

# Debugging

SWE 795, Spring 2017  
Software Engineering Environments

# Today

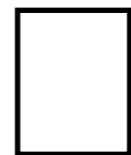
- Part 1 (Lecture)(~45 mins)
  - Debugging
- Part 2 (HW1 Presentations)(30 mins)
- Break!

- Part 3 (Discussion)(60 mins)
  - Discussion of readings

# Example

?



retrieveRelationships



NPE

getStartContext

Java - Fusion/src/edu/cmu/cs/fusion/xml/XMLRetriever.java - Eclipse SDK - /Users/tlatoza/Documents/Code/Reachability question

TLATOZA

File Edit View Insert Run Project Properties Help

Package Explorer

- edu.cmu.cs.crystal.flow.concur 223
- edu.cmu.cs.crystal.flow.worklist 260
- edu.cmu.cs.crystal.internal 272
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- JRE System Library [JVM 1.6.0 (MacOS X Default)]
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> Fusion 36 [https://fusion.googlecode.com/svn, Trunk]

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- > edu.cmu.cs.fusion.relationship 36
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- > NamedTypeBinding.java
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- > TypeComparisonCall.java
- > TypeComparisonDefinition.java
- > XMLFileVisitor.java
- > XMLObjectLabel.java
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> FusionTests 74 [https://fusion.googlecode.com/svn]

> PlaidAnnotations 62 [http://plaidannotations.googlecode.com/svn]

XMLRetriever.java

```

public void retrieveWithSchema(File file, String schema) {
    SchemaQueries sQueries = queries.get(schema);

    if (sQueries != null) {
        RelationshipDelta result = sQueries.runQueries(file, types);
        delta = RelationshipDelta.join(delta, result);
        topLabels.addAll(sQueries.findTopObjects(file, types));
    }
}

public RelationshipContext getStartContext(Variable thisVar, AliasContext aliases) {
    RelationshipContext start = new RelationshipContext(false);
    RelationshipDelta converted = new RelationshipDelta();
    Map<ObjectLabel, ObjectLabel> bindings = new HashMap<ObjectLabel, ObjectLabel>();

    for (ObjectLabel possibleTop : topLabels) {
        String thisType = thisVar.resolveType().getQualifiedName();
        String possibleTopType = possibleTop.getType().getQualifiedName();
        if (types.isSubtypeCompatible(thisType, possibleTopType)) {
            Set<ObjectLabel> thisAliases = aliases.getAliases(thisVar);
            assert (thisAliases.size() == 1);
            bindings.put(possibleTop, thisAliases.iterator().next());
        }
    }

    for (Entry<Relationship, ThreeValue> entry : delta) {
        Relationship convDelta = convertRelationship(entry.getKey(), bindings);
        converted.setRelationship(convDelta, FourPointLattice.convert(entry.getValue()));
    }
    return start.applyChangesFromDelta(converted);
}

```

Problems @ Javadoc Declaration Call Hierarchy

Members calling 'getStartContext(Variable, AliasContext)' - in workspace

- performAnalysis() : AnalysisResult<LE, N, OP> - edu.cmu.cs.crystal.flow.worklist
- performAnalysis(MethodDeclaration) : void - edu.cmu.cs.crystal.flow.MethodVisitor
- switchToMethod(MethodDeclaration) : void - edu.cmu.cs.crystal.flow.MethodVisitor
- performAnalysisOnSurroundingMethodIfNeeded(ASTNode) : void - edu.cmu.cs.crystal.flow.MethodVisitor
- getEndResults(MethodDeclaration) : LE - edu.cmu.cs.crystal.flow.MethodVisitor
- analyzeMethod(MethodDeclaration) : void - edu.cmu.cs.crystal.flow.MethodVisitor
- runAnalysis(AnalysisReporter, IAnalysisInput, ICompilationUnit) : void - edu.cmu.cs.crystal.internal
- run(AnnotationDatabase) : void - edu.cmu.cs.crystal.internal
- getLabeledEndResult(MethodDeclaration) : IResult<LE> - edu.cmu.cs.crystal.internal
- getLabeledResultAfter(ICFGNode<ASTNode>) : IResult<LE> - edu.cmu.cs.crystal.internal
- getLabeledResultBefore(ICFGNode<ASTNode>) : IResult<LE> - edu.cmu.cs.crystal.internal
- getLabeledResultsAfter(ASTNode) : IResult<LE> - edu.cmu.cs.crystal.internal
- deriveResult(EclipseInstructionSequence, LE, TACInstruction, block) : void - edu.cmu.cs.crystal.internal
- getLabeledResultsAfter(ASTNode) : IResult<LE> - edu.cmu.cs.crystal.internal
- getLabeledResultsAfter(TACInstruction) : IResult<LE> - edu.cmu.cs.crystal.internal
- getLabeledResultsBefore(ASTNode) : IResult<LE> - edu.cmu.cs.crystal.internal
- getLabeledStartResult(MethodDeclaration) : IResult<LE> - edu.cmu.cs.crystal.internal
- getResultsOrNullAfter(ASTNode) : LE - edu.cmu.cs.crystal.flow.MethodVisitor
- getResultsOrNullBefore(ASTNode) : LE - edu.cmu.cs.crystal.flow.MethodVisitor
- getStartResults(MethodDeclaration) : LE - edu.cmu.cs.crystal.flow.MethodVisitor
- getEntryValue() : LE - edu.cmu.cs.crystal.flow.worklist.BranchSensitiveWorklist

