

Lightweight Fault Localization Using Multiple Coverage Types

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Presenter supported by SIGSOFT CAPS



Previous Research and Limitations

Techniques based on **coverage**

- o **Tarantula** [Jones, Harrold et al. ICSE 2002, ASE 2005, ISSTA 2007, ICSE 2008]
- o **Nearest Neighbors** [Renieris, Reiss ASE 2003]
- o **SBI** [Liblit, Naik, Zheng, Aiken, Jordan PLDI 2005]
- o **SOBER** [Liu, Yan, Fei, Han, Midkiff ESEC/FSE 2005]
- o Other **derivative** work [Abreu, Zoeteweyj, van Gemund TAIC-PART 2007] [Masri AUB-Tech.Rep. 2007]

Previous Research and Limitations

Techniques based on **coverage**

- o **Tarantula** [Jones, Harrold et al. ICSE 2002, ASE 2005, ISSTA 2007, ICSE 2008]
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- o **SBI** [Liblit, Naik, Zheng, Aiken, Jordan PLDI 2005]

o **SOFT**

o **But...**

- o Operate on **individual** coverage types (e.g., statements, branches)
- o No thorough **comparison** of the effectiveness of these coverage types

TAIC-

In This Work

- o Method and study **comparing coverage types**
 - o Statements
 - o Branches
 - o Data dependencies (du-pairs)
- o Method and study **combining coverage types**
- o Method and study **reducing overhead**
 - o Overhead of statements and branches is **10-20%**
 - o Overhead of du-pairs is **60-120%**, but du-pair coverage can be **inferred** (approximately) from branch coverage

background	compare	combine	infer	conclude
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Outline

- o Coverage-based fault localization
- o Comparing coverage types
- o Combining coverage types for effectiveness
- o Inferring du-pair coverage (approximately) to reduce overhead
- o Conclusion and future work

Coverage-based Fault Localization

```
mid() {
    int x,y,z,m;
1:read("Enter 3 integers:")
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 = z;
11:    else if (x>z)
12:        m = x;
13:print("Middle number is ")
}
```

Test suite

Runtime information

- o entities executed (covered)
- o passing/failing tests

Analysis

- o computes *suspiciousness* of each entity

Intuition: entities executed mostly by failing test cases are more suspicious than entities executed mostly by passing tests

Coverage-based Fault Localization

	t1	t2	t3	t4	t5	t6	t7	t8	t9	t10
mid() { int x,y,z,m;	3,3,5	1,2,3	3,2,2	5,5,5	1,1,4	5,3,4	3,2,1	2,1,3	5,4,2	5,2,6
1:read("Enter 3 integers:",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 = z;			•				•		•	
11: else if (x>z)				•						
12: m = x;										
13:print("Middle number is:", m);	•	•	•	•	•	•	•	•	•	•
}										
Pass/fail Status	P	P	P	P	P	P	F	F	F	F

Technique: Tarantula

$$suspiciousness(s) = \frac{\frac{failed(s)}{totalfailed}}{\frac{passed(s)}{totalpassed} + \frac{failed(s)}{totalfailed}}$$

	t1	t2	t3	t4	t5	t6	t7	t8	t9	t10	suspiciousness
<code>int x,y,z,m;</code>	3,3,5	1,2,3	3,2,2	5,5,5	1,1,4	5,3,4	3,2,1	2,1,3	5,4,2	5,2,6	
<code>1:read("Enter 3 integers:",x,y,z);</code>	•	•	•	•	•	•	•	•	•	•	0.50
<code>2:m = z;</code>	•	•	•	•	•	•	•	•	•	•	
<code>3:if (y<z)</code>	•	•	•	•	•	•	•	•	•	•	
<code>4: if (x<y)</code>	•	•	•	•	•	•	•	•	•	•	
<code>5: m = y;</code>	•	•	•	•	•	•	•	•	•	•	
<code>6: else if (x<z)</code>	•	•	•	•	•	•	•	•	•	•	
<code>7: m = y;</code>	•	•	•	•	•	•	•	•	•	•	
<code>8:else</code>	•	•	•	•	•	•	•	•	•	•	
<code>9: if (x>y)</code>	•	•	•	•	•	•	•	•	•	•	
<code>10: m = z;</code>	•	•	•	•	•	•	•	•	•	•	
<code>11: else if (x>z)</code>	•	•	•	•	•	•	•	•	•	•	
<code>12: m = x;</code>	•	•	•	•	•	•	•	•	•	•	
<code>13:print("Middle number is:", m);</code>	•	•	•	•	•	•	•	•	•	•	
<code>}</code>											
Pass/fail Status	P	P	P	P	P	P	F	F	F	F	

$$susp(1) = \frac{\frac{4}{6}}{\frac{4}{6} + \frac{4}{4}} = 0.50$$

Technique: Tarantula

$$suspiciousness(s) = \frac{\frac{failed(s)}{totalfailed}}{\frac{passed(s)}{totalpassed} + \frac{failed(s)}{totalfailed}}$$

	t1	t2	t3	t4	t5	t6	t7	t8	t9	t10	suspiciousness
	3,3,5	1,2,3	3,2,2	5,5,5	1,1,4	5,3,4	3,2,1	2,1,3	5,4,2	5,2,6	
1:read("Enter 3 integers:",x,y,z);	•	•	•	•	•	•	•	•	•	•	0.50
2:m = z;	•	•	•	•	•	•	•	•	•	•	
3:if (y<z)	•	•	•	•	•	•	•	•	•	•	
4: if (x<y)	•	•	•	•	•	•	•	•	•	•	
5: m = y;	•	•	•	•	•	•	•	•	•	•	
6: else if (x<z)	•	•	•	•	•	•	•	•	•	•	
7: m = y;	•	•	•	•	•	•	•	•	•	•	0.60
8:else	•	•	•	•	•	•	•	•	•	•	
9: if (x>y)	•	•	•	•	•	•	•	•	•	•	
10: m = z;	•	•	•	•	•	•	•	•	•	•	
11: else if (x>z)	•	•	•	•	•	•	•	•	•	•	
12: m = x;	•	•	•	•	•	•	•	•	•	•	
13:print("Middle number is:", m);	•	•	•	•	•	•	•	•	•	•	
}	•	•	•	•	•	•	•	•	•	•	
Pass/fail Status	P	P	P	P	P	P	F	F	F	F	

$$susp(7) = \frac{\frac{2}{4}}{\frac{2}{6} + \frac{2}{4}} = 0.60$$

Technique: Tarantula

$$suspiciousness(s) = \frac{\frac{failed(s)}{total\ failed}}{\frac{passed(s)}{total\ passed} + \frac{failed(s)}{total\ failed}}$$

	t1	t2	t3	t4	t5	t6	t7	t8	t9	t10	suspiciousness
<code>int x,y,z,m;</code>	3,3,5	1,2,3	3,2,2	5,5,5	1,1,4	5,3,4	3,2,1	2,1,3	5,4,2	5,2,6	
<code>1:read("Enter 3 integers:",x,y,z);</code>	•	•	•	•	•	•	•	•	•	•	0.50
<code>2:m = z;</code>	•	•	•	•	•	•	•	•	•	•	0.50
<code>3:if (y<z)</code>	•	•	•	•	•	•	•	•	•	•	0.50
<code>4: if (x<y)</code>	•	•			•	•		•		•	0.43
<code>5: m = y;</code>		•									0.00
<code>6: else if (x<z)</code>	•				•	•		•		•	0.50
<code>7: m = y;</code>	•				•			•		•	0.60
<code>8:else</code>			•	•			•		•		0.60
<code>9: if (x>y)</code>			•	•			•		•		0.60
<code>10: m = z;</code>			•				•		•		0.75
<code>11: else if (x>z)</code>				•							0.00
<code>12: m = x;</code>											0.00
<code>13:print("Middle number is:", m);</code>	•	•	•	•	•	•	•	•	•	•	0.50
<code>}</code>											
Pass/fail Status	P	P	P	P	P	P	F	F	F	F	

Technique: Tarantula

	t1	t2	t3	t4	t5	t6	t7	t8	t9	t10	suspiciousness	rank
$\text{suspiciousness}(s) = \frac{\frac{\text{failed}(s)}{\text{total failed}}}{\frac{\text{passed}(s)}{\text{total passed}} + \frac{\text{failed}(s)}{\text{total failed}}}$												
<code>int x,y,z,m;</code>	3,3,5	1,2,3	3,2,2	5,5,5	1,1,4	5,3,4	3,2,1	2,1,3	5,4,2	5,2,6		
<code>1:read("Enter 3 integers:",x,y,z);</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>2:m = z;</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>3:if (y<z)</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>4: if (x<y)</code>	•	•			•	•		•		•	0.43	10
<code>5: m = y;</code>		•									0.00	13
<code>6: else if (x<z)</code>	•				•	•		•		•	0.50	9
<code>7: m = y;</code>	•				•			•		•	0.60	4
<code>8:else</code>			•	•			•		•		0.60	4
<code>9: if (x>y)</code>			•	•			•		•		0.60	4
<code>10: m = z;</code>			•				•		•		0.75	1
<code>11: else if (x>z)</code>				•							0.00	13
<code>12: m = x;</code>											0.00	13
<code>13:print("Middle number is:", m);</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>}</code>												
Pass/fail Status	P	P	P	P	P	P	F	F	F	F		

