

# Can Better Identifier Splitting Techniques Help Feature Location?

Bogdan Dit, Latifa Guerrouj, Denys Poshyvanyk, Giuliano Antoniol



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**SOCCER LAB**  
Software Cost-effective Change  
and Evolution Research Lab



**WILLIAM  
& MARY**



**ÉCOLE  
POLYTECHNIQUE  
MONTREAL**

19<sup>th</sup> IEEE International Conference on Program Comprehension  
(ICPC'11) - Kingston, Ontario, Canada

**Private Function CleanUpLine(ByVal sLine As String) As String**

```
Dim lQuoteCount As Long
Dim lcount      As Long
Dim sChar       As String
Dim sPrevChar   As String

' Starts with Rem it is a comment
sLine = Trim(sLine)
If Left(sLine, 3) = "Rem" Then
    CleanUpLine = ""
    Exit Function
End If

' Starts with ' it is a comment
If Left(sLine, 1) = "'" Then
    CleanUpLine = ""
    Exit Function
End If

' Contains ' may end in a comment, so test if it is a comment or in the
' body of a string
If InStr(sLine, "'") > 0 Then
    sPrevChar = " "
    lQuoteCount = 0

    For lcount = 1 To Len(sLine)
        sChar = Mid(sLine, lcount, 1)

        ' If we found " ' then an even number of " characters in front
        ' means it is the start of a comment, and odd number means it is
        ' part of a string
        If sChar = "'" And sPrevChar = " " Then
            If lQuoteCount Mod 2 = 0 Then
                sLine = Trim(Left(sLine, lcount - 1))
                Exit For
            End If
        ElseIf sChar = "" Then
            lQuoteCount = lQuoteCount + 1
        End If
        sPrevChar = sChar
    Next lcount
End If

CleanUpLine = sLine
End Function
```

# Textual information embeds domain knowledge

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Private Function CleanUpLine(ByVal sLine As String) As String
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Textual information embeds domain knowledge

About 70% of source code consists of identifiers\*

\* Deissenboeck, F. and Pizka, M., "Concise and Consistent Naming", Software Quality Journal, vol. 14, no. 3, 2006, pp. 261-282

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            sChar = Mid(sLine, lcount, 1)

            ' If we found "" then an even number of characters in front
            ' means it is the start of a comment, and odd number means it is
            ' part of a string
            If sChar = "" And sPrevChar = "" Then
                If lQuoteCount Mod 2 = 0 Then
                    sLine = Trim(Left(sLine, lcount))
                    Exit For
                End If
            ElseIf sChar = "" Then
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Textual information embeds domain knowledge