Line Call

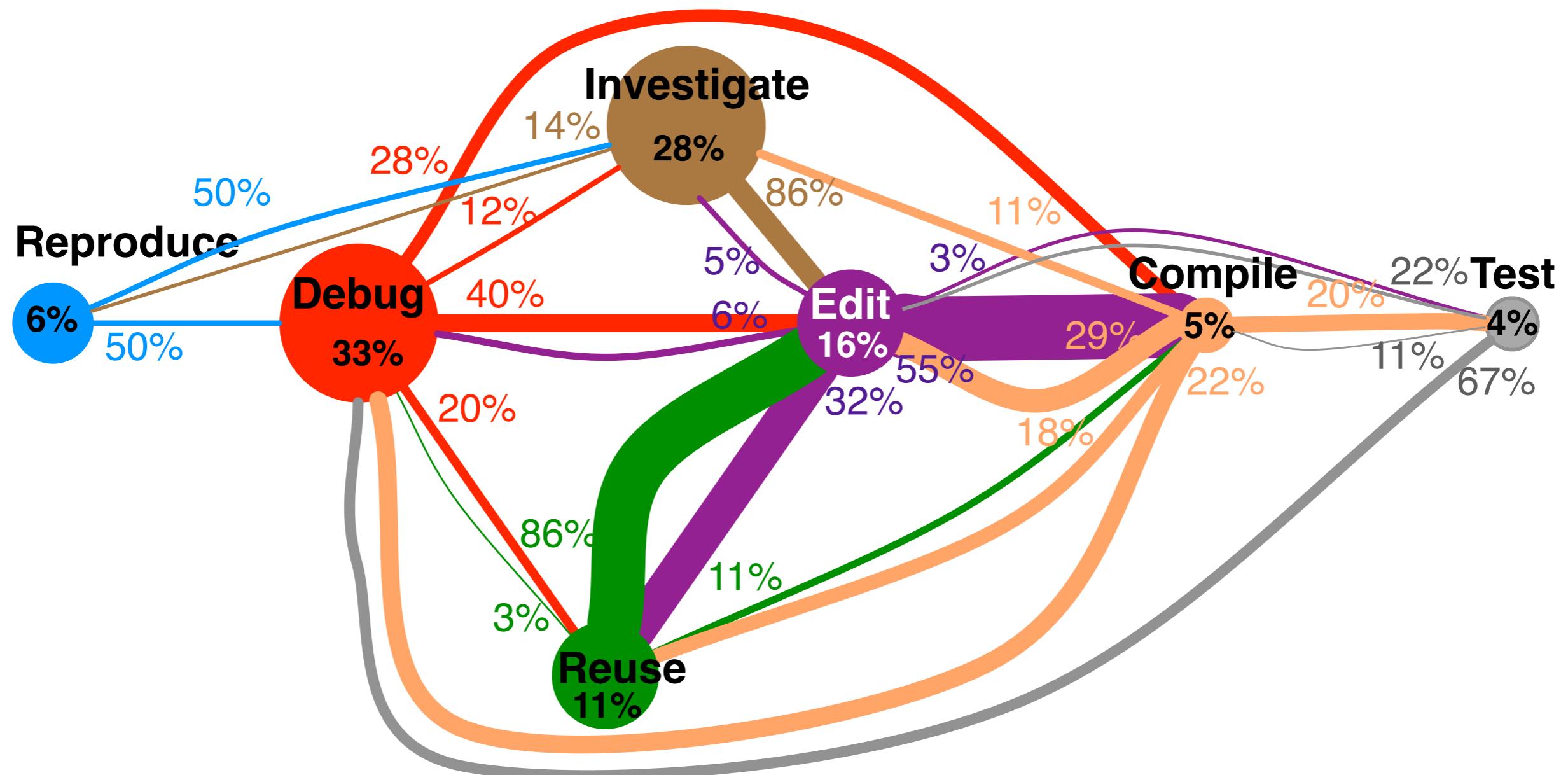
203 performAnalysisOnSurroundingMethodIfNeeded(d)



# Definitions

- Error - discrepancy between actual behavior of system and intended behavior
- Failure - incorrect output value, exception, etc.; an error that has become observable
- Fault - lines in code which are incorrect
- Debugging: determining the cause of a failure by localizing its location to a fault
  - More formally: **fault localization**

# Edit / Debug Cycle



**Circle size:** % of time

For tasks in code in your own codebase that you haven't seen recently

**Edge thickness:** % of transitions observed

# Steps in fixing bugs

- Reproduce the problem
- Fault localization
- Investigate fix
- Implement fix
- Test fix

- Will focus on **fault localization** today

# Supporting debugging

- Why is it so challenging to go from failure to fault?
  - It may be unclear where behavior is implemented in code
  - Fault may occur far away from failure
    - How to find connection?
  - Understanding why failure occurred may be challenging

# What makes hard bugs hard to debug?

- Cause / effect chasm - symptom far removed from the root cause (15 instances)
  - timing / synchronization problems
  - intermittent / inconsistent / infrequent bugs
  - materialize many iterations after root cause
  - uncertain connection to hardware / compiler / configuration
- Inapplicable tools (12 instances)
  - Heisenbugs - bug disappears when using debugging tool
  - long run to replicate - debugging tool slows down long run even more
  - stealth bug - bug consumes evidence to detect bug
  - context - configuration / memory makes it impossible to use tool
- What you see is probably illusory (7 instances)
  - misreads something in code or in runtime observations
- Faulty assumption (6)
- Spaghetti code (3)

Eisenstadt, M. [Tales of Debugging from the Front Lines](#). Proc. Empirical Studies of Programmers, Ablex Publishing, Norwood, NJ, 1993, 86-112.

# Traditional debugging techniques

- Stepping in debugger
- Logging - insert print statements or wrap particular suspect functions
- Dump & diff - use diff tool to compare logging data between executions
- Conditional breakpoints
- Profiling tool - detect memory leaks, illegal memory references

Eisenstadt, M. [Tales of Debugging from the Front Lines](#). Proc. Empirical Studies of Programmers, Ablex Publishing, Norwood, NJ, 1993, 86-112.

# Debugging Strategies

- Strategies
  - Gather execution trace data
  - Formulate & test hypotheses
  - Traverse control & data dependencies backwards (slicing)

# Formulate & test hypotheses

- Use knowledge & data so far to formulate hypothesis about why bug happened
  - cogitation, meditation, observation, inspection, contemplation, hand-simulation, gestation, rumination, dedication, inspiration, articulation
- Recognize cliche
  - seen a similar bug before
- Controlled experiments - test hypotheses by gathering data

Eisenstadt, M. [Tales of Debugging from the Front Lines](#). Proc. Empirical Studies of Programmers, Ablex Publishing, Norwood, NJ, 1993, 86-112.

# Some debugging techniques

- Record & **replay** execution (omniscient debuggers)
- Find temporary objects that aren't garbage collected (Jinsight)
- Find shortest retro steps (delta debugging)
- **Differentiate** faulty from unfaulty executions (statistical debugging)
- Traverse control & data **dependencies** backwards (static slicers, dynamic slicers)
- Connect separated events by searching across control flow (Reacher)
- **Recommend** fixes other developers made for same error [See Crowdsourcing Lecture]

# Record & replay execution

- Debugging in a debugger is hard
  - Forces developer to guess which methods to step into
  - Forces developers to guess which values to instrument
  - Changing guess requires reproing failure again
    - Can be time consuming
- What if developers could debug forwards **and** backwards?

