures: 0

edu.uiuc.cart.CartTest [Runner: JUnit 3]

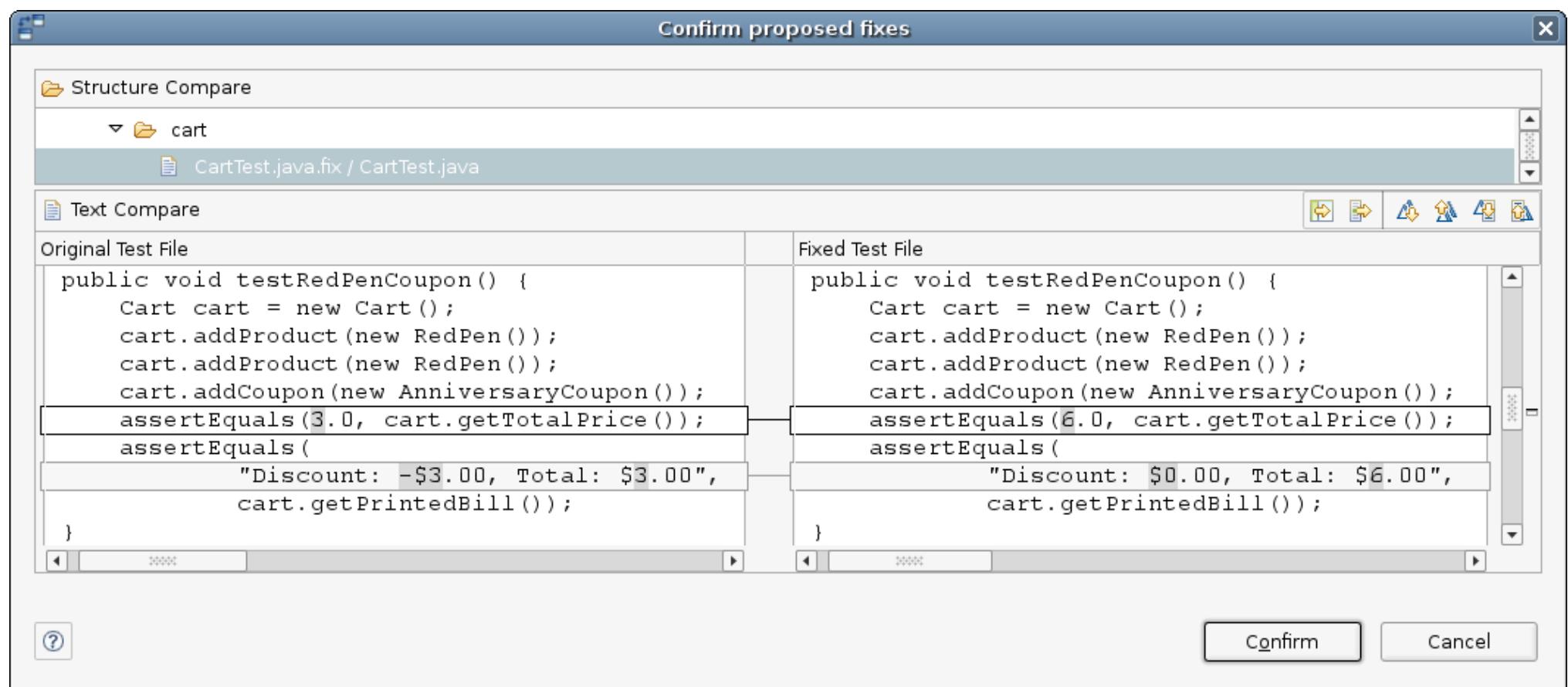
- testEmptyCart (0.002 s)
- testAddOneProduct (0.001 s)
- testAddSameProductTwice (0.000 s)
- testAddTwoDifferentProducts (0.001 s)
- testRemoveNonExistantProduct (0.000 s)
- testRemoveMoreThanAdded (0.000 s)
- testRemoveLessThanAdded (0.001 s)
- testRemoveAsMuchAsAdded (0.002 s)
- testAddRemoveSequences (0.000 s)