Technique: Tarantula

$$suspiciousness(s) = \frac{\frac{failed(s)}{totalfailed}}{\frac{passed(s)}{totalpassed} + \frac{failed(s)}{totalfailed}}$$

	t1	t2	t3	t4	t5	t6	t7	t8	t9	t10	suspiciousness	rank
<code>int x,y,z,m;</code>	3,3,5	1,2,3	3,2,2	5,5,5	1,1,4	5,3,4	3,2,1	2,1,3	5,4,2	5,2,6		
<code>1:read("Enter 3 integers:",x,y,z);</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>2:m = z;</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>3:if (y<z)</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>4: if (x<y)</code>	•	•			•	•		•		•	0.43	10
<code>5: m = y;</code>		•									0.50	13
<code>6: else if (x<z)</code>	•										0.50	9
<code>7: m = y;</code>	•										0.50	4
<code>8:else</code>											0.50	4
<code>9: if (x>y)</code>			•	•			•	•	•	•	0.60	4
<code>10: m = z; //bug;correct m=y</code>			•				•		•		0.75	1
<code>11: else if (x>z)</code>				•							0.00	13
<code>12: m = x;</code>											0.00	13
<code>13:print("Middle number is:", m);</code>	•	•	•	•	•	•	•	•	•	•	0.50	9
<code>}</code>												
Pass/fail Status	P	P	P	P	P	P	F	F	F	F		

cost metric

1/13 statements
(7.7%)

Comparing Multiple Coverage Types

Statements

```

mid(): int x,y,z,m;
1.  read(x,y,z);
2.  m = z;
3.  if (y<z)
4.    if (x<y)
5.      m = y;
6.    else if (x<z)
7.      m = x;
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13. print(m);

```

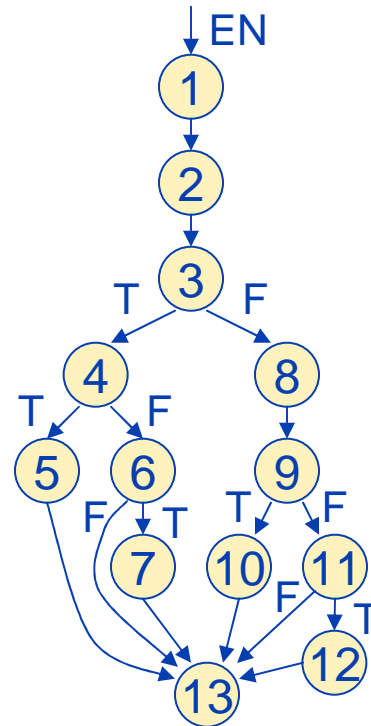
Execution

statement coverage

Tarantula

statement scores, ranking

Branches



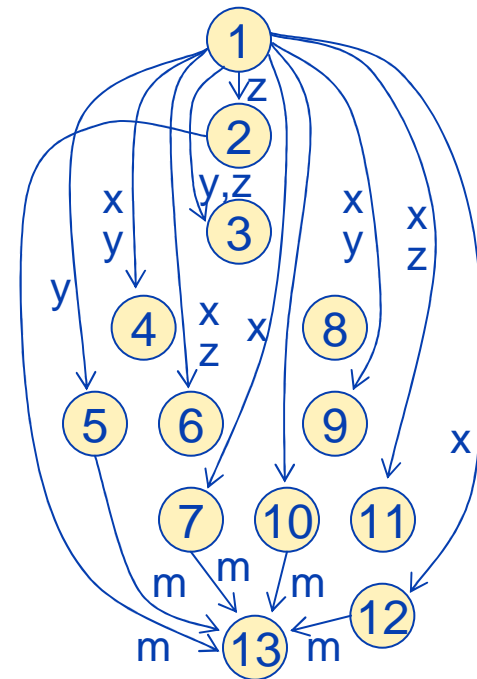
Execution

branch coverage

Tarantula

branch scores, ranking

DU-pairs



Execution

du-pair coverage

Tarantula

du-pair scores, ranking

Comparing Multiple Coverage Types

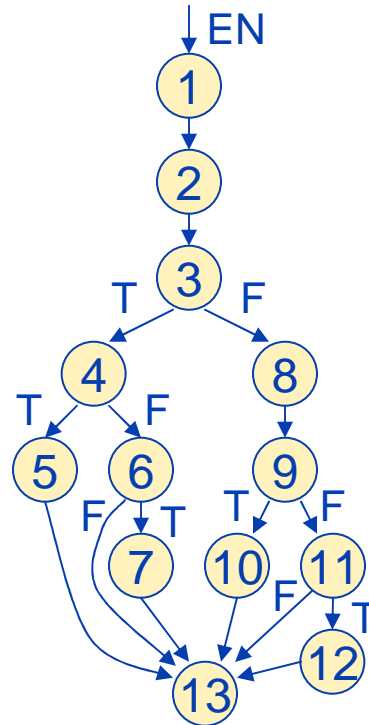
Statements

```

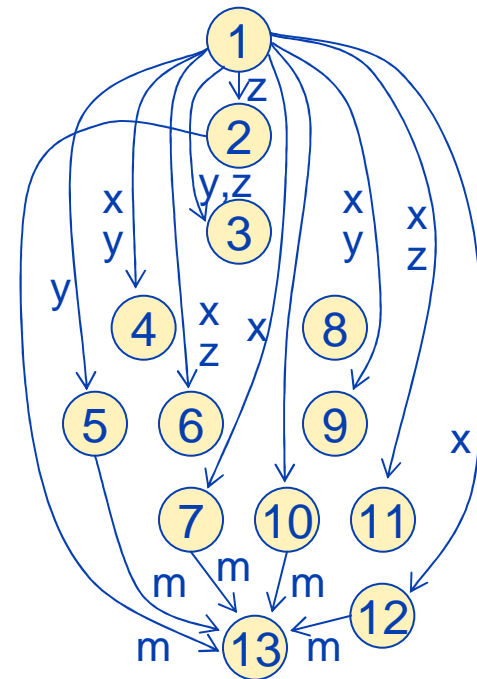
mid(): int x,y,z,m;
1.  read(x,y,z);
2.  m = z;
3.  if (y<z)
4.    if (x<y)
5.      m = y;
6.    else if (x<z)
7.      m = x;
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13. print(m);

```

Branches



DU-pairs



Execution

statement coverage

Tarantula

statement scores, ranking

Execution

branch coverage

Tarantula

branch scores, ranking

Execution

du-pair coverage

Tarantula

du-pair scores, ranking



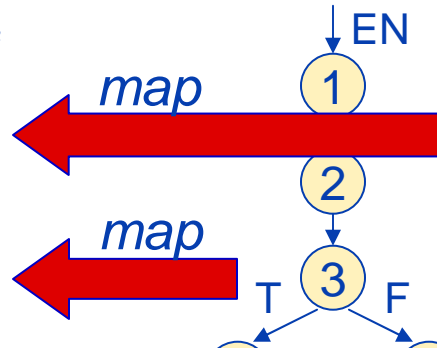
Comparing Multiple Coverage Types

Statements

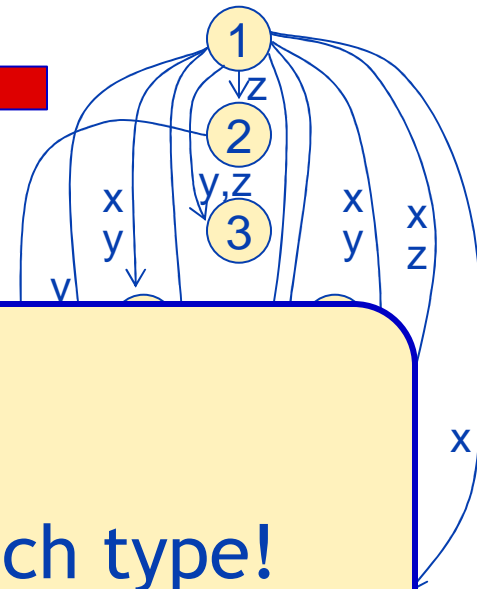
```

mid(): int x,y,z,m;
1. read(x,y,z);
2. m = z;
3. if (y<z)
4.   if (x<y)
5.     m = y;
6.   else if (x<z)
7.
8. e
9.
10.
11.
12.
13. pr
    
```

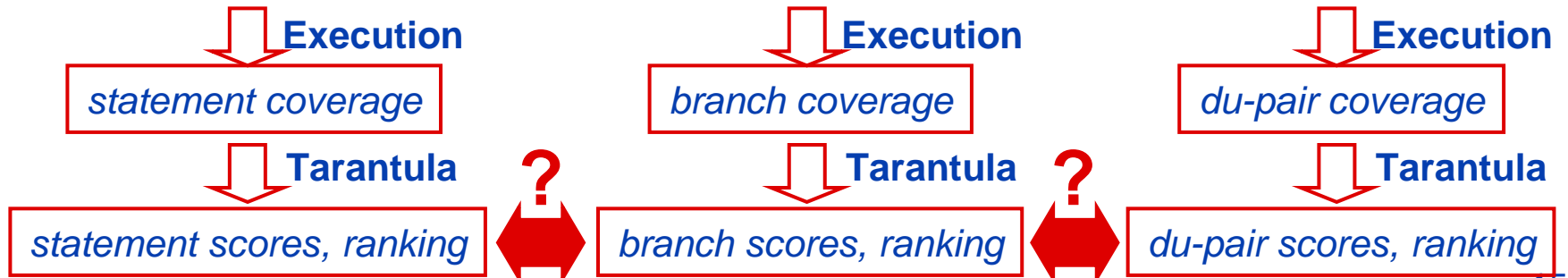
Branches



DU-pairs



Solution
Statement ranking for each type!