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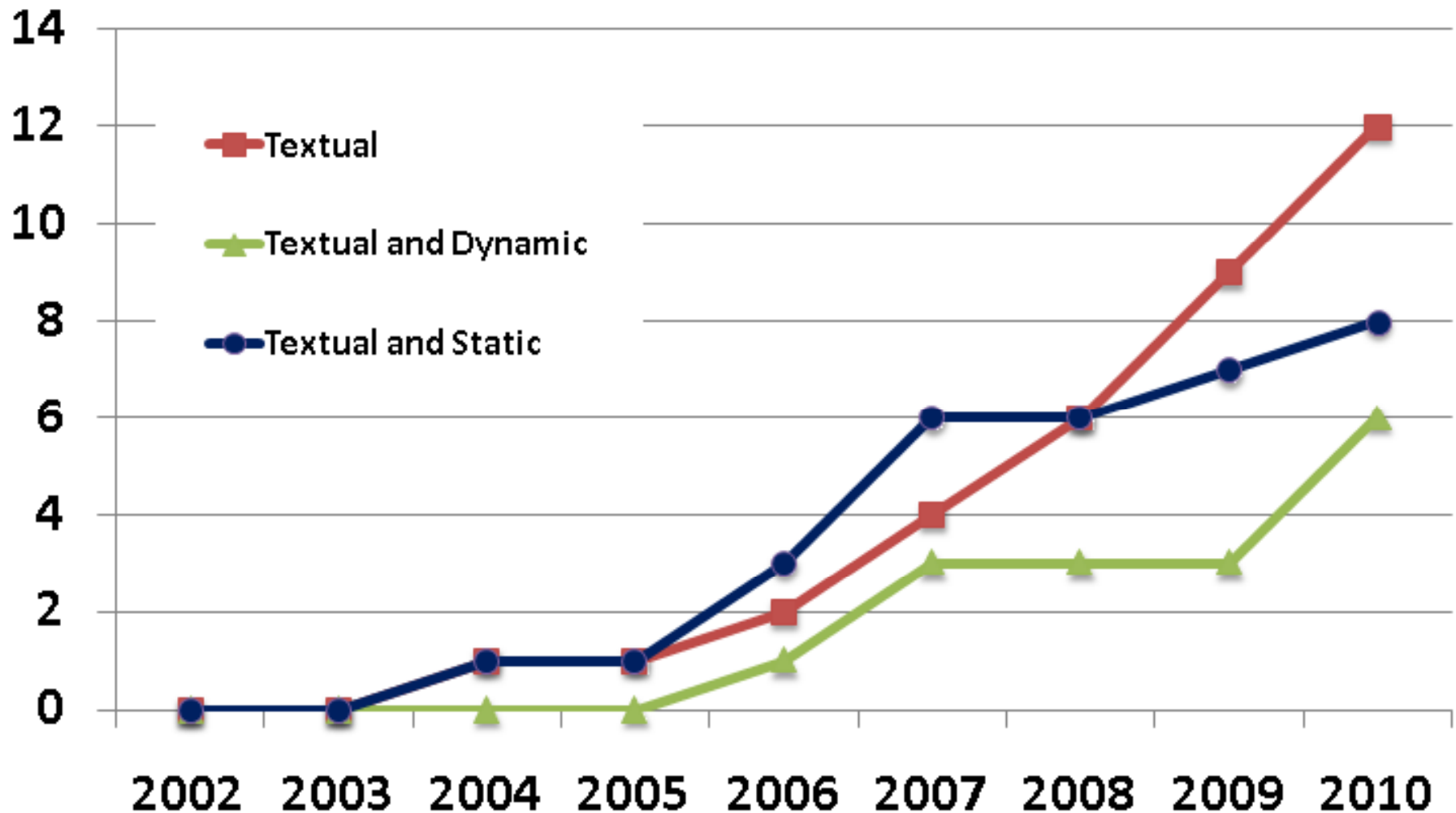
Identifiers are important source of information for maintenance tasks:

- traceability link recovery
- feature location

\* Deissenboeck, F. and Pizka, M., "Concise and Consistent Naming", Software Quality Journal, vol. 14, no. 3, 2006, pp. 261-282



# # of Cumulative Feature Location Papers based on Textual Information



# Related Work on Identifiers

- Takang et al. (JPL'96)
  - programs with full-word identifiers are more understandable than those with abbreviated ones
- Lawrie et al. (ICPC'06)
  - full words and recognizable abbreviations lead to better comprehension
- Binkley et al. (ICPC'09)
  - CamelCase style is easier to recognize than underscore

# Related Work on Identifiers

- Enslin et al. (MSR'09)
  - Samurai: algorithm for splitting identifiers (using tables of identifier frequencies)
- Guerrouj et al. (JSME'11)
  - TIDIER: algorithm for splitting identifiers (using contextual information)
- Other related work
  - Deissenboeck and Pizka (SQJ'06), Antoniol et al. (ICSM'07), Haiduc and Marcus (ICPC'08), etc.



# Splitting Identifiers Correctly is Challenging

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            End If
            sPrevChar = sChar
        Next lcount
    End If

