# Isolating Failure Causes

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## Isolating Causes

#### Actual world

Test

Alternate world

2

Mixed world

## Isolating Causes

#### Actual world

Alternate world

#### How can we automate this?

"**+** |.0"



## Simplifying Input

<SELECT NAME="priority" MULTIPLE SIZE=7> X <SELECT NAME="priority" MULTIPLE SIZE=7> <SELECT NAME="priority" MULTIPLE SIZE=7>

## Simplifying

#### Input



## Isolating Input



#### Difference narrowed down

<SELECT NAME="priority" MULTIPLE SIZE=7>
<SELECT NAME="priority" MULTIPLE SIZE=7>

## Isolating Input

<SELECT NAME="priority" MULTIPLE SIZE=7> <SELECT NAME="priority" MULTIPLE SIZE=7> ELECT NAME="priority" MULTIPLE SIZE=7> ELECT NAME="priority" MULTIPLE SIZE=7> <SELECT NAME="priority" MULTIPLE SIZE=7> <SELECT NAME="priority" MULTIPLE SIZE=7>

## Isolating

#### Input



## Finding Causes

#### Simplifying





minimal inputminimal context

minimal differencecommon context

## Configuration

 $\delta$ 

#### Circumstance

All circumstances  $C = \{\delta_1, \delta_2, ...\}$ Configuration  $c \subseteq C$  $c = \{\delta_1, \delta_2, ..., \delta_n\}$ 

### Tests

#### **Testing function**

 $test(c) \in \{\checkmark, \varkappa, ?\}$ 

#### Initial configurations

 $test(C_{\checkmark}) = \checkmark$  $test(C_{\bigstar}) = \bigstar$ 

### Minimal Difference

Goal: Subsets  $c'_{\mathbf{x}}$  and  $c'_{\mathbf{v}}$  $\emptyset = c_{\mathbf{v}} \subseteq c'_{\mathbf{v}} \subset c'_{\mathbf{x}} \subseteq c_{\mathbf{x}}$ 

#### Difference

 $\Delta = C'_{\mathbf{x}} \setminus C'_{\mathbf{v}}$ 

Difference is I-minimal

 $\forall \delta_i \in \Delta \cdot test(c'_{\checkmark} \cup \{\delta_i\}) \neq \checkmark \wedge test(c'_{\bigstar} \setminus \{\delta_i\}) \neq \bigstar$ 

## Algorithm Sketch

• Extend ddmin such that it works on two sets at a time –  $c'_{\mathbf{x}}$  and  $c'_{\mathbf{y}}$ 

• Compute subsets

 $\Delta_1 \cup \Delta_2 \cup \cdots \cup \Delta_n = \Delta = \mathcal{C}'_{\mathbf{x}} \setminus \mathcal{C}'_{\mathbf{x}}$ 

For each subset, test

• the addition  $c'_{\checkmark} \cup \Delta_i$ 

• the removal  $c'_{\mathbf{x}} \setminus \Delta_i$ 

### **Test Outcomes**



#### most valuable outcomes

### dd in a Nutshell

 $dd(c_{\checkmark}, c_{\bigstar}) = (c'_{\checkmark}, c'_{\bigstar}) \quad \Delta = c'_{\bigstar} \setminus c'_{\checkmark} \text{ is I-minimal}$ 

 $dd(c_{\checkmark}, c_{\varkappa}) = dd'(c_{\checkmark}, c_{\varkappa}, 2)$ 

 $dd'(c'_{\checkmark},c'_{\ast},n) =$ 

 $\begin{cases} (c'_{\checkmark}, c'_{\varkappa}) \\ dd'(c'_{\varkappa} \setminus \Delta_{i}, c'_{\varkappa}, 2) \\ dd'(c'_{\checkmark}, c'_{\checkmark} \cup \Delta_{i}, 2) \\ dd'(c'_{\checkmark}, c'_{\checkmark} \cup \Delta_{i}, c'_{\varkappa}, \max(n-1,2)) \\ dd'(c'_{\checkmark}, c'_{\varkappa} \setminus \Delta_{i}, \max(n-1,2)) \\ dd'(c'_{\checkmark}, c'_{\varkappa}, \min(2n, |\Delta|)) \\ (c'_{\checkmark}, c'_{\varkappa}) \end{cases}$ 