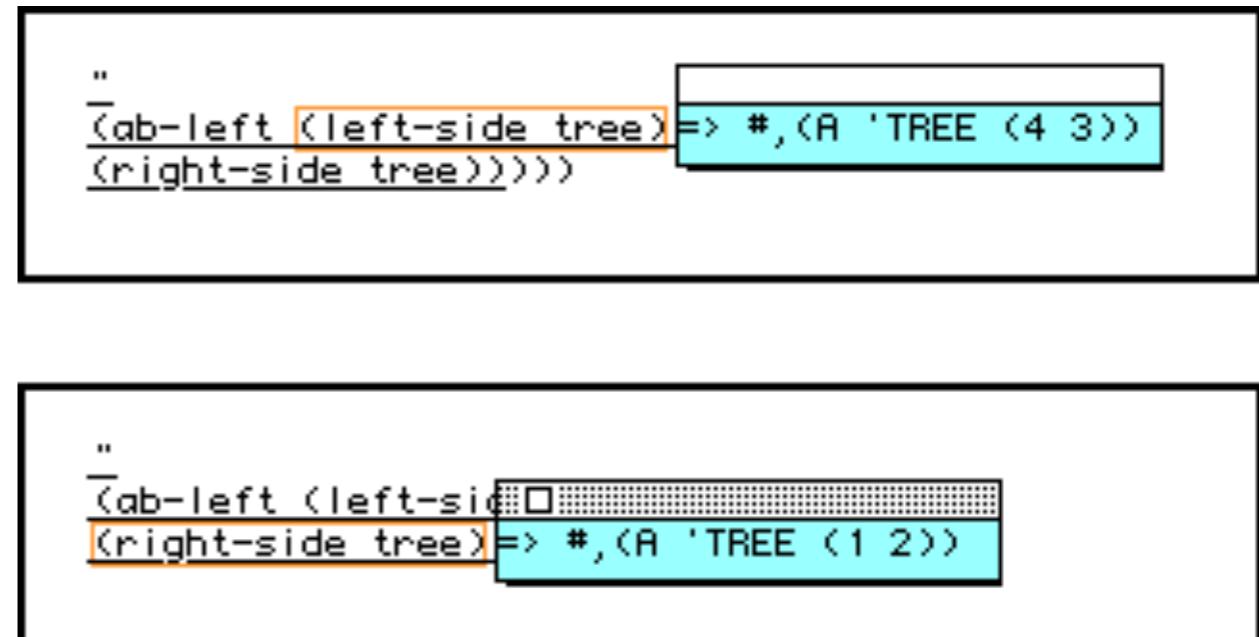
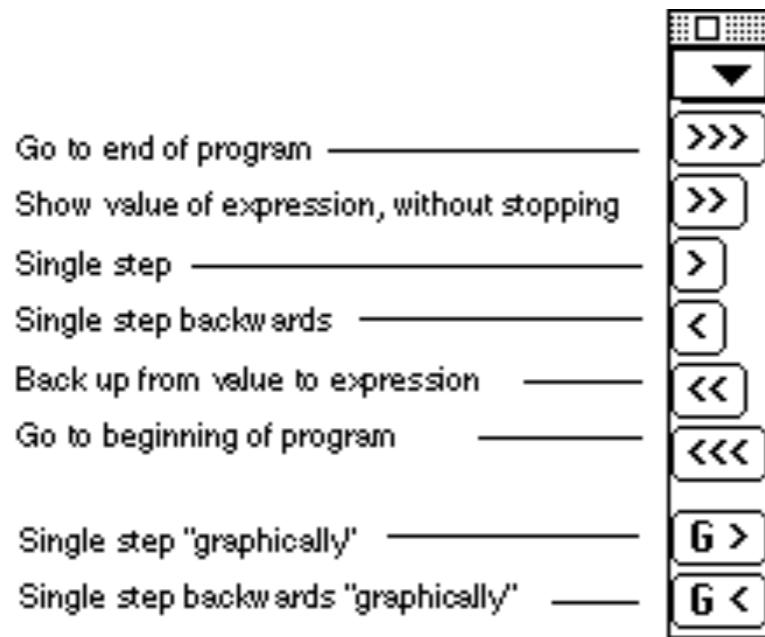
# Record & replay execution

- Record execution, step backwards / forwards through execution  
Biggest challenge - performance slowdown from logging - focus of most papers
- Example systems focused on user interactions
  - Retrace - on exception, backup several statements & start logging  
M. V. Zelkowitz. 1973. Reversible execution. *Commun. ACM* 16, 9 (September 1973), 566.
  - ZStep94 - backwards / forwards stepping, find code which rendered graphics  
Henry Lieberman and Christopher Fry. 1995. [Bridging the gulf between code and behavior in programming](#). In Proceedings of the SIGCHI conference on Human factors in computing systems (CHI '95), 480-486.
  - Omniscient debugging - backwards / forwards stepping, step through writes to a variable  
Bill Lewis. [Debugging backwards in time](#). In Proceedings of the Fifth International Workshop on Automated Debugging (AADEBUG 2003), October 2003.
  - WhyLine - ask questions about output, traverse dynamic control & data dependencies, ask why didn't questions  
Andrew J. Ko and Brad A. Myers. 2010. [Extracting and answering why and why not questions about Java program output](#). ACM Trans. Softw. Eng. Methodol. 20, 2, Article 4 (September 2010), 36 pages.