Branch, Du-pair Mappings

1. **Gather** branch (du-pair) coverage
2. **Compute suspiciousness** for each branch (du-pair)
3. **Map** branches (du-pairs) to statements
4. **Transfer** suspiciousness scores of branches (du-pairs) to corresponding statements
5. **Rank** statements using the transferred suspiciousness scores

Result: statement rankings based on branches (du-pairs)

Experiment 1

Goal: compare individual coverage types

Setup

- o Coverage tool: **DUA-Forensics** [Santelices, Harrold ASE 2007]
 - o Target language: **Java bytecode**
 - o Monitors **statements, branches, and du-pairs**
- o Fault-localization tool: **Tarantula with Mapper**
- o Measure of **cost**: % of statements visited to reach **first** faulty statement

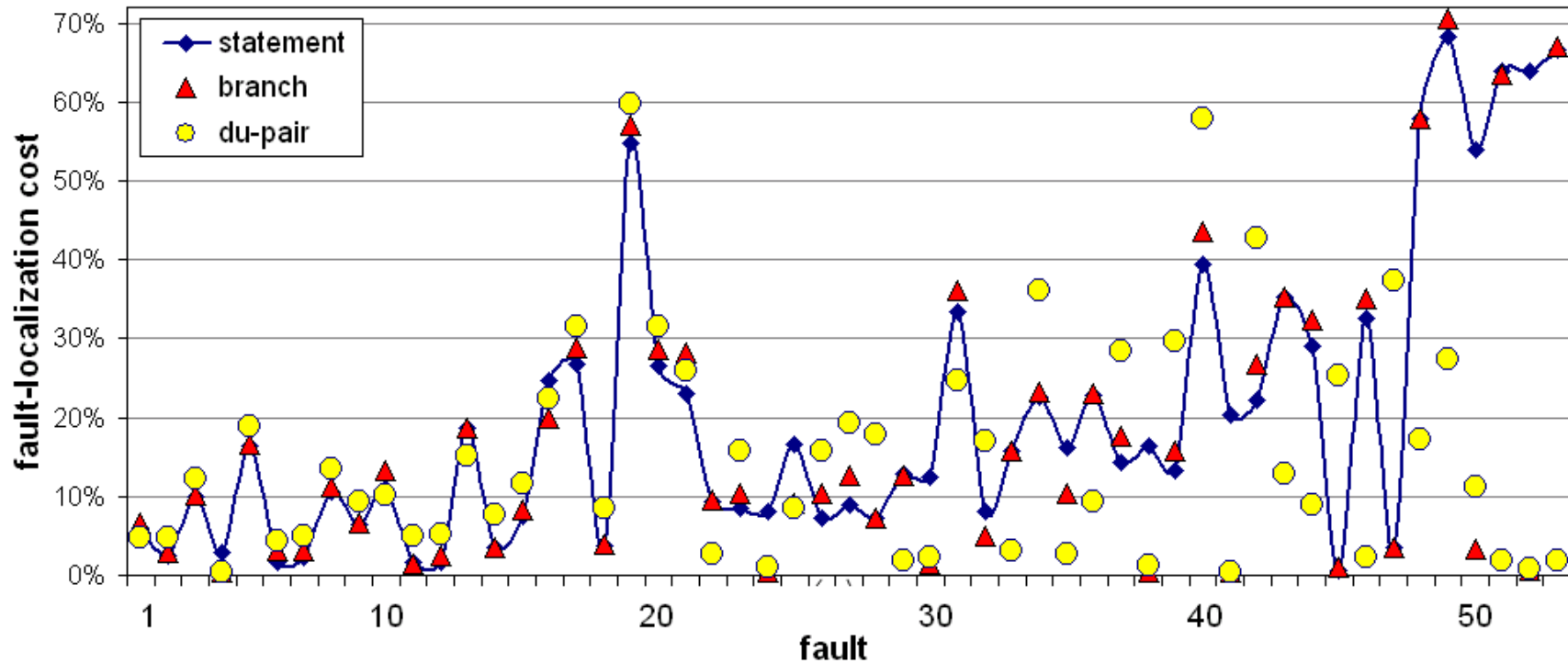
Experiment 1: Subjects

- o Siemens suite translated to Java
- o NanoXML
- o XML-Security
- o JABA
- o Total: **14** subjects

subject	LOC	tests	faults
Tcas	131	1608	10
Tot_info	283	1052	10
Schedule1	290	2650	9
Schedule2	317	2710	7
Print_tokens1	478	4130	5
Print_tokens2	410	4115	10
NanoXML v1	3497	214	7
NanoXML v2	4009	214	7
NanoXML v3	4608	216	8
NanoXML v5	4782	216	7
XML-security v1	21613	92	7
XML-security v2	22318	94	7
XML-security v3	19895	84	2
JABA	37966	677	11
TOTAL FAULTS			107

Experiment 1: Results

Faults with most different costs (>1% between best and worst coverage type)

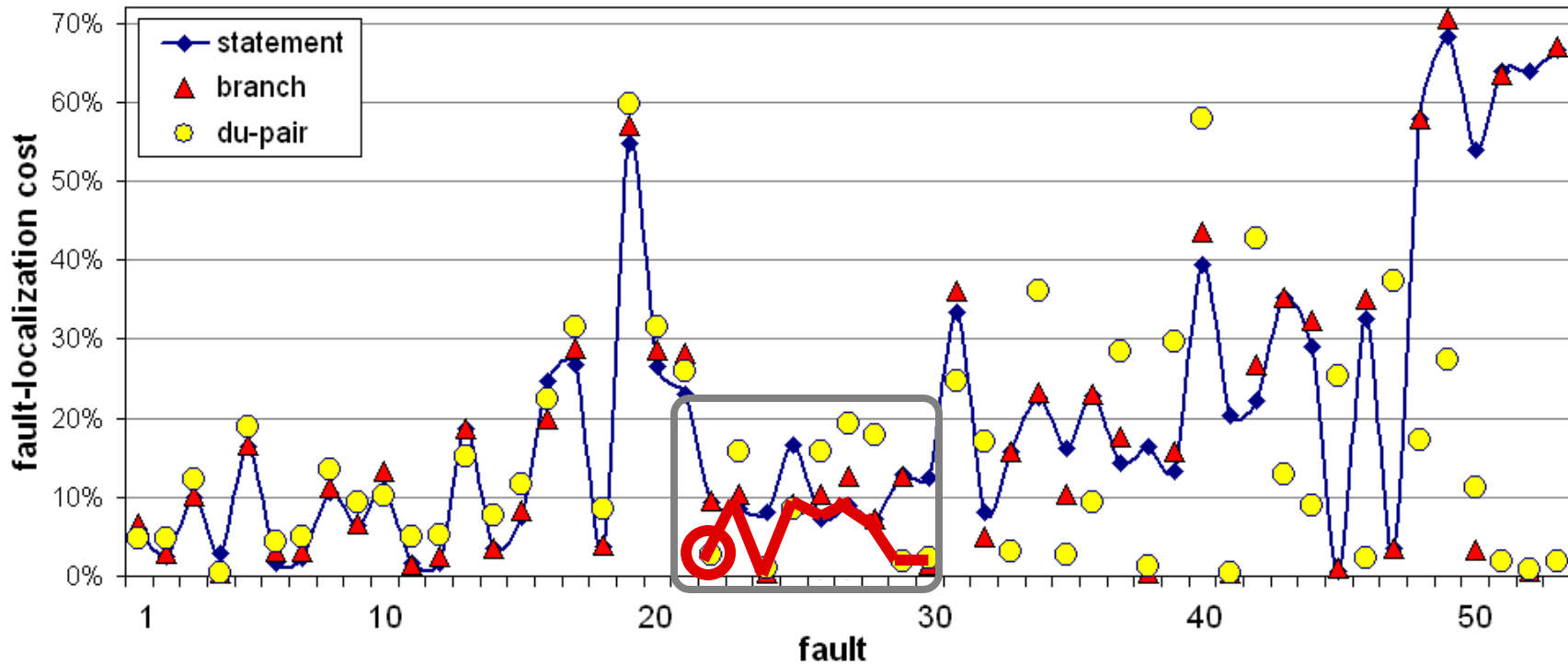


For all
107 faults:

measure	statement	branch	du-pair
average cost	11.49%	10.24%	9.02%
standard dev.	16.25%	15.40%	12.04%

Experiment 1: Results

Faults with most different costs (>1% between best and worst coverage type)