if  $|\Delta| = 1$ if  $\exists i \in \{1..n\} \cdot test(c'_{\mathbf{x}} \setminus \Delta_i) = \checkmark$ if  $\exists i \in \{1..n\} \cdot test(c'_{\mathbf{y}} \cup \Delta_i) = \bigstar$ else if  $\exists i \in \{1..n\} \cdot test(c'_{\mathbf{y}} \cup \Delta_i) = \checkmark$ else if  $\exists i \in \{1..n\} \cdot test(c'_{\mathbf{x}} \setminus \Delta_i) = \bigstar$ else if  $n < |\Delta|$  ("increase granularity") otherwise

```
def dd(c_pass, c_fail):
    n = 2
    while 1:
        delta = listminus(c_fail, c_pass)
        deltas = split(delta, n); offset = 0; j = 0
        while j < n:
            i = (j + offset) \% n
            next_c_pass = listunion(c_pass, deltas[i])
            next_c_fail = listminus(c_fail, deltas[i])
            if test(next_c_fail) == FAIL and n == 2:
                c_fail = next_c_fail; n = 2; offset = 0; break
            elif test(next_c_fail) == PASS:
                c_pass = next_c_fail; n = 2; offset = 0; break
            elif test(next_c_pass) == FAIL:
                c_fail = next_c_pass; n = 2; offset = 0; break
            elif test(next_c_fail) == FAIL:
                c_fail = next_c_fail; n = max(n - 1, 2); offset = i; break
            elif test(next_c_pass) == PASS:
                c_{pass} = next_c_{pass}; n = max(n - 1, 2); offset = i; break
            else:
                j = j + 1
        if j \ge n:
            if n >= len(delta):
                return (delta, c_pass, c_fail)
            else:
                n = min(len(delta), n * 2)
```

### Properties

number of tests t – worst case:  $t = |\Delta|^2 + 7|\Delta|$  where  $\Delta = c_x \setminus c_v$ number of tests t – best case (no unresolved outcomes):  $t \le \log_2(\Delta)$ 

size of difference – no unresolved outcomes

 $|\mathcal{C}'_{\mathbf{x}} \setminus \mathcal{C}'_{\mathbf{v}}| = 1$ 

## Applications



## Isolating Input

<SELECT NAME="priority" MULTIPLE SIZE=7>
<SELECT NAME="priority" MULTIPLE SIZE=7>

## Code Changes

From: Brian Kahne <bkahne@ibmoto.com> To: DDD Bug Report Address <bug-ddd@gnu.org> Subject: Problem with DDD and GDB 4.17

When using DDD with GDB 4.16, the run command correctly uses any prior command-line arguments, or the value of "set args". However, when I switched to GDB 4.17, this no longer worked: If I entered a run command in the console window, the prior commandline options would be lost. [...]

### **Version Differences**

New version

#### **Program works**

#### Program fails

Old version

Causes

## What was Changed

\$ diff -r gdb-4.16 gdb-4.17 diff -r gdb-4.16/COPYING gdb-4.17/COPYING 5c5 < 675 Mass Ave, Cambridge, MA 02139, USA ---> 59 Temple Place, Suite 330, Boston, MA 02111-1307 USA 282c282 < Appendix: How to Apply These Terms to Your New Programs ---> How to Apply These Terms to Your New Programs

...and so on for 178,200 lines (8,721 locations)

## Challenges

- Granularity within some large change, only a few lines may be relevant
- Interference some (later) changes rely on other (earlier) changes
- Inconsistency some changes may have to be combined to produce testable code

Delta debugging handles all this

### General Plan

- Decompose diff into changes per location (= 8,721 individual changes)
- Apply subset of changes, using PATCH
- Reconstruct GDB; build errors mean unresolved test outcome
- Test GDB and return outcome

## Isolating Changes

Delta Debugging Log



• Result after 98 tests (= I hour)

### The Failure Cause

diff -r gdb-4.16/gdb/infcmd.c gdb-4.17/gdb/infcmd.c
1239c1278

< "Set arguments to give program being debugged when it is started.\n

> "Set argument list to give program being debugged when
it is started.\n

- Documentation becomes GDB output
- DDD expects Arguments, but GDB outputs Argument list