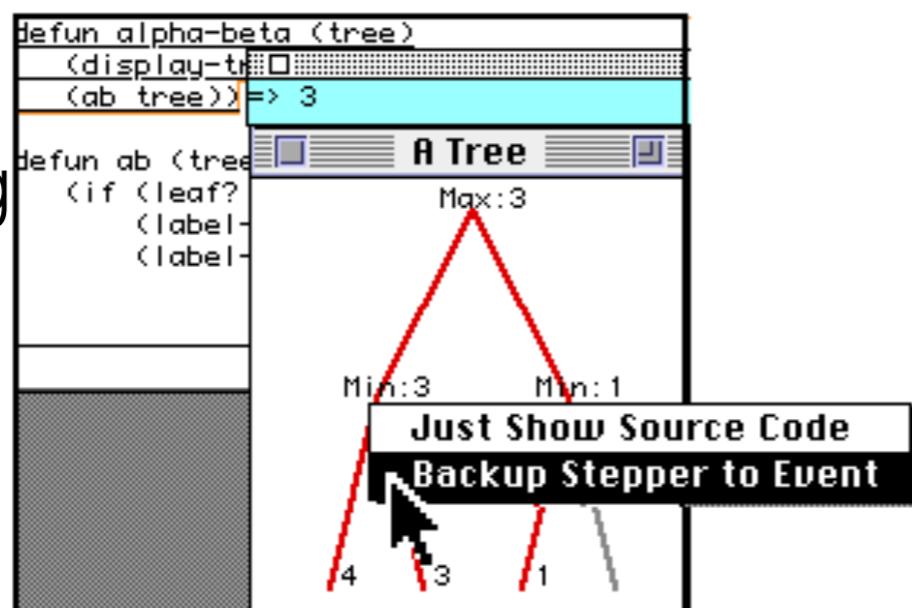
# ZStep94

- Forwards / backwards stepping through execution events

See value of selected variables



- Select g

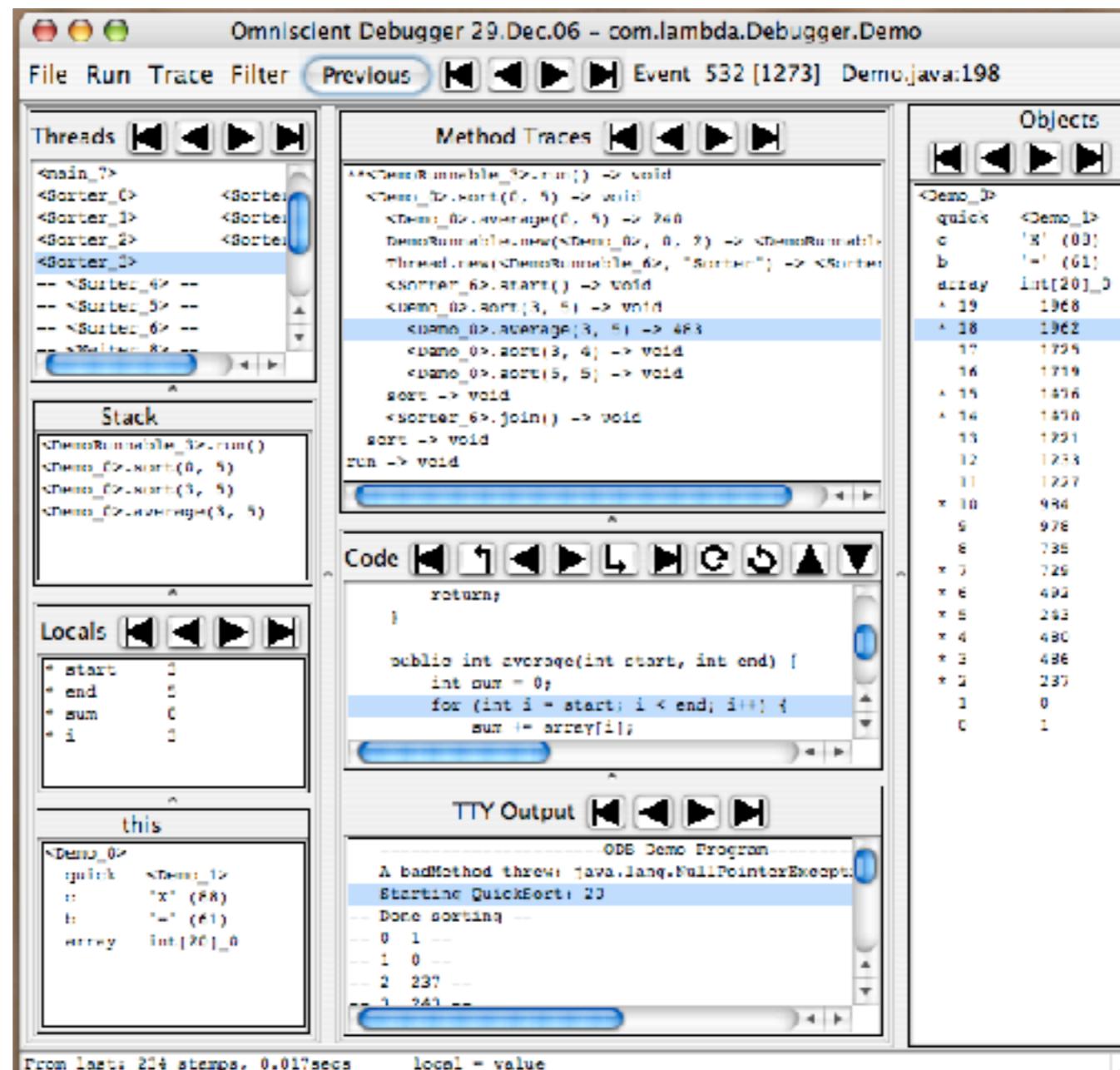


↳ that drew it

Demo: <http://web.media.mit.edu/~ieber/Lieberary/ZStep/ZStep.mov>

Henry Lieberman and Christopher Fry. 1995. [Bridging the gulf between code and behavior in programming](#). In Proceedings of the SIGCHI conference on Human factors in computing systems (CHI '95), 480-486.