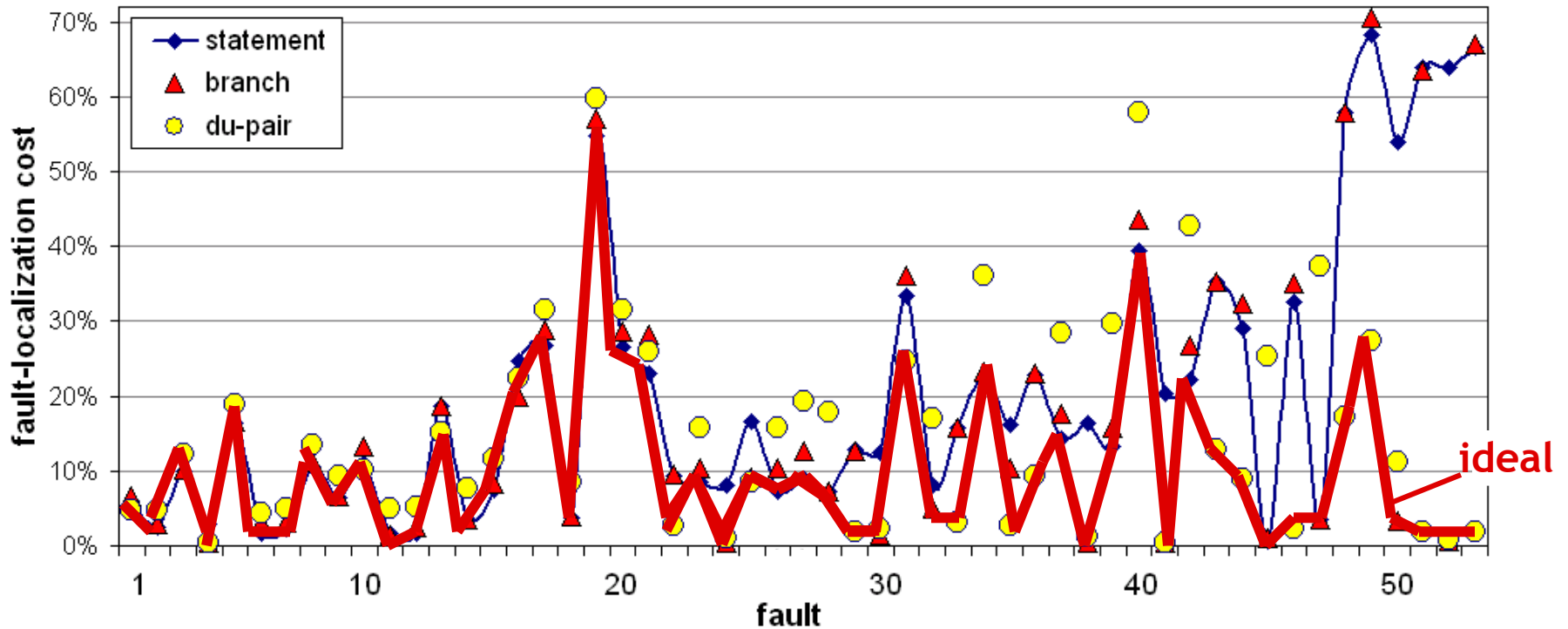


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Experiment 1: Results

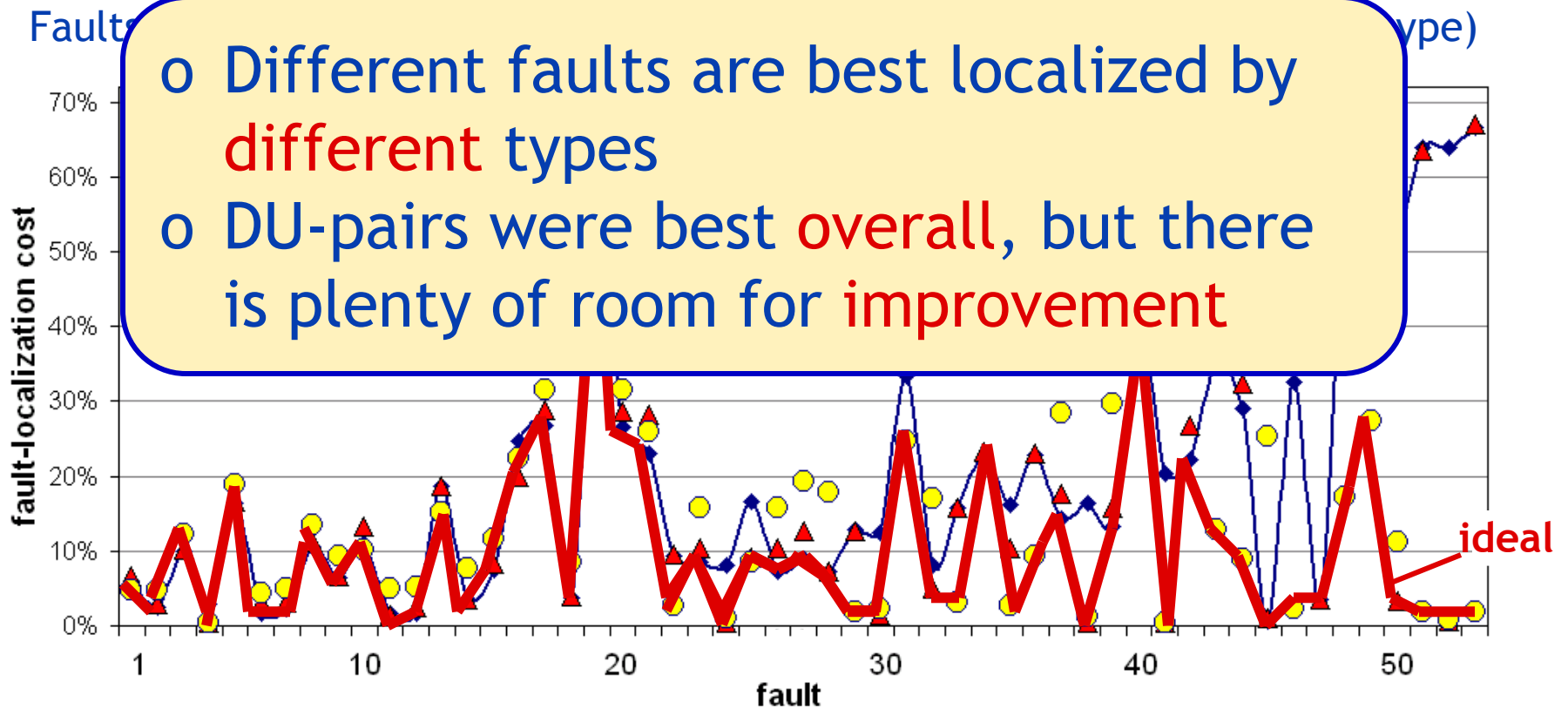
Faults with most different costs (>1% between best and worst coverage type)



For all
107 faults:

measure	statement	branch	du-pair	ideal
average cost	11.49%	10.24%	9.02%	6.35%
standard dev.	16.25%	15.40%	12.04%	9.27%

Experiment 1: Results



For all
107 faults:

measure	statement	branch	du-pair	ideal
average cost	11.49%	10.24%	9.02%	6.35%
standard dev.	16.25%	15.40%	12.04%	9.27%

Combining Coverage Types

Statements

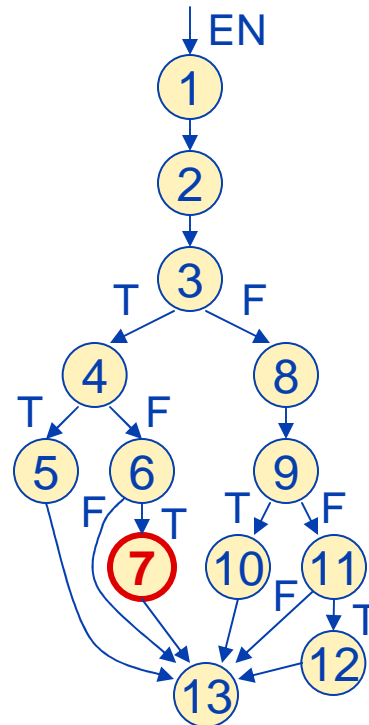
```

mid(): int x,y,z,m;
1.  read(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; // m = x
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13. print(m);

```

fault

Branches



DU-pairs

Combining Coverage Types

Statements

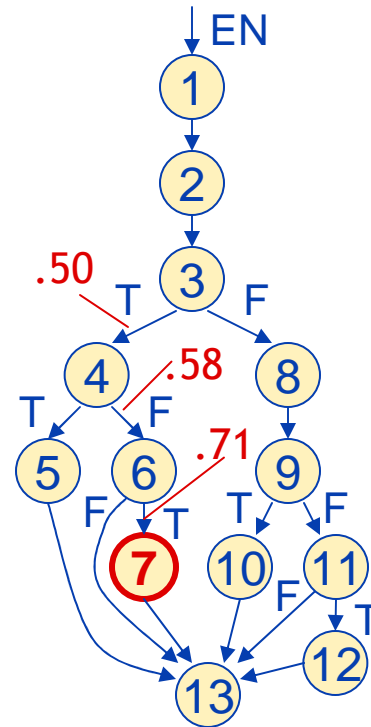
```

mid(): int x,y,z,m;
1.  read(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; // m = x
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13. print(m);