# ReAssert Suggests Repairs

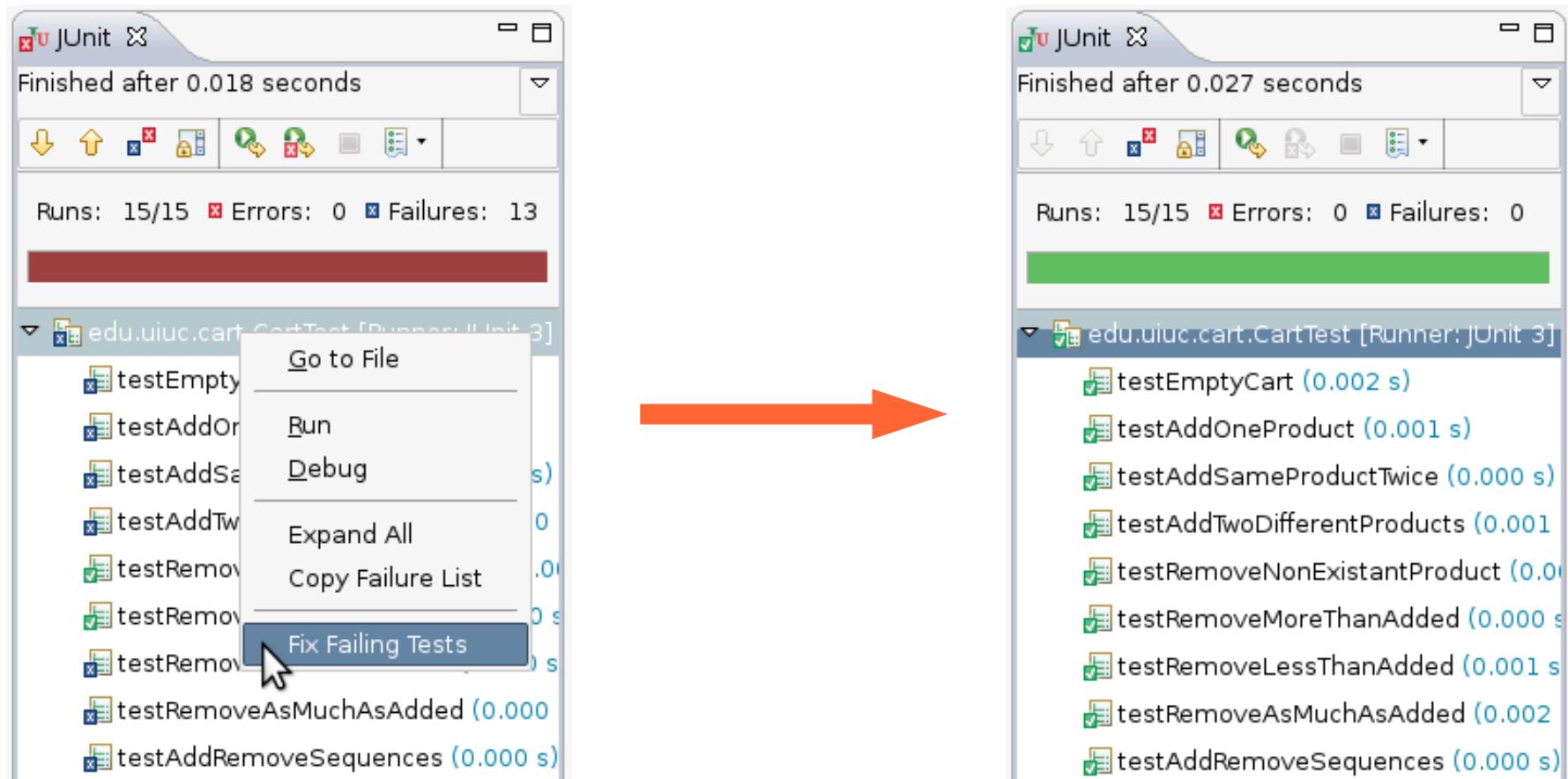


[ **ReAssert: Suggesting Repairs for Broken Unit Tests**  
Brett Daniel, Vilas Jagannath, Danny Dig, Darko Marinov  
ASE 2009, Auckland, New Zealand ]

# Confirm or Reject Suggestions

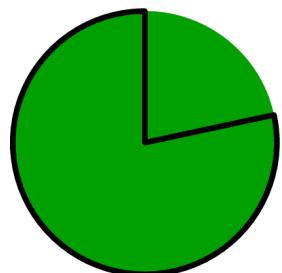


# ReAssert Reduces Effort



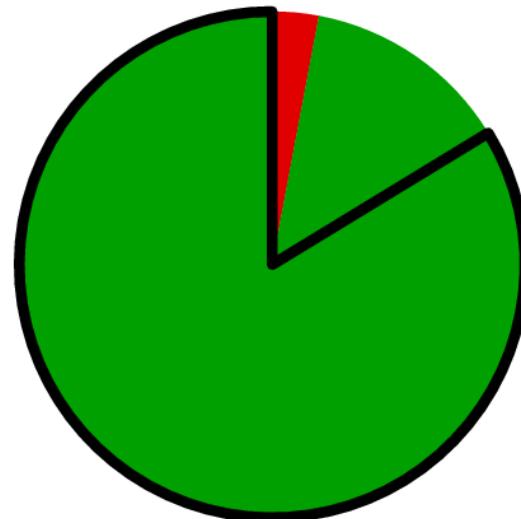
# Does ReAssert Work?

Case Studies



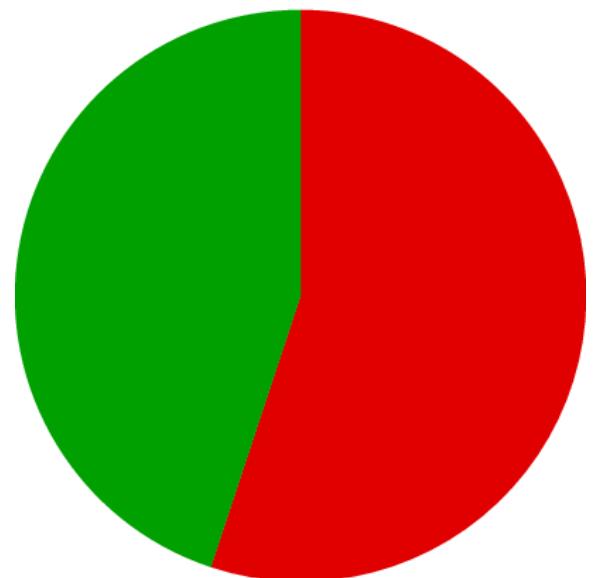
100% (37 of 37) Repaired  
78% (29 of 37) Useful

User Study



97% (131 of 135) Repaired  
86% (113 of 131) Useful  
3% (4 of 135) Not Repaired

Open Source



45% (75 of 167) Repaired  
55% (92 of 167) Not Repaired

|            |   |
|------------|---|
| Insight    | Many <b>failures</b> can be repaired by <b>changing literal values</b> in test code |
| Problem    | ReAssert <b>could not determine</b> which literals needed to change and how         |
| Hypothesis | <b>Symbolic execution</b> can discover literals that cause a test to pass           |