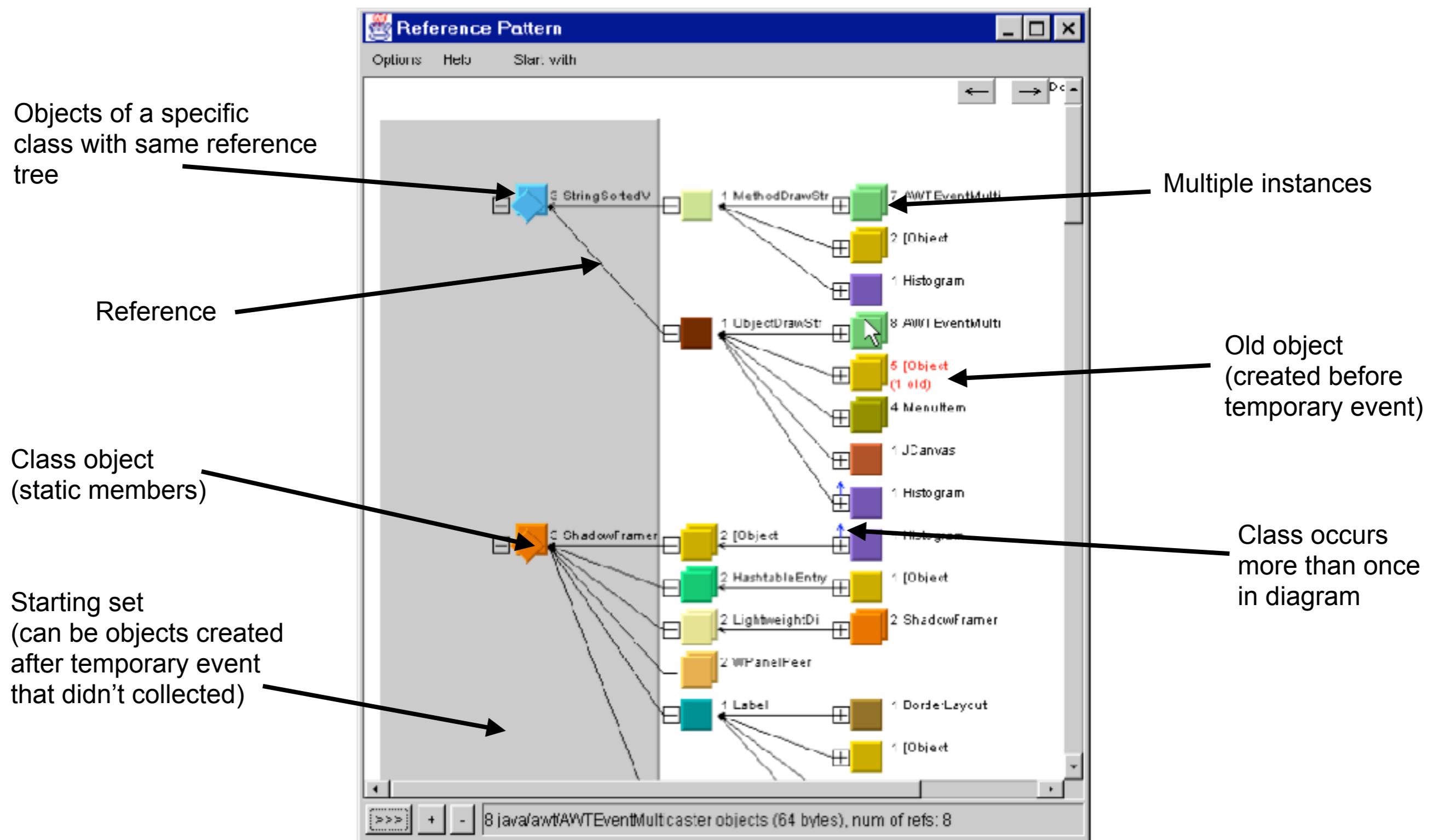
# Omniscient debugger



Demo / talk: <http://video.google.com/videoplay?docid=3897010229726822034#>

Bill Lewis. [Debugging backwards in time](#). In Proceedings of the Fifth International Workshop on Automated Debugging (AADEBUG 2003), October 2003.

# Find temporary objects that aren't garbage collected



Wim De Pauw and Gary Sevitsky. [Visualizing Reference Patterns for Solving Memory Leaks in Java](#). In European Conference on Object-Oriented Programming (ECOOP), pages 116–134, 1999.

# Find shortest repro steps

- Long sequence of steps uncovered by tester triggers a bug.
- Which of these steps are causing the bug
- Complex input - which part of input is responsible for bug?
- Example - 10,700 Mozilla bugs (11/20/2000)

```
<td align="left" valign="top">
<SELECT NAME="op_sys" MULTIPLE SIZE=7>
<OPTION VALUE="all">all<OPTION VALUE="Windows 3.1">Windows 3.1<OPTION VALUE="Windows 95">Windows 95<OPTION VALUE="Windows 98">Windows 98<OPTION VALUE="Windows ME">Windows ME<OPTION VALUE="Windows 2000">Windows 2000<OPTION VALUE="Windows NT">Windows NT<OPTION VALUE="Mac System 7">Mac System 7<OPTION VALUE="Mac System 7.5">Mac System 7.5<OPTION VALUE="Mac System 7.6.1">Mac System 7.6.1<OPTION VALUE="Mac System 8.0">Mac System 8.0<OPTION VALUE="Mac System 8.5">Mac System 8.5<OPTION VALUE="Mac System 8.6">Mac System 8.6<OPTION VALUE="Mac System 9.0">Mac System 9.0<OPTION VALUE="Mac OS X">Mac OS X<OPTION VALUE="Linux">Linux<OPTION VALUE="BSDI">BSDI<OPTION VALUE="FreeBSD">FreeBSD<OPTION VALUE="NetBSD">NetBSD<OPTION VALUE="OpenBSD">OpenBSD<OPTION VALUE="AIX">AIX<OPTION VALUE="BeOS">BeOS<OPTION VALUE="HP-UX">HP-UX<OPTION VALUE="IRIX">IRIX<OPTION VALUE="Neutrino">Neutrino<OPTION VALUE="OpenVMS">OpenVMS<OPTION VALUE="OS/2">OS/2<OPTION VALUE="OSF/1">OSF/1<OPTION VALUE="Solaris">Solaris<OPTION VALUE="SunOS">SunOS<OPTION VALUE="other">others</SELECT>
</td>
<td align="left" valign="top">
<SELECT NAME="priority" MULTIPLE SIZE=7>
<OPTION VALUE="--">--<OPTION VALUE="P1">P1<OPTION VALUE="P2">P2<OPTION VALUE="P3">P3<OPTION VALUE="P4">P4<OPTION VALUE="P5">P5</SELECT>
</td>
<td align="left" valign="top">
<SELECT NAME="bug_severity" MULTIPLE SIZE=7>
<OPTION VALUE="blocker">blocker<OPTION VALUE="critical">critical<OPTION VALUE="major">major<OPTION VALUE="normal">normal<OPTION VALUE="minor">minor<OPTION VALUE="trivial">trivial<OPTION VALUE="enhancement">enhancement</SELECT>
</td>
</tr>
</table>
```

Fig. 1. Printing this HTML page makes Mozilla crash (excerpt)

# Find shortest repro steps

- ddmin algorithm sketch:
- 1. Decompose input into pieces
- 2. Run tests on pieces
- 3. If there's a piece that still fails, go back to 1 on piece

Otherwise, found locally minimal smallest input

Step	Test case	1	2	3	4	.	.	.	.	test
1	$\Delta_1$	1	2	3	4	.	.	.	.	?
2	$\Delta_2$	.	.	.	.	5	6	7	8	<b>x</b>
3	$\Delta_1$	.	.	.	.	5	6	.	.	<b>✓</b>
4	$\Delta_2$	.	.	.	.	.	.	7	8	<b>x</b>
5	$\Delta_1$	.	.	.	.	.	.	7	.	<b>x</b>
Result		.	.	.	.	.	.	7	.	Done

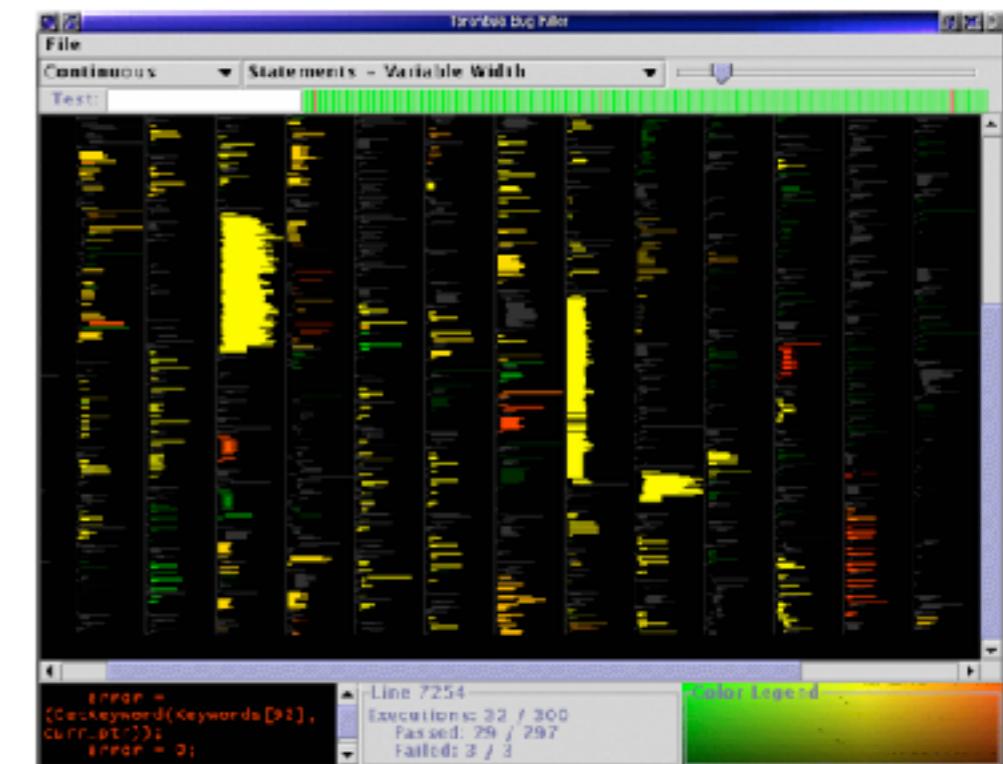
Andreas Zeller and Ralf Hildebrandt. [Simplifying and Isolating Failure-Inducing Input](#). *IEEE Transactions on Software Engineering* 28(2), February 2002, pp. 183-200.