```

fault

Branches



DU-pairs

stmt.	score	rank
6	.71	2
7	.71	2

Combining Coverage Types

Statements

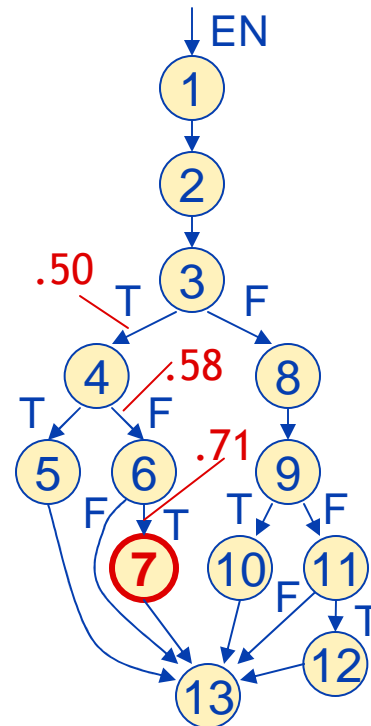
```

mid(): int x,y,z,m;
1.  read(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; // m = x
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9.    if (x>y)
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11.   else if (x>z)
12.     m = x;
13.  print(m);

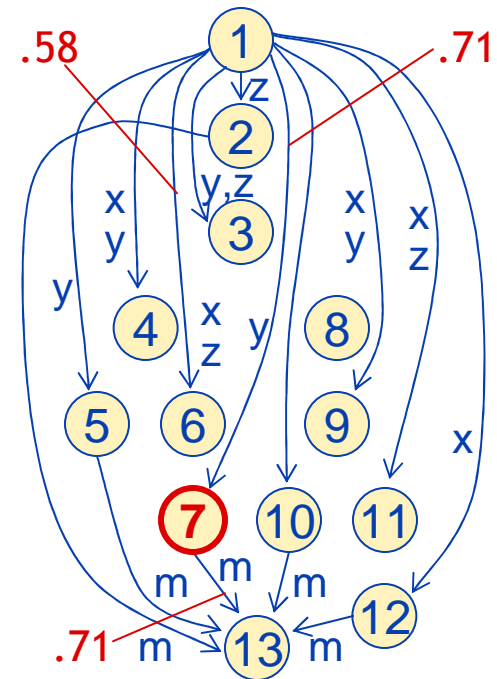
```

fault

Branches



DU-pairs



stmt.	score	rank
6	.71	2
7	.71	2

Combining Coverage Types

Statements

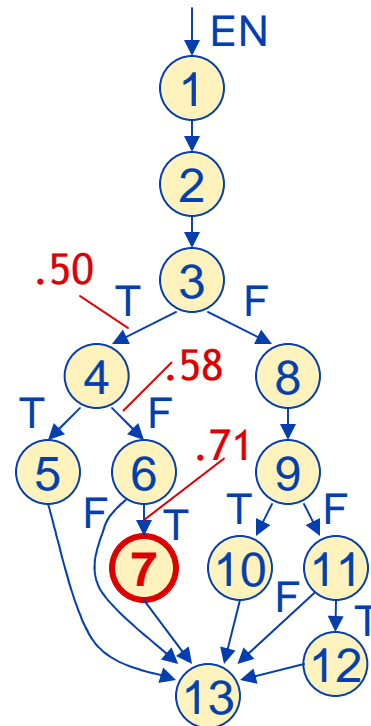
```

mid(): int x,y,z,m;
1.  read(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; // m = x
8.  else
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13.  print(m);

```

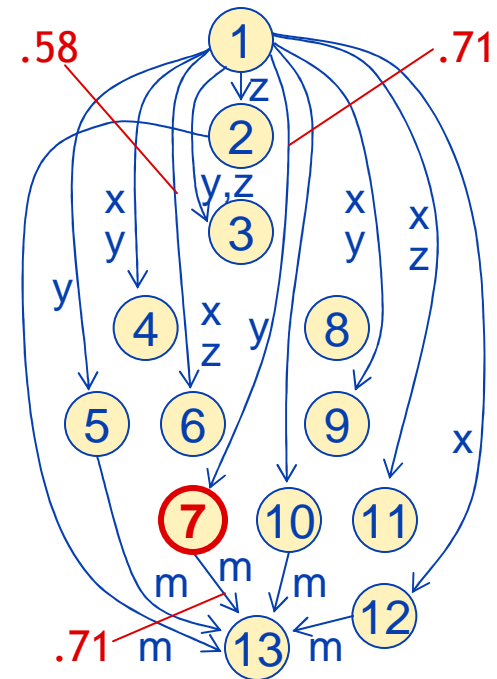
fault

Branches



stmt.	score	rank
6	.71	2
7	.71	2

DU-pairs



stmt.	score	rank
1	.71	3
7	.71	3
13	.71	3

Combining Coverage Types

Statements

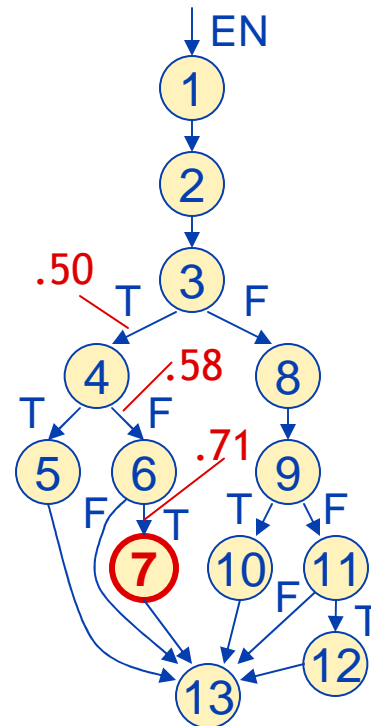
```

mid(): int x,y,z,m;
1.  read(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; // m = x fault
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13.  print(m);

```

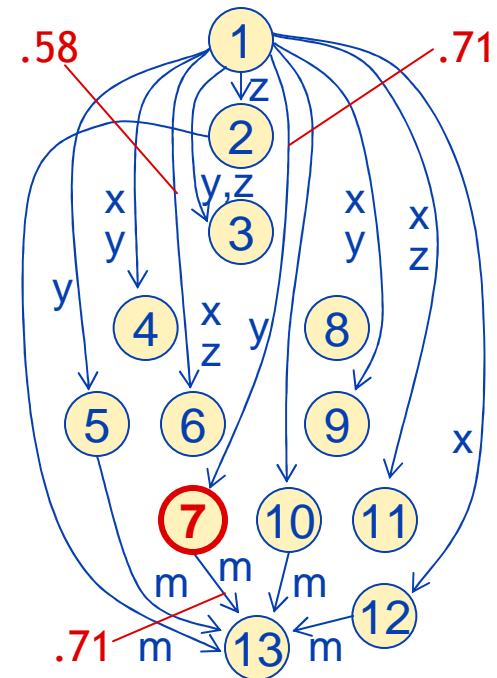
stmt.	average score	rank
1	$(.50+.71)/2$	
6		
7		
13		

Branches



stmt.	score	rank
6	.71	2
7	.71	2

DU-pairs



stmt.	score	rank
1	.71	3
7	.71	3
13	.71	3

Combining Coverage Types

Statements

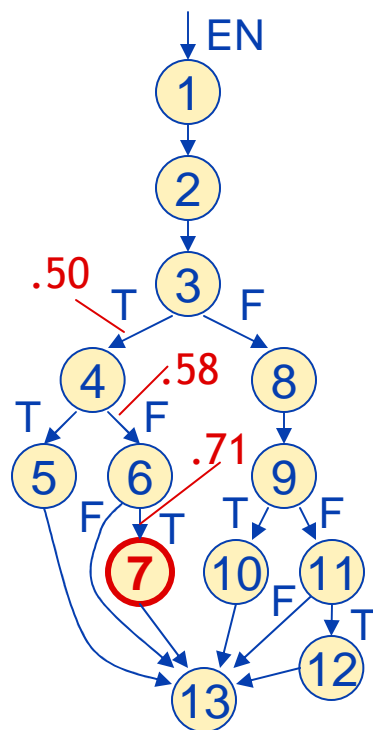
```

mid(): int x,y,z,m;
1.  read(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; // m = x fault
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13.  print(m);

```

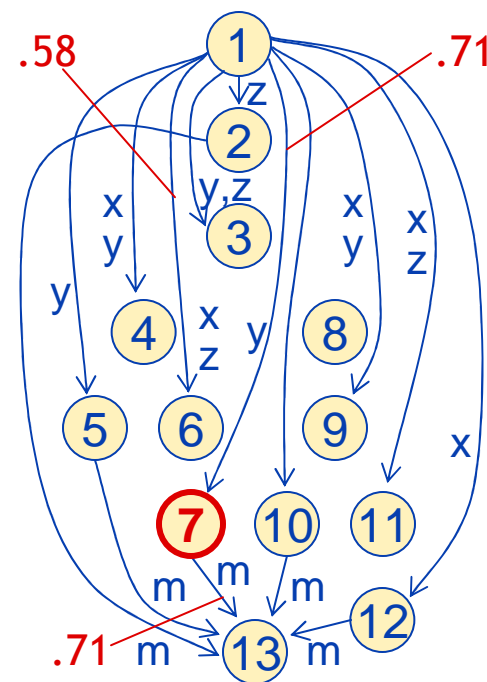
stmt.	average score	rank
1	.61	4
6	.65	2
7	.71	1
13	.56	3