# Simple Assertion Failure

```
assertEquals(3.0, cart.getTotalPrice());
```

# Replace Literal

```
assertEquals( 6.0 , cart.getTotalPrice() );
```

*Replace in code*

*Record actual value*

# Temporary Variable

```
double expTotal = 3.0;
```

```
...
```

```
 assertEquals(expTotal, cart.getTotalPrice());
```

# Trace Declaration-Use Path

```
double expTotal = 6.0;  
...  
assertEquals(expTotal, cart.getTotalPrice());
```

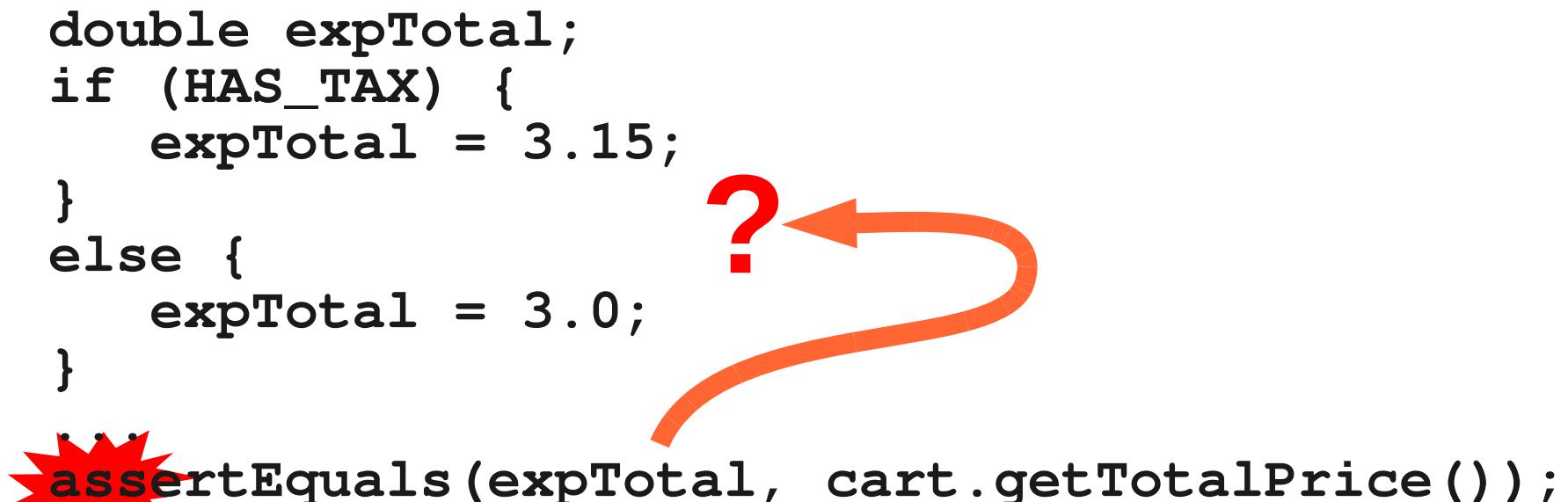


# Multiple Expected Values

```
double expTotal;  
if (HAS_TAX) {  
    expTotal = 3.15;  
}  
else {  
    expTotal = 3.0;  
}  
...  
 assertEquals(expTotal, cart.getTotalPrice());
```

# Multiple Expected Values

```
double expTotal;  
if (HAS_TAX) {  
    expTotal = 3.15;  
}  
else {  
    expTotal = 3.0;  
}  
...  
assertEquals(expTotal, cart.getTotalPrice());
```



A diagram illustrating multiple expected values. Two orange arrows point from the 'expTotal' variable declaration in the 'if' and 'else' blocks to the 'assertEquals' call at the bottom. A red starburst highlights the 'assertEquals' call.

# ReAssert's Naïve Repair

```
double expTotal;  
if (HAS_TAX) {  
    expTotal = 3.15;  
}  
else {  
    expTotal = 3.0;  
}  
...  
assertEquals( 6.0 , cart.getTotalPrice() );
```



# ReAssert's Limitations

- Multiple Expected Values

```
double expTotal;
if (HAS_TAX) {
    expTotal = 3.15 ;
}
else {
    expTotal = 3.0 ;
}
assertEquals(expTotal, cart.getTotalPrice());
```

- Computed Expected Value

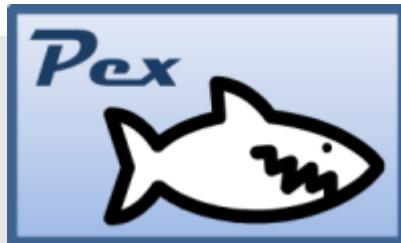
```
double total = 3.0;
String expBill = "Total: $" + total ;
assertEquals(expBill, cart.getPrintedBill());
```

- Expected Object Comparison

```
Product expProduct = new Product("Red pen", 3.0) ;
assertEquals(expProduct, cart.getItem(0));
```

# Symbolic Execution

Dynamic  
symbolic  
execution



*Nondeterministic  
choice generator*  
produces concrete values

```
int input = PexChoose.Value<int>("i");
if (input < 5) {
    throw new Exception();
}
```

Branches introduce  
*path constraints*

Solve constraints to  
execute alternate paths



# Symbolic Execution in Testing

## Test Generation

Find values that make a **program fail**  
(or achieve coverage)