🚝 Java - StringUtilsTrimEmptyTest.java - Eclipse Platform	🔀 src/org/apache/commons/lang/StringUtils.java - One line Was added. One line Was deleted. 🔲 🛛
File Edit Source Refactor Navigate Search Project	The change on the following file is failure-inducing: src/org/apache/commons/lang/StringUtils.java
	One line was added. One line was deleted:
Delta Debugging View      Minimize Failure-Inducing Code Ch      delta testDeleteSpace(org.apache.commons.lang.Str      delta Constants.java      The file Constants.java was added to      Delta Debugging View	<pre>StringBt en uffer net on jBt en int sz = str en nt nt =0 iK ) + for (int i=getZero(); i<sz; i++)="" {<br="">if(!Character.isWhitespace(str.charAt(i))) { buffer.append(str.charAt(i)); } </sz;></pre>
7 lines were added.	🔀 src/org/apache/commons/lang/StringUtils.java - 7 lines Were added.
One line was added. One line was dele	The change on the following file is failure-inducing: src/org/apache/commons/lang/StringUtils.java
	7 lines were added:
	return (str != null && str.length() > 0); }
	<pre>+ /** + /** + &amp; @return zero + */ + private static int getZero() { + return Constants.ZER0; + } + /**</pre>
	* Checks if a (trimmed) String is null or empty.
Minimize Code Changes	*       *       X src/org/apache/commons/lang/Constantsjava - The file Constantsjava Was added to projec
Runs 6/6 Errors 0 Failures 1	The change on the following file is failure-inducing: src/org/apache/commons/lang/lonstants.java The file Constants.java was added to project commons-lang-1_copy_524288:
Failure Trace →	/*  * Created on Dec 3, 2003
junit.framework.ComparisonFailure: deleteWhi at junit.framework.Assert.assertEquals(Asse at org.apache.commons.lang.StringUtilsTrimE at sun.reflect.NativeMethodAccessorImpl.inv at sun.reflect.NativeMethodAccessorImpl.inv at sun.reflect.DelegatingMethodAccessorImpl at java.lang.reflect.Method.invoke(Method.j at junit.framework.TestCase.runTest(TestCas at junit.framework.TestCase.runBare(TestCas at junit.framework.TestResult\$1.protect(Test	<pre>* To change the template for this generated file go to * Window - Preferences - Java - Code Generation - Code and Comments */ package org.apache.commons.lang; /** * @author mburger * * To change the template for this generated type comment go to * Window - Preferences - Java - Code Generation - Code and Comments */ public class Constants { public static final int ZER0 = 1;</pre>
	}
Package Explorer Hierarchy JUnit DeltaDebugging	
org.apache.commons.lang.StringUtiommons.lang - commo	ons-lang-1/src Writable Smart Insert 54 : 32

### Optimizations

History – group changes by creation time
Reconstruction – cache several builds
Grouping – according to scope
Failure Resolution – scan error messages for possibly missing changes

## **Thread Schedules**



#### A's updates get lost!

### **Record + Replay**



## Schedules as Input



The schedule difference causes the failure!

## Finding Differences



- We start with runs 🖌 and 🗶
- We determine the differences  $\Delta_i$  between thread switches  $t_i$ :
  - $t_1$  occurs in  $\checkmark$  at "time" 254
  - $t_1$  occurs in imes at "time" 278
  - The difference  $\Delta_1 = |278 - 254|$  induces a *statement interval:* the code executed between "time" 254 and 278
  - Same applies to  $t_2$ ,  $t_3$ , etc.

## Isolating Differences



## Isolating Differences



## **Example: Raytracer**

- Raytracer program from Spec JVM98 suite
- Injected a simple race condition
- Set up automated test + random schedules
- Obtained passing and failing schedule
- 3,842,577,240 differences, each moving a thread switch by ±1 yield point (time unit)

## **Isolating Schedules**

**Delta Debugging Log** 



### The Failure Cause

25	oublic class Scene { …
44	<pre>private static int ScenesLoaded = 0;</pre>
45	(more methods)
81	private
82	<pre>int LoadScene(String filename) {</pre>
84	<pre>int 01dScenesLoaded = ScenesLoaded;</pre>
85	(more initializations)
91	infile = new DataInputStream(…);
92	(more code)
130	ScenesLoaded = 01dScenesLoaded + 1;
131	System.out.println("" +
	<pre>ScenesLoaded + " scenes loaded.");</pre>
132	
134	}
135	
733	}

### General Issues

How do we choose the alternate world?
How do we decompose the configuration?
How do we know a failure is the failure?
How do we disambiguate multiple causes?
How do I get to the defect?

### Concepts

★ To isolate failure causes automatically, use
• an *automated test case*• a means to *narrow down the difference*• a *strategy* for proceding.
★ One possible strategy is Delta Debugging.

## Concepts (2)

**★** Delta Debugging can isolate failure causes • in the (general) input • in the version history • in thread schedules  $\star$  Every such cause implies a fix – but not necessarily a correction.

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