Branches



stmt.	score	rank
6	.71	2
7	.71	2

DU-pairs



stmt.	score	rank
1	.71	3
7	.71	3
13	.71	3

Experiment 2

Goal: compare combinations with individual types

Setup

- o Three **combinations** of scores for statements
 - o **avg-BD**(s) = the **average** score of branches and du-pairs only, associated with s
 - o **avg-SBD**(s) = the **average** score of all statements, branches, and du-pairs associated with statement s
 - o **max-SBD**(s) = the **maximum** score of all statements, branches, and du-pairs associated with statement s
- o Same as Experiment 1: **14** subjects, **107** faults
 - o We measure the **difference** in cost with the **ideal** individual type

background

compare

combine

infer

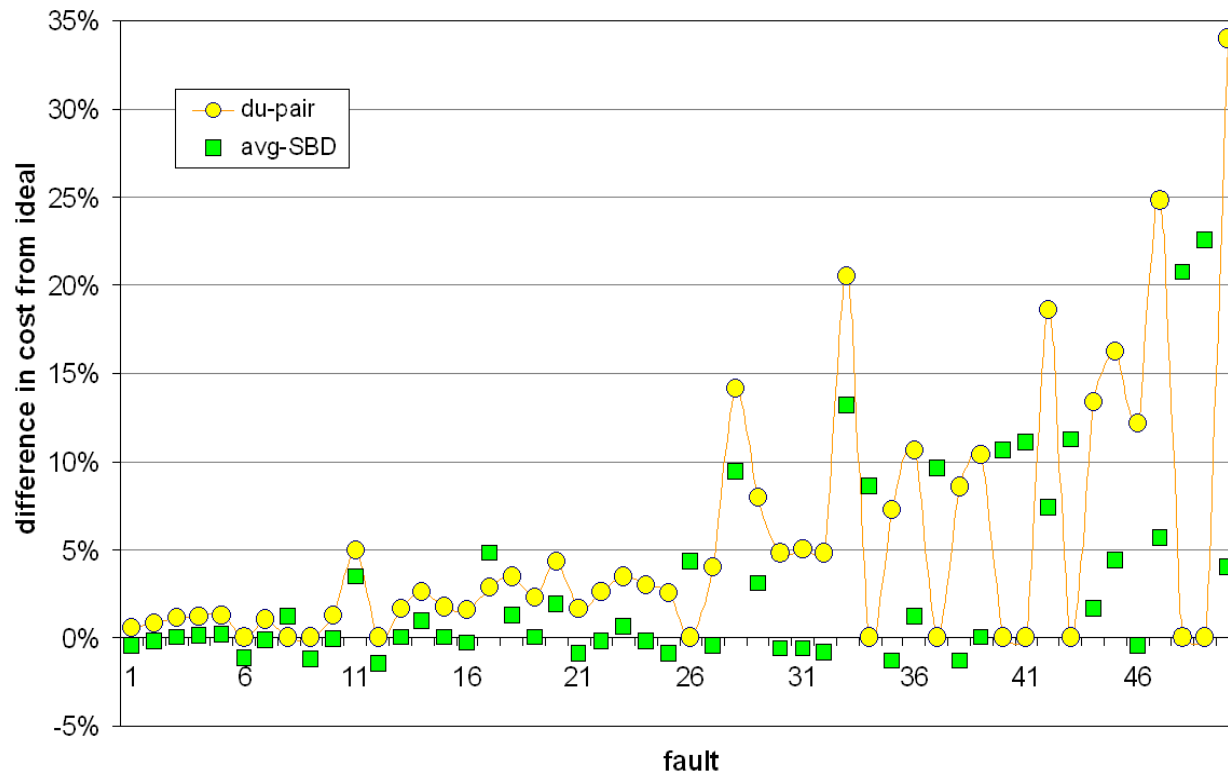
conclude

Experiment 2: Results

Difference in cost w.r.t. the **ideal individual type**

best

measure	stmt	branch	du-pair	avg-BD	avg-SBD	max-SBD
average diff	5.14%	3.89%	2.68%	1.80%	1.48%	2.77%
<i>standard dev.</i>	13.28%	11.06%	5.50%	4.66%	4.03%	5.03%



Faults with most **different** costs (>1% between *du-pair* and *avg-SBD*)

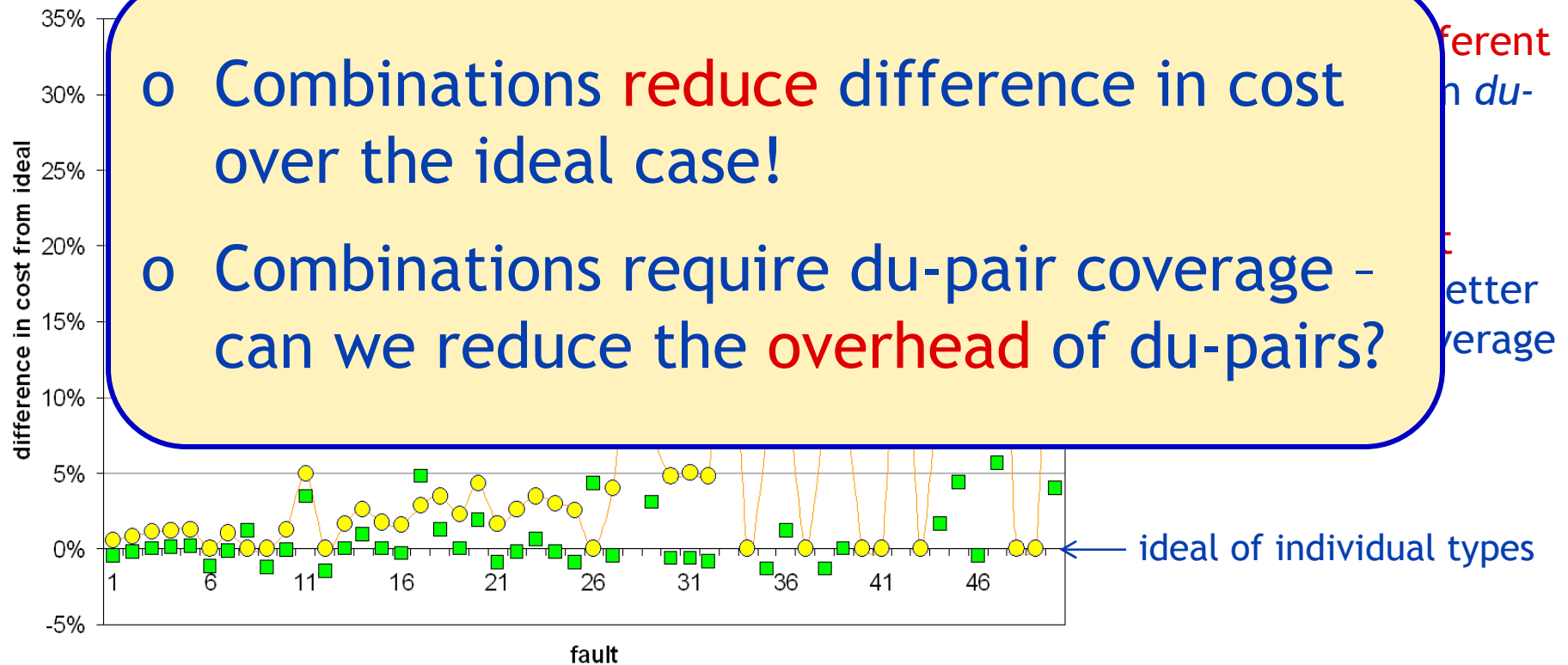
avg-SBD is the **best** combination and better than **individual** coverage types

← ideal of individual types

Experiment 2: Results

Difference in cost w.r.t. the **ideal individual type**

measure	stmt	branch	du-pair	avg-BD	best avg-SBD	max-SBD
average diff	5.14%	3.89%	2.68%	1.80%	1.48%	2.77%
<i>standard dev.</i>	13.28%	11.06%	5.50%	4.66%	4.03%	5.03%



Monitoring Overhead

Statements

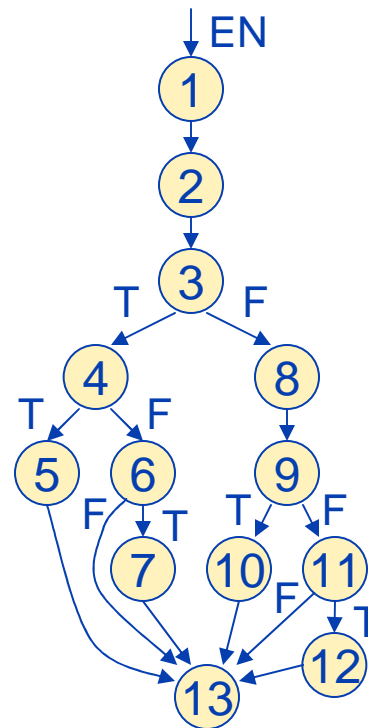
```

mid()
  int x,y,z,m;
1.  read(x,y,z);
2.  m = z;
3.  if (y<z)
4.    if (x<y)
5.      m = y;
6.    else if (x<z)
7.      m = x;
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13.  print(m);