## Test Repair

Find values that make a **test pass**

# Symbolic Test Repair

- 1) Find location of failure
- 2) Determine “expected” computation
- 3) Make “expected-side” literals symbolic
- 4) Execute and accumulate constraints
- 5) Solve constraints and replace in code

```
double expTotal;
if (HAS_TAX) {
    expTotal = 3.15;
}
else {
    expTotal = 3.0;
}
assertEquals(
    expTotal,
    cart.getTotalPrice());
```

# Symbolic Test Repair

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double expTotal;
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# Symbolic Test Repair

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```
double expTotal;
if (HAS_TAX) {
    expTotal = 3.15;
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else {
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}
assertEquals(
    expTotal,
    cart.getTotalPrice());
```

# Symbolic Test Repair

- 1) Find location of failure
- 2) Determine “expected” computation
- 3) Make “expected-side” literals symbolic
- 4) Execute and accumulate constraints
- 5) Solve constraints and replace in code

```
double expTotal;
if (HAS_TAX) {
    expTotal = PexChoose.  
    Value<double> ("e1") ;
}
else {
    expTotal = PexChoose.  
    Value<double> ("e2") ;
}
assertEquals(
    expTotal,
    cart.getTotalPrice());
```

# Symbolic Test Repair

- 1) Find location of failure
- 2) Determine “expected” computation
- 3) Make “expected-side” literals symbolic
- 4) Execute and accumulate constraints
- 5) Solve constraints and replace in code

```
double expTotal;
if (HAS_TAX) {
    expTotal = PexChoose.
        Value<double>("e1");
}
else {
    expTotal = PexChoose.
        Value<double>("e2");
}
assertEquals(
    expTotal,
    cart.getTotalPrice());
```

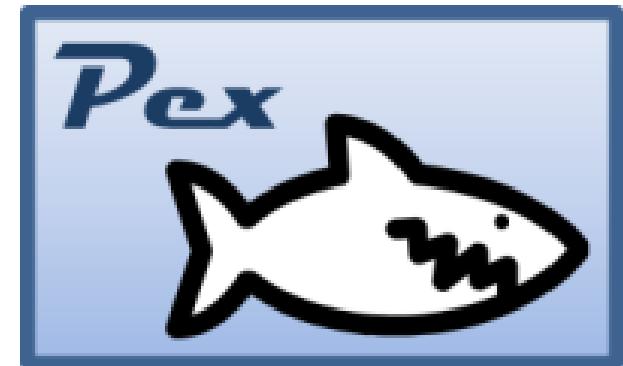
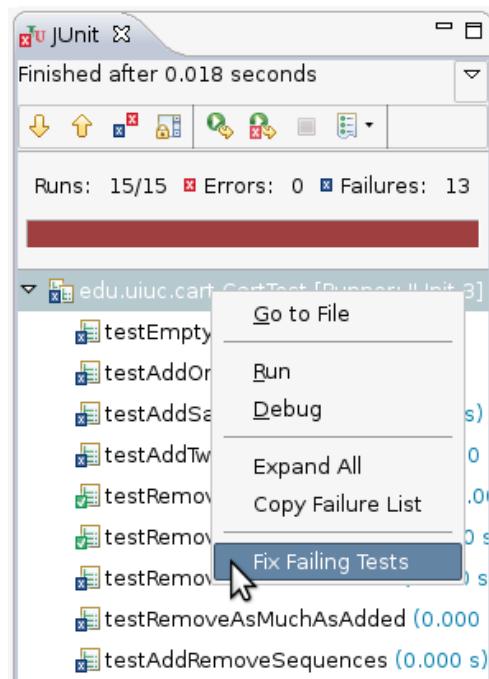
e2 == 6.0

# Symbolic Test Repair

- 1) Find location of failure
- 2) Determine “expected” computation
- 3) Make “expected-side” literals symbolic
- 4) Execute and accumulate constraints
- 5) Solve constraints and replace in code