    CleanUpLine = sLine
End Function
```

# Identifier Splitting Algorithms

---

## Original Identifier

---

**userId**

**setGID**

**print\_file2device**

**SSLCertificate**

**MINstring**

**USERID**

**currentsize**

**readadapterobject**

**tolocale**

**imitating**

**DEFMASKBit**

---

# Identifier Splitting Algorithms

Original Identifier	Camel Case
userId	user Id
setGID	set GID
print_file2device	print file 2 device
SSLCertificate	SSL Certificate
MINstring	MI Nstring
USERID	USERID
currentsize	currentsize
readadapterobject	readadapterobject
tolocale	tolocale
imitating	imitating
DEFMASKBit	DEFMASK Bit

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USERID	USERID
currentsize	currentsize
readadapterobject	readadapterobjec
tolocale	tolocale
imitating	imitating
DEFMASKBit	DEFMASK Bit

Handles  
underscore and  
digits

Fails at mixed cases

Fails at same case  
identifiers

# Identifier Splitting Algorithms

Original Identifier	Camel Case
userId	user Id
setGID	set GID
print_file2device	print file 2 device
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readadapterobject	readadapterobject
tolocale	tolocale
imitating	imitating
DEFMASKBit	DEFMASK Bit

# Identifier Splitting Algorithms

Original Identifier	Camel Case	Samurai
userId	user Id	user Id
setGID	set GID	set GID
print_file2device	print file 2 device	print file 2 device