```

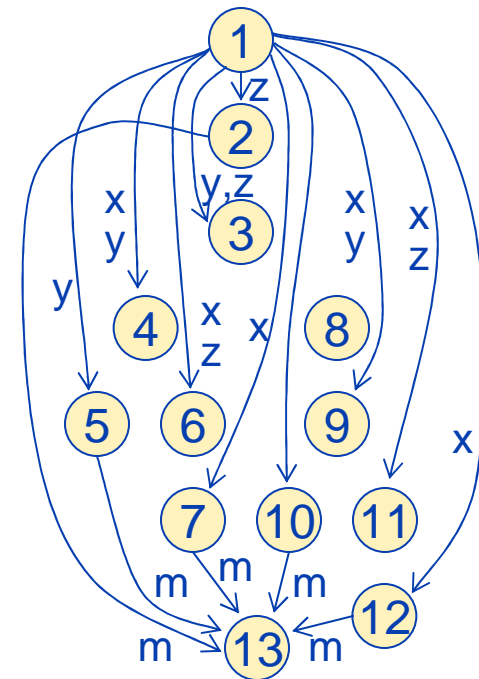
10-20% overhead

Branches



10-20% overhead

DU-pairs



60-120% overhead

Inferring DU-pair Coverage

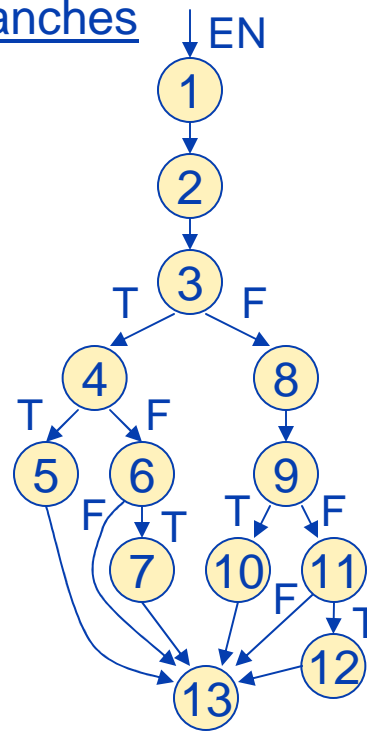
Statements

```

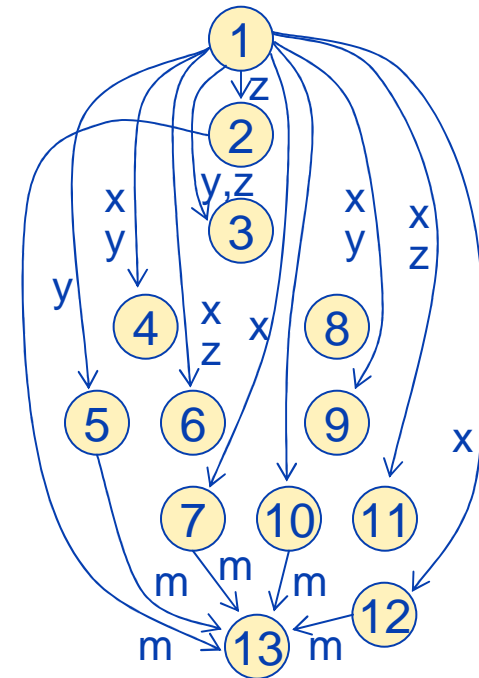
mid()
  int x,y,z,m;
1.  read(x,y,z);
2.  m = z;
3.  if (y<z)
4.    if (x<y)
5.      m = y;
6.    else if (x<z)
7.      m = x;
8.  else
9.    if (x>y)
10.     m = y;
11.   else if (x>z)
12.     m = x;
13. print(m);

```

Branches



DU-pairs



(Santelices & Harrold
ASE 2007)

Inferring DU-pair Coverage

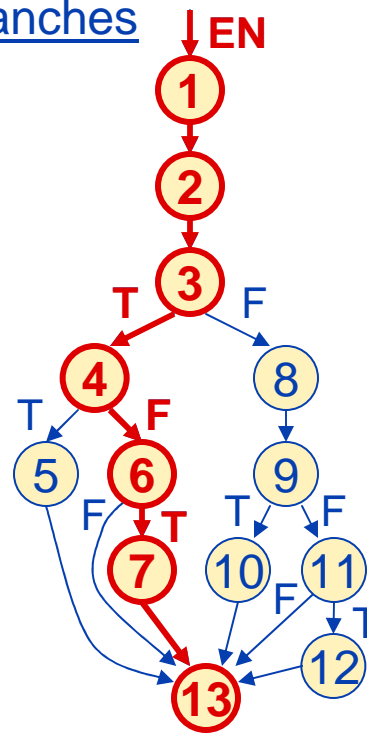
Statements

```

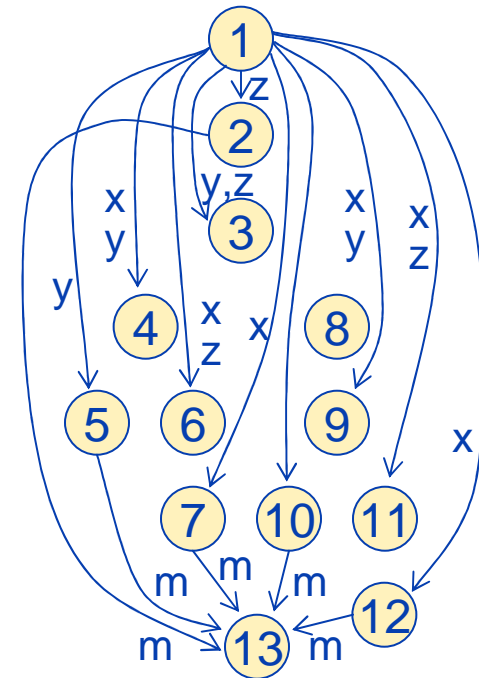
mid()
  int x,y,z,m;
  1. read(x,y,z);
  2. m = z;
  3. if (y<z)
  4.   if (x<y)
  5.     m = y;
  6.   else if (x<z)
  7.     m = x;
  8. else
  9.   if (x>y)
  10.    m = y;
  11.  else if (x>z)
  12.    m = x;
  13. print(m);

```

Branches



DU-pairs



(Santelices & Harrold
ASE 2007)

Inferring DU-pair Coverage

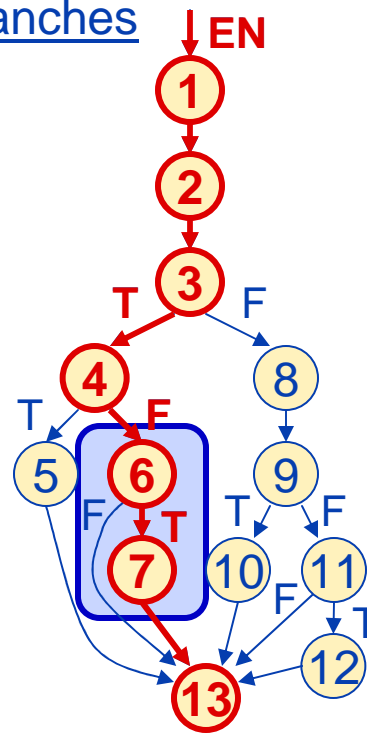
Statements

```

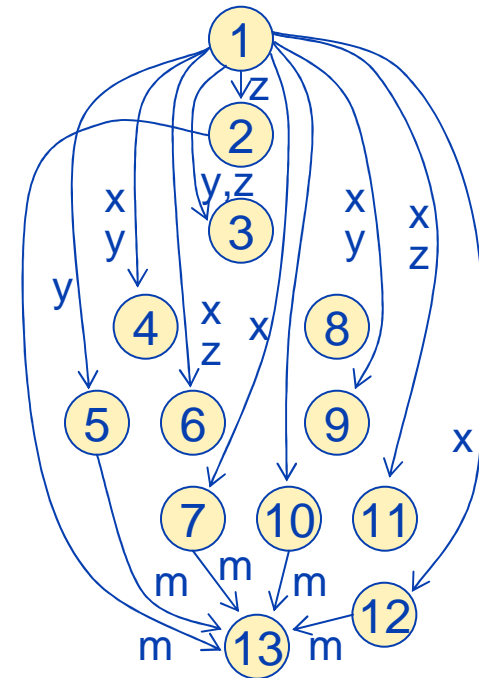
mid()
  int x,y,z,m;
  1. read(x,y,z);
  2. m = z;
  3. if (y<z)
  4.   if (x<y)
  5.     m = y;
  6.   else if (x<z)
  7.     m = x;
  8. else
  9.   if (x>y)
  10.    m = y;
  11.  else if (x>z)
  12.    m = x;
  13. print(m);

```

Branches



DU-pairs



(Santelices & Harrold
ASE 2007)

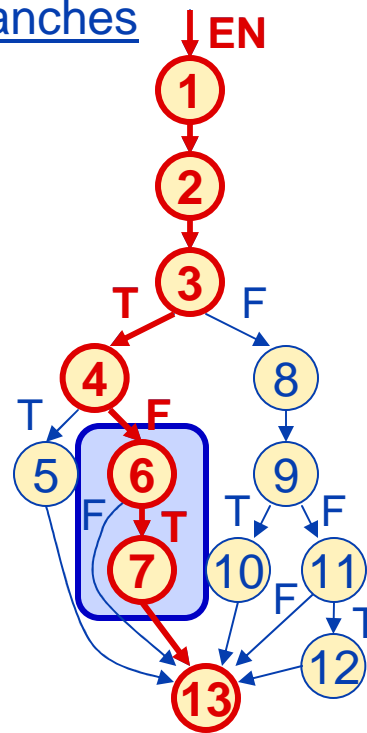
Inferring DU-pair Coverage

Statements

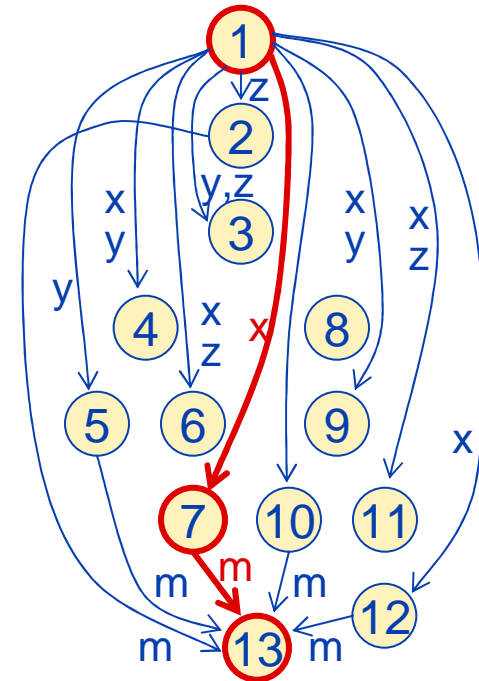
```

mid()
  int x,y,z,m;
  1. read(x,y,z);
  2. m = z;
  3. if (y<z)
  4.   if (x<y)
  5.     m = y;
  6.   else if (x<z)
  7.     m = x;
  8. else
  9.   if (x>y)
  10.    m = y;
  11.  else if (x>z)
  12.    m = x;
  13. print(m);
  