# Compare faulty & unfaulty execution traces

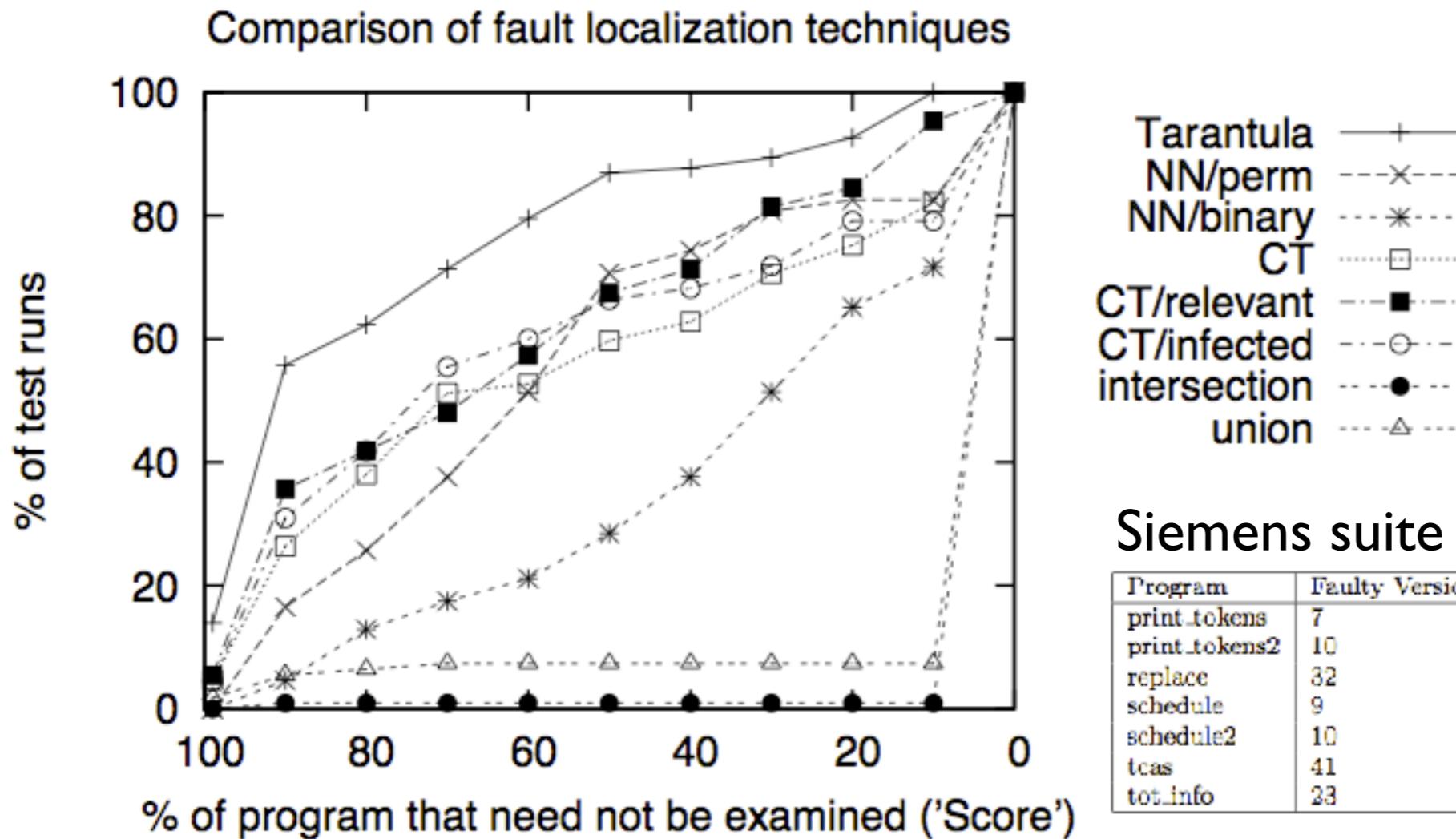
- Idea: bugs caused by executing buggy statements  
Find buggy statements executed **mostly** on failing tests (color red)

		Test Cases					
		3,3,5	1,2,3	3,2,1	5,5,5	5,3,4	2,1,3
		P	P	P	P	P	F
1:	mid()						
1:	int x, y, z, m;						
1:	read("Enter 3 numbers:",x,y,z);	●	●	●	●	●	●
2:	m = z;	●	●	●	●	●	●
3:	if (y < z)	●	●	●	●	●	●
4:	if (x < y)			●			
5:	m = y;			●			
6:	else if (x < z)	●			●	●	
7:	m = y;	●				●	
8:	else	●		●	●		
9:	if (x > y)			●			
10:	m = y;			●			
11:	else if (x > z)						
12:	m = x;						
13:	print("Middle number is:",m);	●	●	●	●	●	●
	}						
		Pass/Fail Status					
		P	P	P	P	P	F

$$\begin{aligned}
 \text{suspiciousness}(e) &= 1 - \text{hue}(e) = \\
 &= \frac{\text{failed}(e)}{\text{totalfailed}} \\
 &= \frac{\text{passed}(e)}{\text{totalpassed}} + \frac{\text{failed}(e)}{\text{totalfailed}}
 \end{aligned}$$



# Compare faulty & unfaulty execution traces



## Siemens suite of fault localization programs

Program	Faulty Versions	Procedures	LOC	Test Cases	Description
print_tokens	7	20	472	4056	lexical analyzer
print_tokens2	10	21	399	4071	lexical analyzer
replace	32	21	512	5542	pattern replacement
schedule	9	18	292	2650	priority scheduler
schedule2	10	16	301	2680	priority scheduler
tcas	41	8	141	1578	altitude separation
tot_info	23	16	140	1054	information measure

- Tarantula - frequency of failing runs relative to passing runs (“suspiciousness”)  
Union:  $(U \text{ passing\_tests}) - \text{failing\_test}$   
Intersection: intersect passed test statements, subtract failing tests statements  
Nearest neighbor (NN):  $\text{failing\_test} - \text{most\_similar\_passing\_test}$   
Cause transition (CT): find smallest memory difference

James A. Jones and Mary Jean Harrold. 2005. [Empirical evaluation of the tarantula automatic fault-localization technique](#). In Proceedings of the 20th IEEE/ACM international Conference on Automated software engineering (ASE '05). ACM, New York, NY, USA, 273-282.