```
double expTotal;
if (HAS_TAX) {
    expTotal = 3.15;
}
else {
    expTotal = 6.0 ;
}
assertEquals(
    expTotal,
    cart.getTotalPrice());
```

# Implementation Mismatch



- Java
- Eclipse
- .NET
- Visual Studio

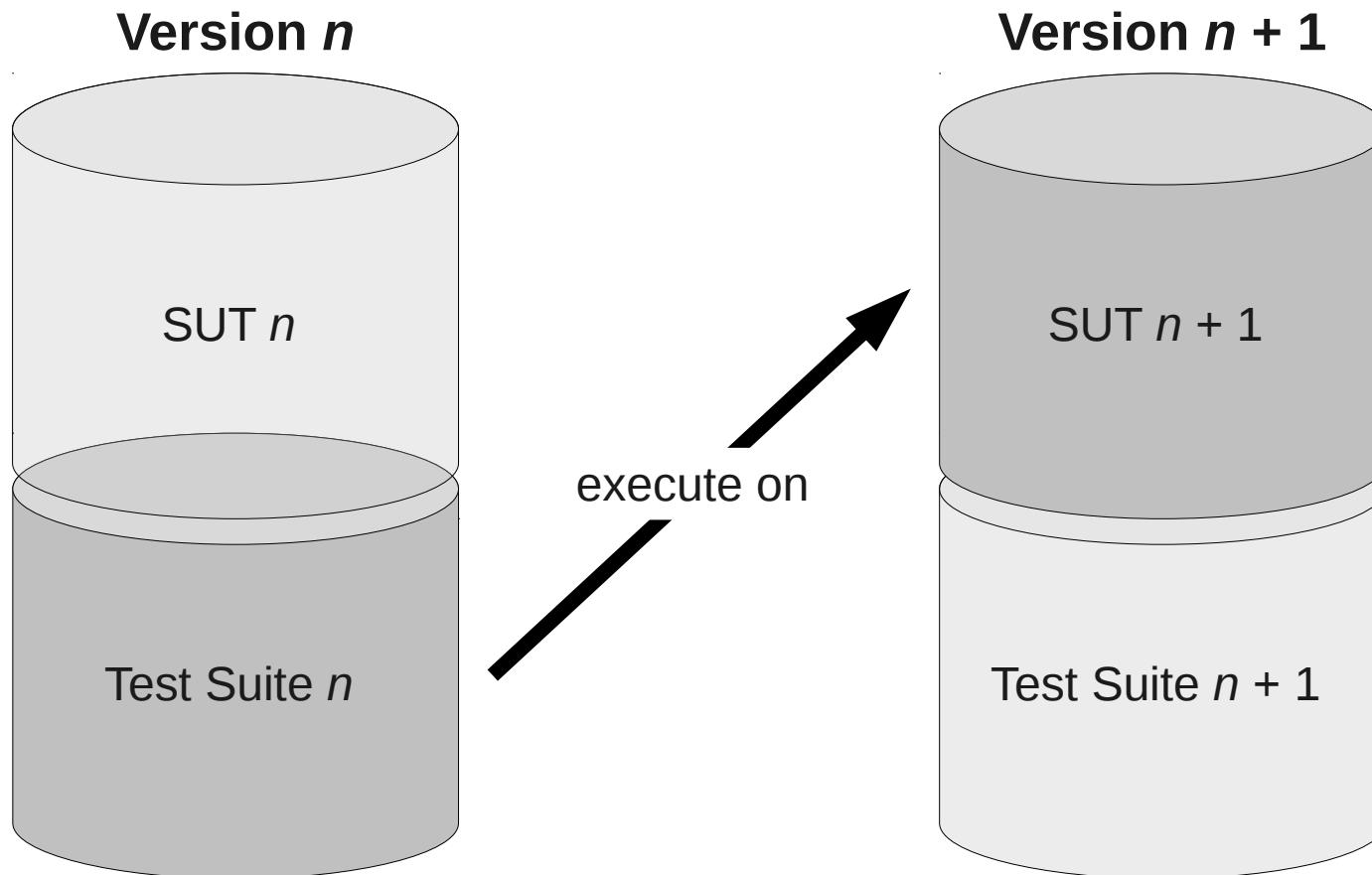
# Evaluation

**Q1:** How many failures can ideal  
**literal replacement** repair?

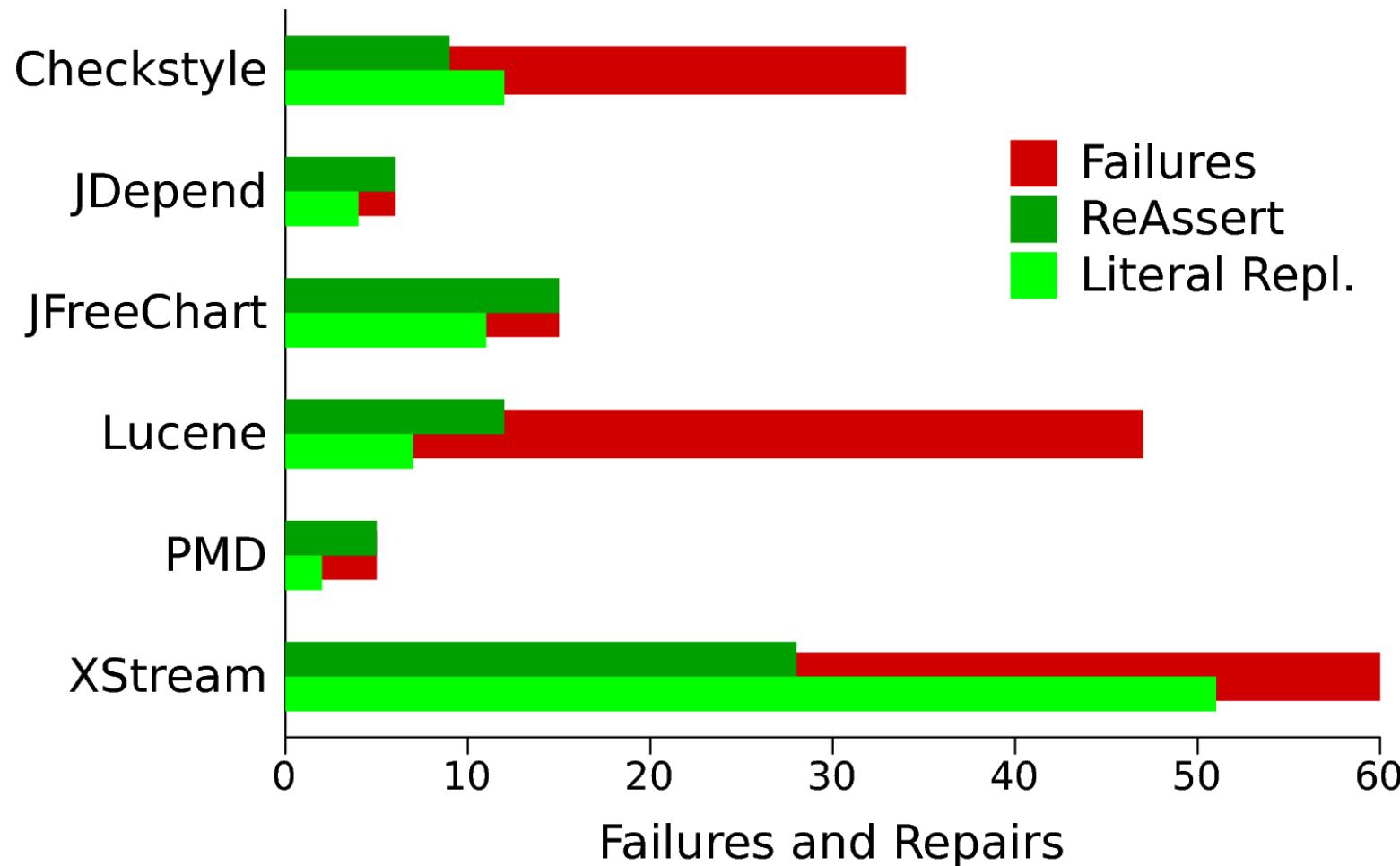