```

Branches



DU-pairs



inference

$6T \Rightarrow 1 \xrightarrow{x} 7, 7 \xrightarrow{m} 13$

(Santelices & Harrold
ASE 2007)

Experiment 3

Goal: comparison using inferred du-pair coverage

Setup

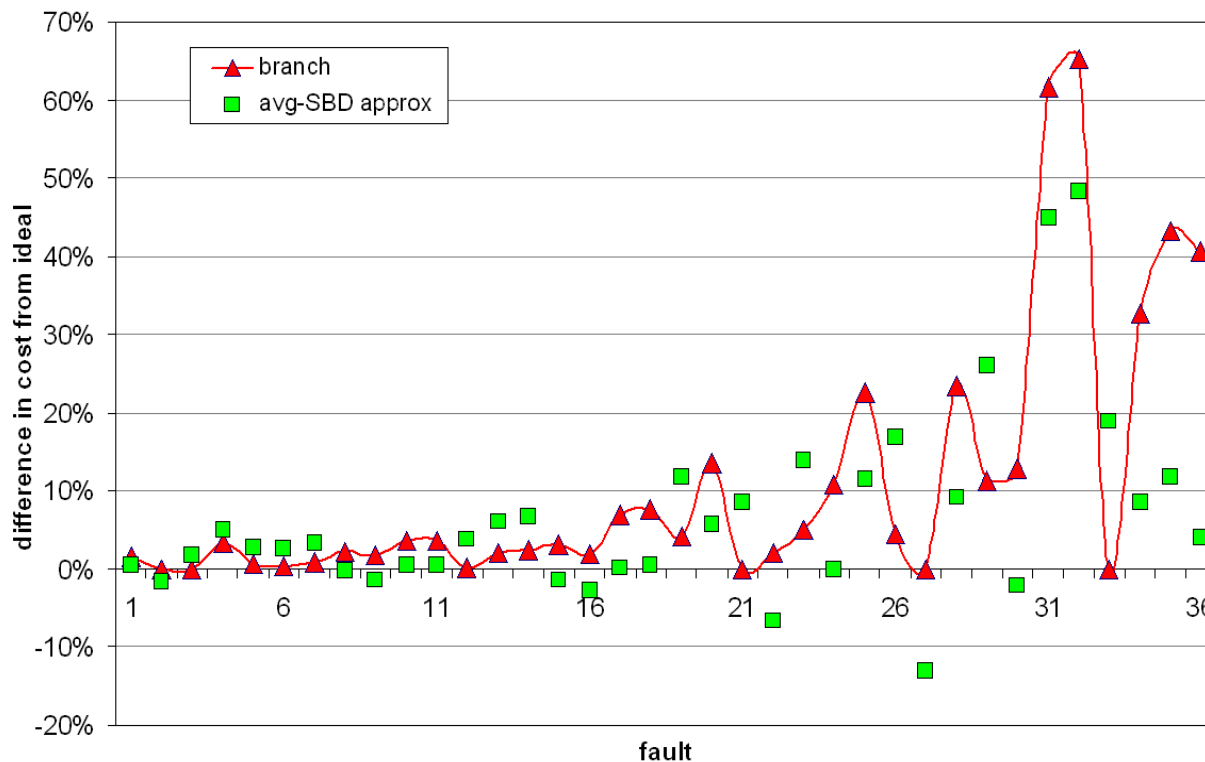
- o Replace du-pair coverage with **inferred** coverage
 - o ***du-pair-approx(s)***
 - o ***avg-BD-approx(s)***
 - o ***avg-SBD-approx(s)***
 - o ***max-SBD-approx(s)***
- o Same as Experiments 1 and 2: **14** subjects, **107** faults
 - o We measure the **difference** in cost with the **ideal** individual type

Note: we only monitor for branch coverage now!

Experiment 3: Results

Difference in cost w.r.t. the **ideal individual type**

measure	stmt	branch	du-pair approx	avg-BD approx	best avg-SBD approx	max-SBD approx
average diff	5.14%	3.89%	4.26%	2.64%	2.44%	3.71%
<i>standard dev.</i>	13.28%	11.06%	10.01%	8.02%	7.73%	7.70%



— Faults with most **different** costs (>1% between *du-pair* and *avg-SBD*)

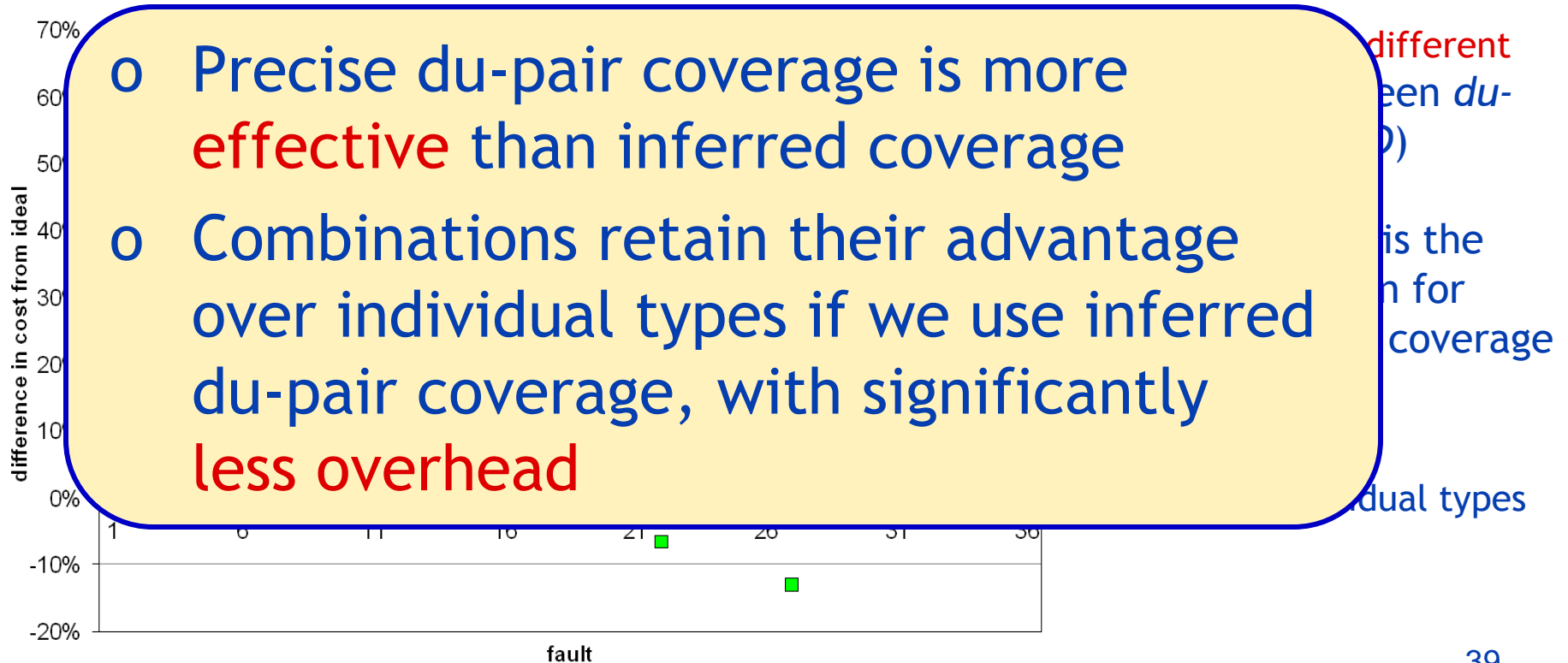
avg-SBD-approx is the best combination for **inferred** du-pair coverage

← ideal of individual types

Experiment 3: Results

Difference in cost w.r.t. the **ideal individual type**

measure	stmt	branch	du-pair approx	avg-BD approx	best avg-SBD approx	max-SBD approx
average diff	5.14%	3.89%	4.26%	2.64%	2.44%	3.71%
standard dev.	13.28%	11.06%	10.01%	8.02%	7.73%	7.70%



background

compare

combine

infer

conclude

Summary

Experiment 1

Different faults are best found using different coverage types

background

compare

combine

infer

conclude

Summary

Experiment 1

Different faults are best found using different coverage types



But, there is no way to know beforehand which type to choose

background

compare

combine

infer

conclude

Summary

Experiment 1

Different faults are best found using different coverage types

Experiment 2

Combining coverage types gives more effective fault localization than any individual type

background

compare

combine

infer

conclude

Summary

Experiment 1

Different faults are best found using different coverage types

Experiment 2

Combining coverage types gives more effective fault localization than any individual type



Instrumentation for du-pairs incurs a relatively high runtime overhead

background

compare

combine

infer

conclude

Summary

Experiment 1

Different faults are best found using different coverage types

Experiment 2

Combining coverage types gives more effective fault localization than any individual type

Experiment 3

Performing du-pair inferencing with only cheap branch instrumentation significantly reduces runtime overhead while retaining better combination effectiveness over individual types

Future Work

- o Compare and combine additional **lightweight** coverage types (e.g., methods, acyclic paths)
- o Experiment with additional **heavyweight** coverage (e.g., slice fragments) **inferred** from lighter-weight coverage (e.g., branches, paths)
- o Perform **more** experiments on more subjects and faults, especially **different** types of faults

Conclusion

- o First thorough **comparison** of effectiveness of different coverage types on fault localization
- o First technique that **combines** coverage types to improve fault-localization effectiveness
- o Application of **du-pair inference** that produces effective results with low overhead