# Compare faulty & unfaulty execution traces

User hits bug and program crashes

Program (e.g. Microsoft Watson) logs stack trace

Stack trace sent to developers

Tool classifies trace into bug buckets

## Problems

WAY too many bug reports => way too many open bugs

=> can't spend a lot of time examining all of them

Mozilla has 35,622 open bugs plus 81,168 duplicates (in 2004)

Stack trace not good bug predictor for some systems (e.g. event based systems)

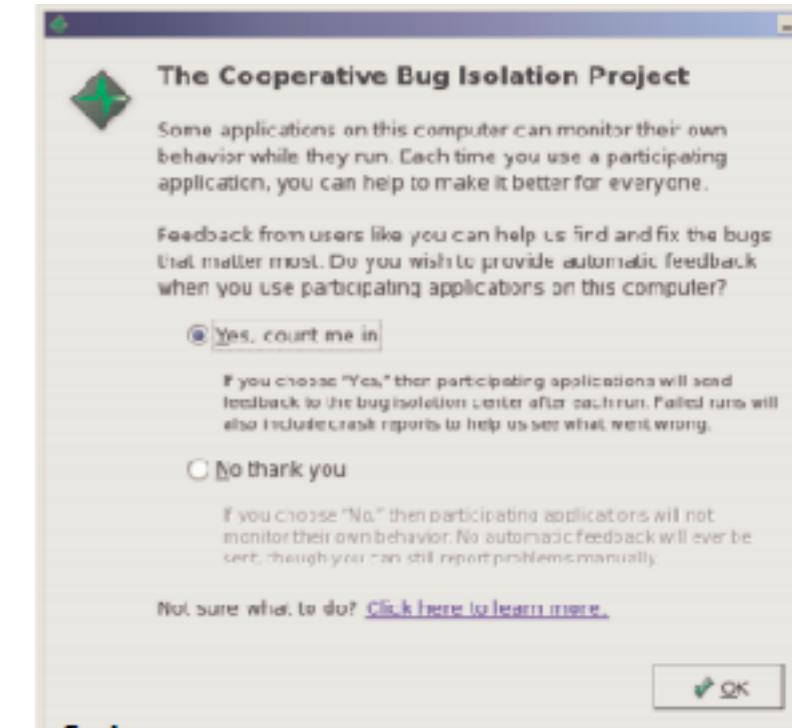
=> bugs may be in multiple buckets or multiple bugs in single bucket

Stack trace may not have enough information to debug

=> hard to find the problem to fix

# Compare faulty & unfaulty execution traces

- Program runs on user computer
  - Crashes or exhibits bug (failure)
  - Exits without exhibiting bug (success)
- Counters count # times predicates hit
  - Counters sent back to developer for failing and successful runs
- Statistical debugging finds predicates that predict bugs
  - 100,000s to millions of predicates for small applications
  - Finds the best bug predicting predicates amongst these
- Problems to solve
  - Reports shouldn't overuse network bandwidth (esp ~2003)
  - Logging shouldn't kill performance
  - Interesting predicates need to be logged (fair sampling)
  - Find good bug predictors from runs
  - Handle multiple bugs in failure runs



Ben Liblit. (2005). Cooperative bug isolation. Dissertation, UC Berkeley.

# Compare faulty & unfaulty execution traces

- Predictor of what statements are related to a bug:  
 $\text{Fail}(P) - \text{Context}(P)$   
 $\Pr(\text{Crash} \mid P \text{ observed to be true}) - \Pr(\text{Crash} \mid P \text{ observed at all})$
- Example of a “likelihood ratio test”
- Comparing two hypotheses
- 1. Null Hypothesis:  $\text{Fail}(P) \leq \text{Context}(P)$   
 $\text{Alpha} \leq \text{Beta}$
- 2. Alternative Hypothesis:  $\text{Fail}(P) > \text{Context}(P)$   
 $\text{Alpha} > \text{Beta}$

# Traverse dependencies

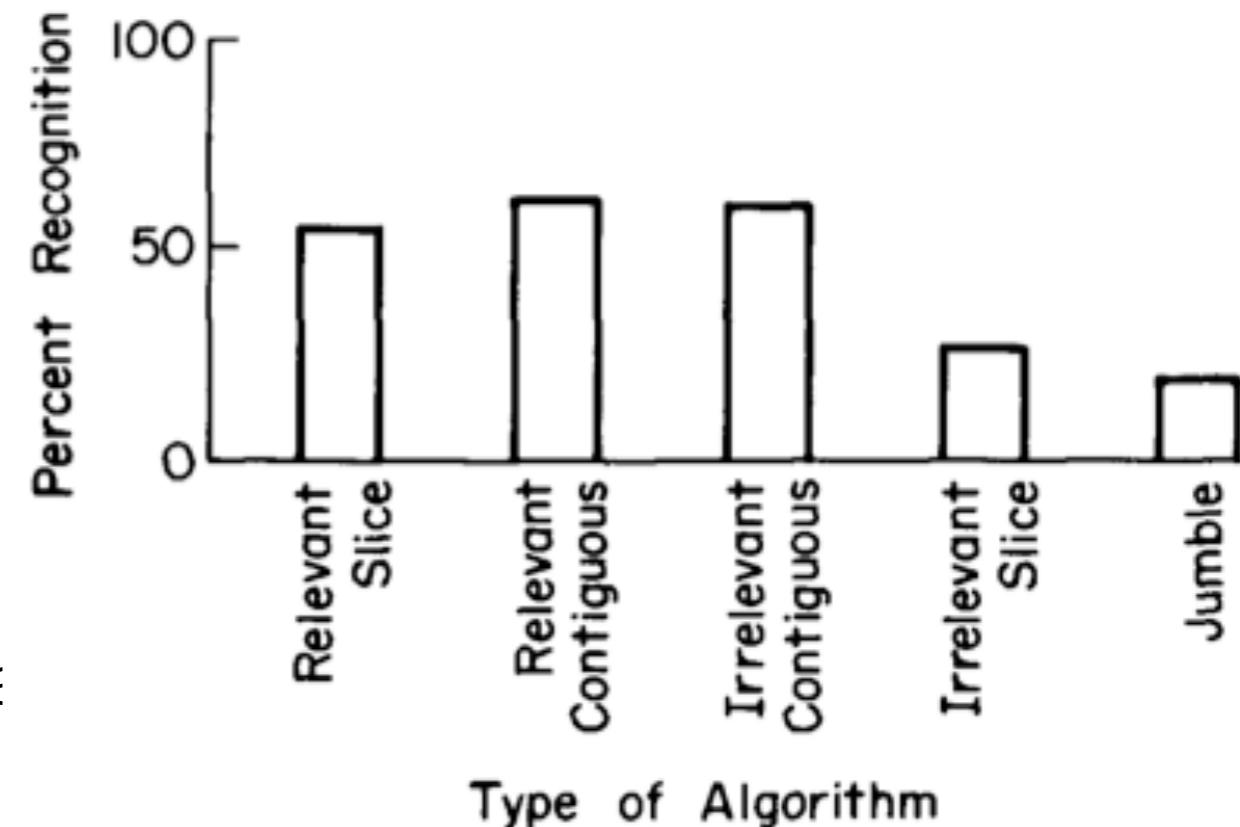
- Slice
  - Subset of the program that is responsible for computing the value of a variable at a program point
- Backwards slice
  - Transitive closure of all statements that have a control or data dependency
- Originally formulated as **subset** of program
- Later formulations emphasize ability to **traverse** control & data dependencies (e.g., WhyLine)