**Q2:** How do ReAssert and literal  
replacement **compare**?

**Q3:** Can **symbolic execution**  
discover literals?

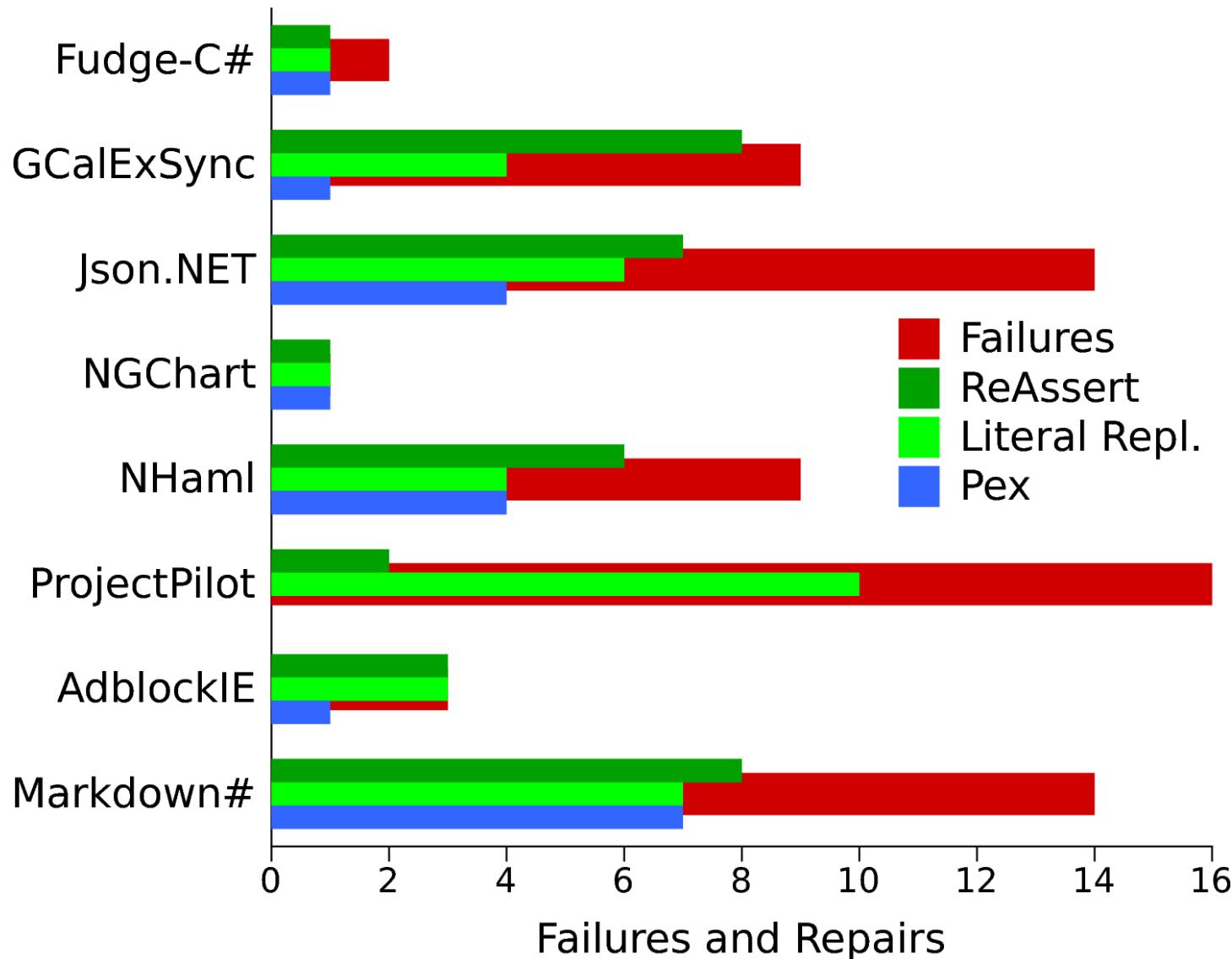
# Failures in Open-Source Software



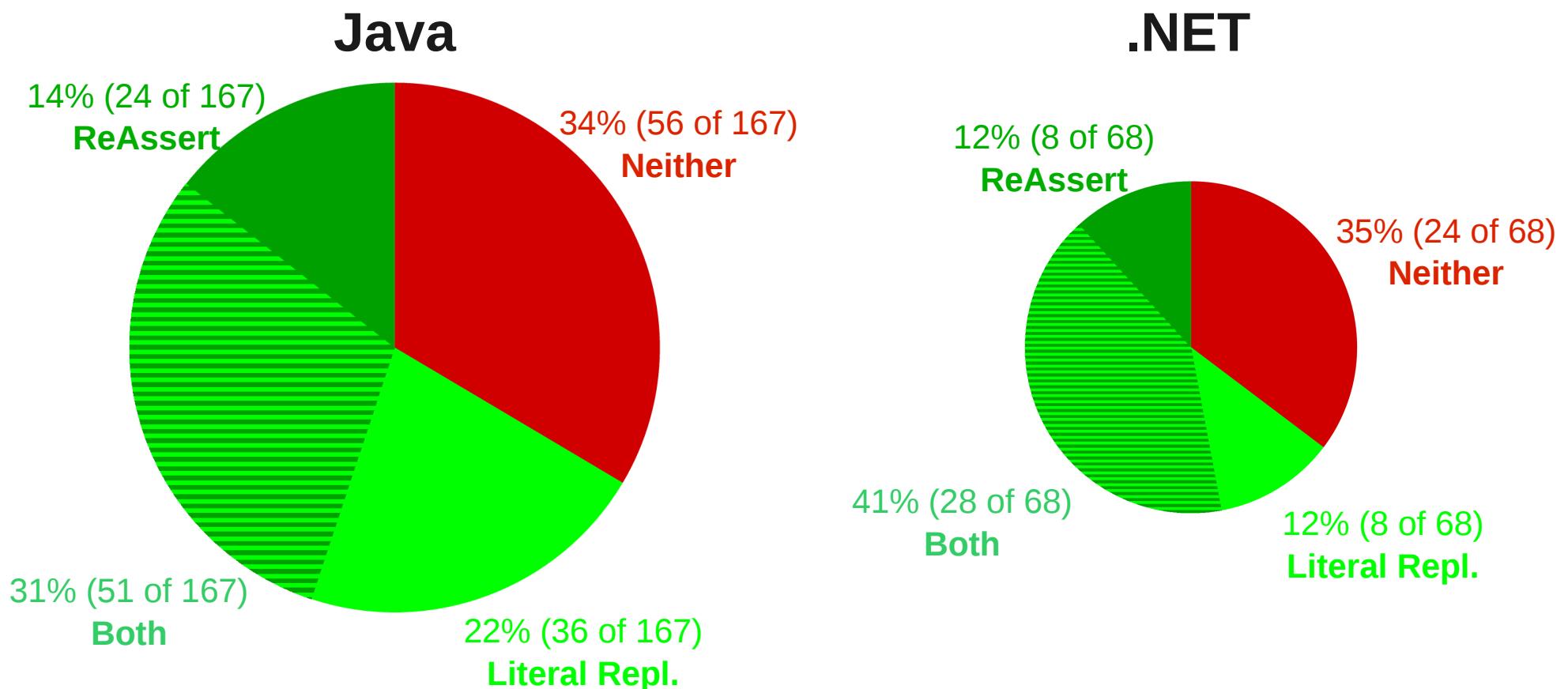
# Open Source Software - Java



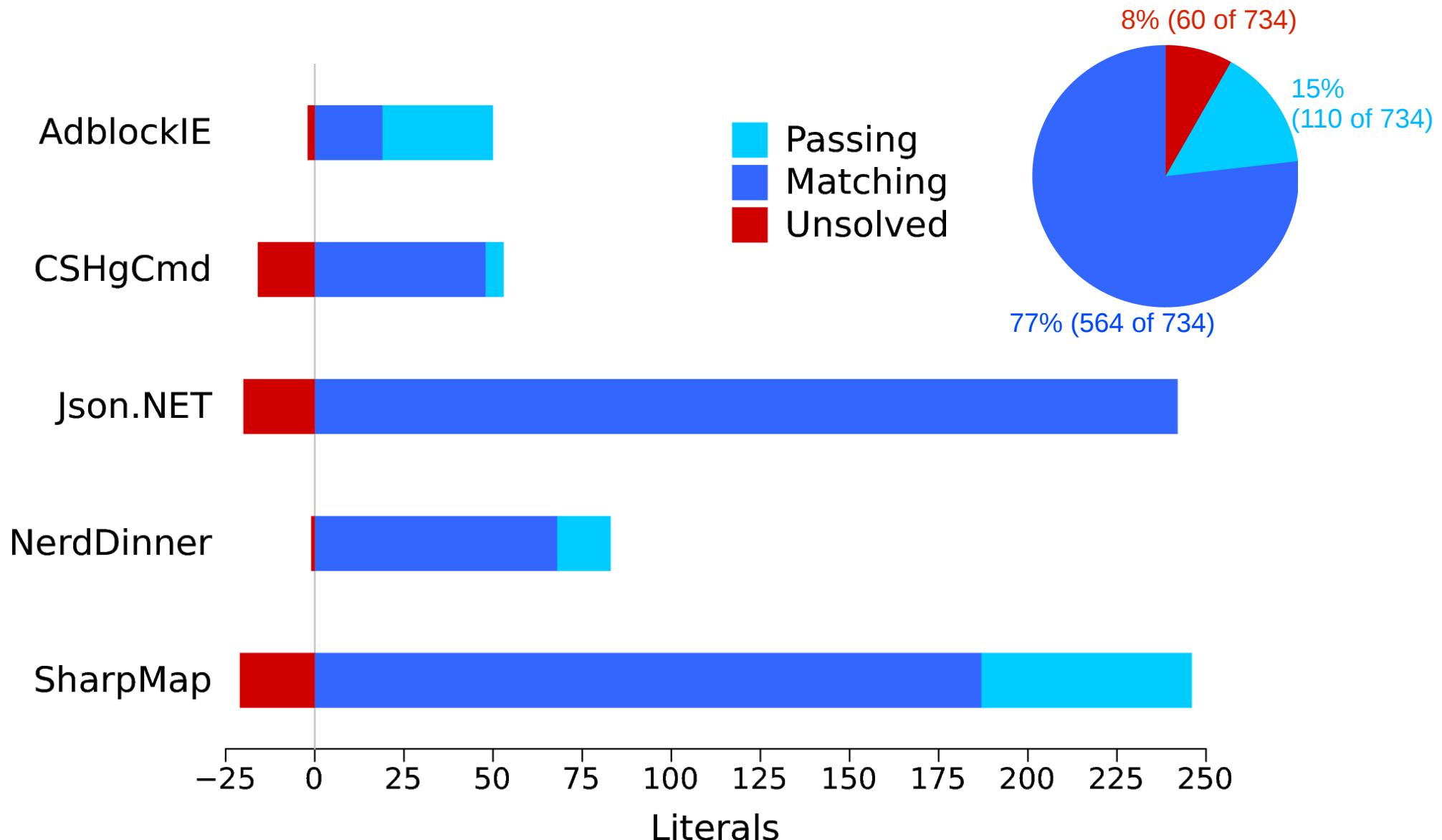