SSLCertificate	SSL Certificate	SSL Certificate
MINstring	MI Nstring	MIN string
USERID	USERID	USER ID
currentsize	currentsize	current size
readadapterobject	readadapterobject	read adapter object
tolocale	tolocale	tol ocal e
imitating	imitating	imi ta ting
DEFMASKBit	DEFMASK Bit	DEF MASK Bit



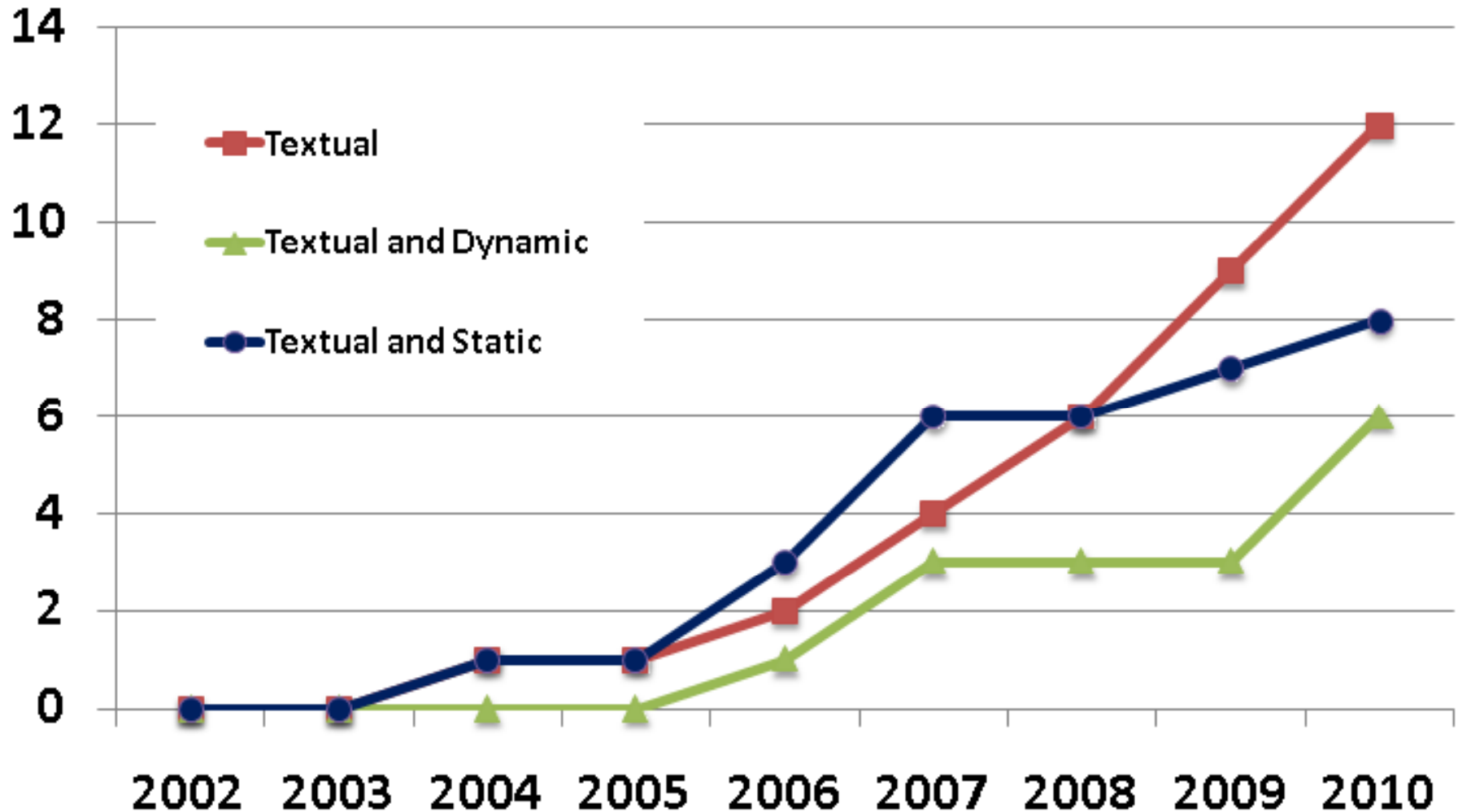
# Identifier Splitting Algorithms

Original Identifier	Camel Case	Samurai
userId		user Id
setGID		set GID
print_file2device		print file 2 device
SSLCertificate		SSL Certificate
MINstring	MI Nstring	MIN string
USERID	USERID	USER ID
currentsize	currentsize	current size
readadapterobject	readadapterobject	read adapter object
tolocale	tolocale	tol ocal e
imitating	imitating	imi ta ting
DEFMASKBit	DEFMASK Bit	DEF MASK Bit

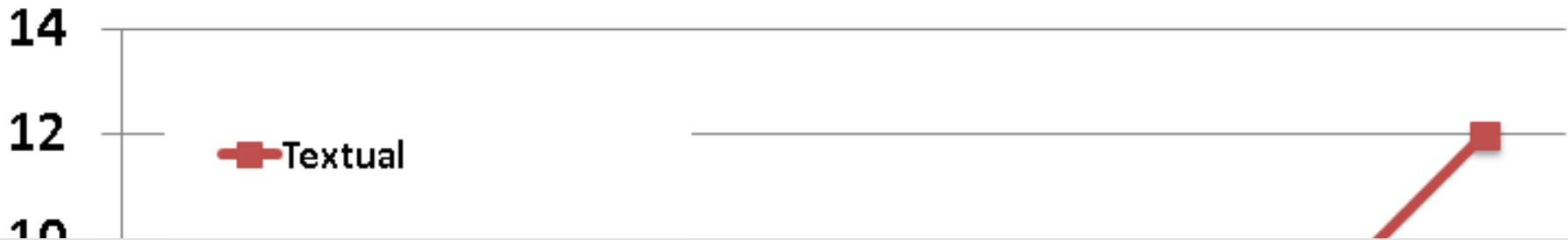
Splits some cases where CamelCase cannot

Oversplits

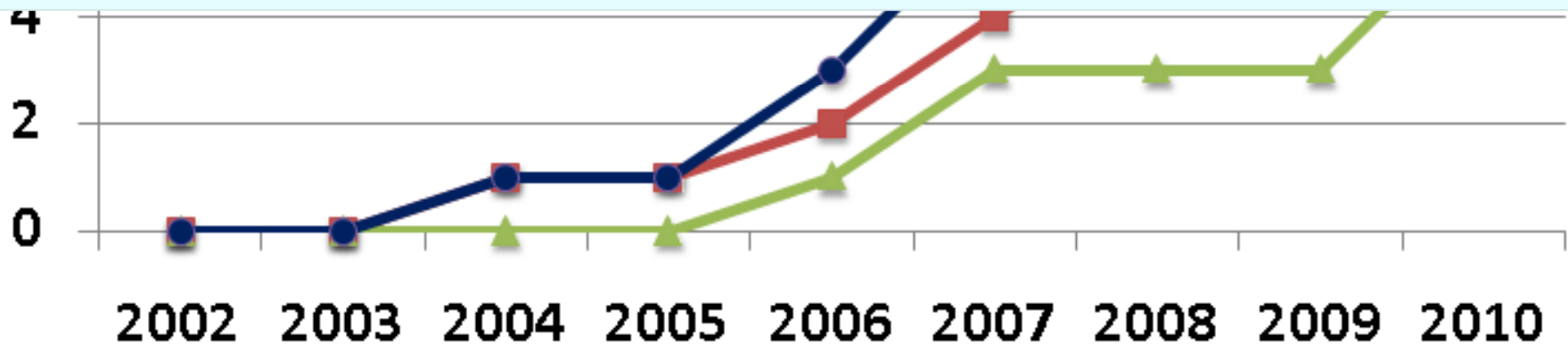
# # of Cumulative Feature Location Papers based on Textual Information



# # of Cumulative Feature Location Papers based on Textual Information



Existing feature location techniques use Camel Case splitting



# Information Retrieval FLT

- Generate corpus
- Preprocessing
  - Remove non-literals
  - Remove stop words
  - Split identifiers
  - Stemming
- Indexing
  - Term-by-document matrix
  - Singular Value Decomposition
- User formulate query
- Generate results
- Ranked list