# Traverse control & data dependencies backwards

- ```
BEGIN
  READ(X, Y)
  TOTAL := 0.0
  SUM := 0.0
  IF X <= 1
    THEN SUM := Y
    ELSE BEGIN
      READ(Z)
      TOTAL := X * Y
    END
  WRITE(TOTAL, SUM)
END
```
- (Static) slice - subset of the program values at a program point
- Slice on variable Z at 12

Participants performed 3 debugging tasks on short code snippets

Asked to recognize code snippets afterwards



Mark Weiser. 1982. [Programmers use slices when debugging](#). Commun. ACM 25, 7 (July 1982), 446-452.

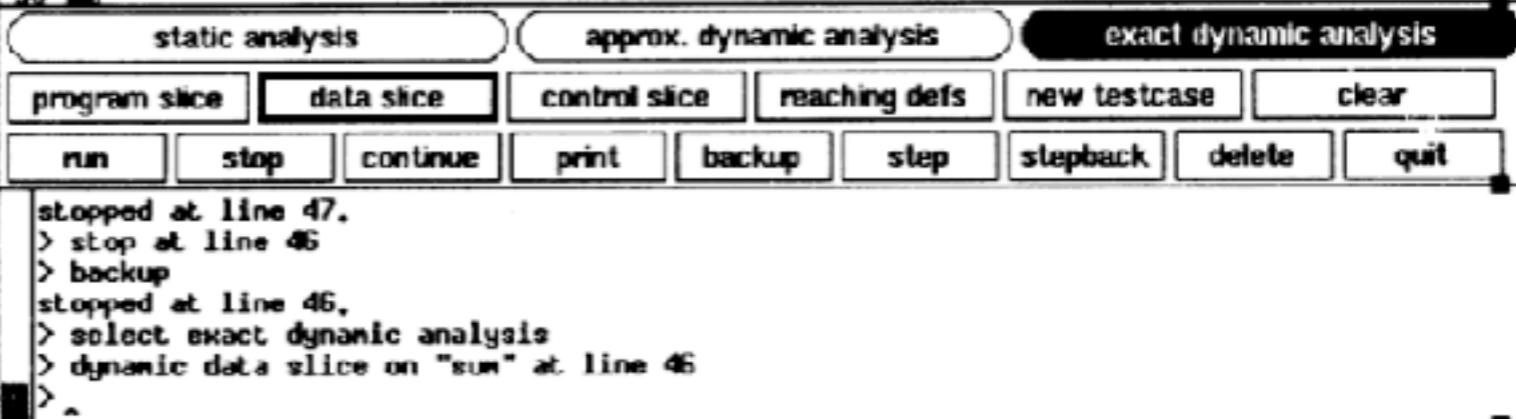
# Slicers debug faster

- Students debugging 100 LOC C++ programs
- Students given
  - Programming environment
  - Hardcopy input, wrong output, correct output
  - Files with program & input
- Compared students instructed to slice against everyone else
  - Excluding students who naturally use slicing strategy
- Slicers debug significantly faster (65.29 minutes vs. 30.16 minutes)

Francel M. A. and S. Rugaber (2001). [The Value of Slicing While Debugging](#), *Science of Computer Programming*, 40(2-3), 151-169.

# Dynamic slicing

```
/u17/ha/v2/demo/example.bug.c
1  /* Find the sum of areas of given triangles. */
2  #define MAX 100
3  typedef enum {isosceles, equilateral, right, scalene} class_type;
4  typedef struct {int a, b, c;} triangle_type;
5
6  main()
7  {
8      triangle_type sides[MAX];
9      class_type class;
10     int a_sqr, b_sqr, c_sqr, N, i;
11     double area, sum, s, sqrt();
12
13     printf("Enter number of triangles:\n");
14     scanf("%d", &N);
15     for (i = 0; i < N; i++) {
16         printf("Enter three sides of triangle %d in ascending order:\n", i+1);
17         scanf("%d %d %d", &sides[i].a, &sides[i].b, &sides[i].c);
18     }
19
20     sum = 0;
21     i = 0;
22     while (i < N) {
23         a_sqr = sides[i].a * sides[i].a;
24         b_sqr = sides[i].b * sides[i].b;
25         c_sqr = sides[i].c * sides[i].c;
26         if ((sides[i].a == sides[i].b) && (sides[i].b == sides[i].c))
27             class = equilateral;
28         else if ((sides[i].a == sides[i].b) || (sides[i].b == sides[i].c))
29             class = isosceles;
30         else if (a_sqr == b_sqr + c_sqr)
31             class = right;
32         else class = scalene;
33
34         if (class == right)
35             area = sides[i].b * sides[i].c / 2.0;
36         else if (class == equilateral)
37             area = sides[i].a * sides[i].a * sqrt(3.0) / 4.0;
38         else {
39             s = (sides[i].a + sides[i].b + sides[i].c) / 2.0;
40             area = sqrt(s * (s - sides[i].a) * (s - sides[i].b) *
41                           (s - sides[i].c));
42         }
43         sum += area;
44         i += 1;
45     }
46     printf("Sum of areas of the %d triangles is %.2f.\n", N, sum);
47 }
48
49
50
```



Hiralal Agrawal, Richard A. Demillo, and Eugene H. Spafford. 1993. [Debugging with dynamic slicing and backtracking](#). Softw. Pract. Exper. 23, 6 (June 1993), 589-616.