# Open Source Software - .NET



# ReAssert vs. Literal Replacement



# Recreate Literals



# Results

**Q1:** How many failures can ideal  
**literal replacement** repair?

About half

**Q2:** How do ReAssert and literal  
replacement **compare**?

12% to 22% improvement when combined

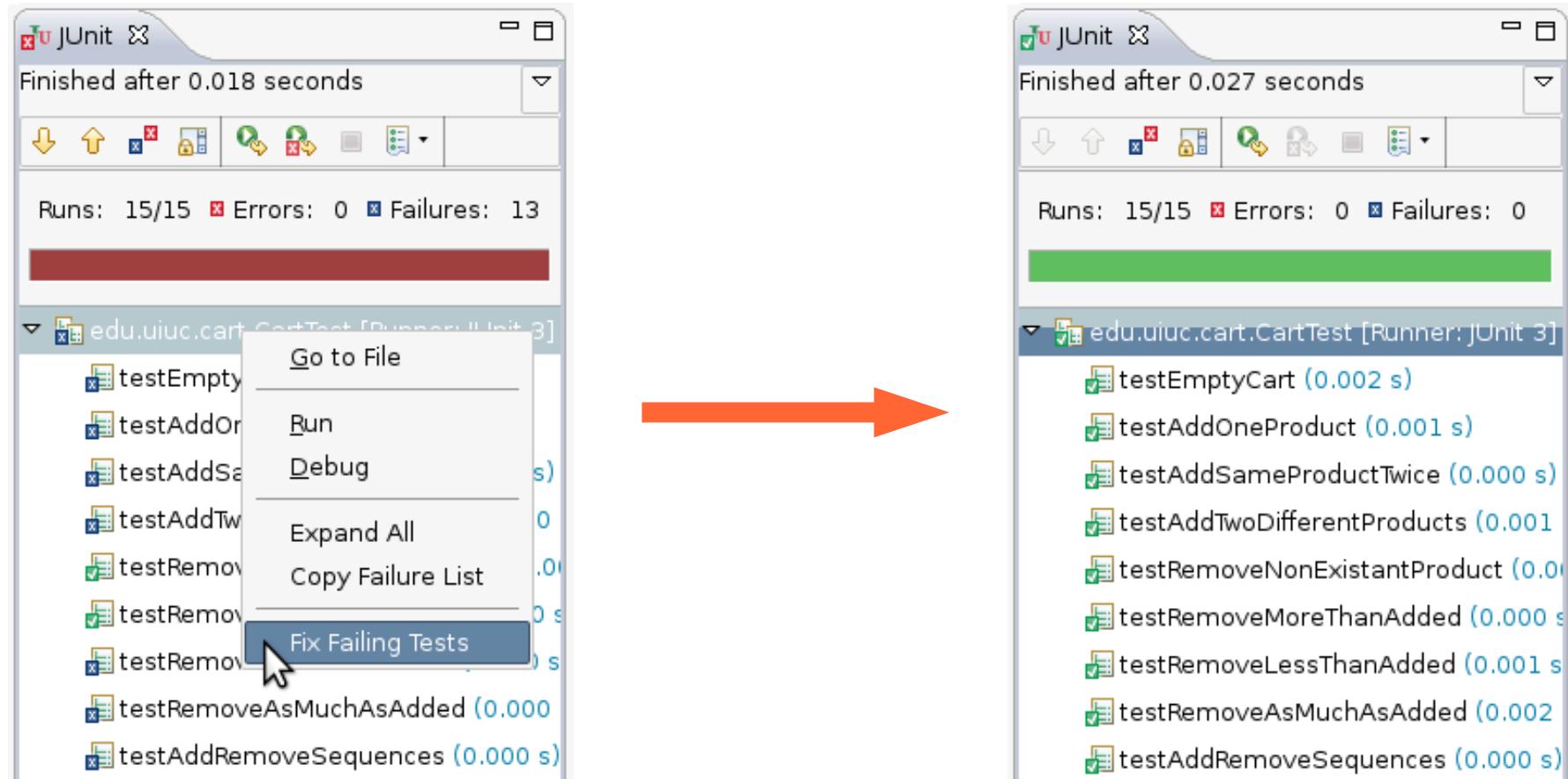
**Q3:** Can **symbolic execution**  
discover literals?

Yes: 52% to 92% of literals

# Thanks

- Nikolai Tillmann for help with Pex
  - Milos Gligoric, Vilas Jagannath, and Viktor Kuncak for valuable comments
  - Anonymous colleagues for potential evolutions
  - Anonymous reviewers
- 
- Supported in part by the US National Science Foundation under Grant No. CCF-0746856

# ReAssert



<http://mir.cs.illinois.edu/reassert>