```
synchronized void print(TestResult result,  
long runTime) throws IOException{  
    printHeader(runTime);  
    printErrors(result);  
    printFailures(result);  
    printFooter(result);  
}
```



```
synchronized void print TestResult result  
long runTime throws IOException  
printHeader runTime printErrors result  
printFailures result printFooter result
```



```
print TestResult result runTime  
IOException printHeader runTime  
printErrors result printFailures result  
printFooter result
```

# Information Retrieval FLT

- Generate corpus
- Preprocessing
  - Remove non-literals
  - Remove stop words
  - **Split identifiers**
  - Stemming
- Indexing
  - Term-by-document matrix
  - Singular Value Decomposition
- User formulate query
- Generate results
- Ranked list

print Test Result result run Time IO  
Exception print Header run Time print  
Errors result print Failures result print  
Footer result



print test result result run time io  
exception print head run time print error  
result print fail result print foot result

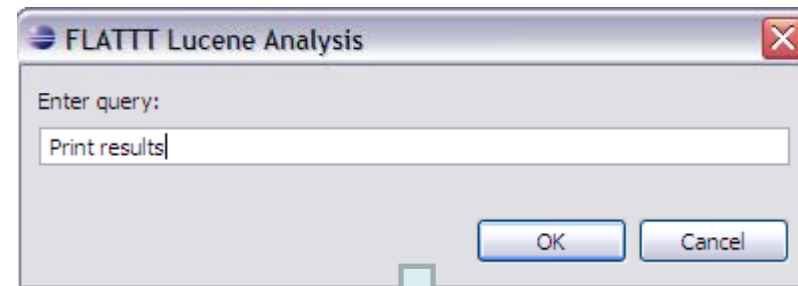


	print	test	result	...
m <sub>1</sub>	5	1	3	...
m <sub>2</sub>	...	...	...	...

# Information Retrieval FLT

- Generate corpus
- Preprocessing
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	print	test	result	...
m <sub>1</sub>	5	1	3	...
m <sub>2</sub>	...	...	...	...



	Name	Class	Probability	Full Name
●	nodeToString	DomProbe	1.0	com.ibatis.common.beans.DomProbe::nodeToString
○	PRINT_ACTION	JDBV	0.97933716	edu.uiuc.jdbv.JDBV::PRINT_ACTION
●	PrintPreview	PrintPreview	0.79962546	edu.uiuc.jdbv.util.PrintPreview::PrintPreview
○	NAME_VALUE	PrintPreviewAct...	0.79962546	edu.uiuc.jdbv.PrintPreviewAction::NAME_VALUE
○	NAME_VALUE	PrintAction	0.79962546	edu.uiuc.jdbv.PrintAction::NAME_VALUE
□	out	ConsoleTextArea	0.7915888	org.mozilla.javascript.tools.shell.ConsoleTextArea::...
□	err	ConsoleTextArea	0.7915888	org.mozilla.javascript.tools.shell.ConsoleTextArea::err



# IR and Dynamic Information FLT

- Generate corpus
- Preprocessing
  - Remove non-literals
  - Remove stop words
  - Split identifiers
  - Stemming
- Indexing
  - Term-by-document matrix
  - Singular Value Decomposition
- User formulate query
- Generate results
- Ranked list **of executed methods**



**Collect execution trace**

## **Research Goal**

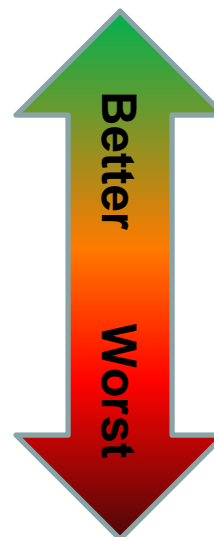
**Evaluate how advanced splitting techniques impact the performance of feature location techniques**

# Information Retrieval FLT

- Generate corpus
- Preprocessing
  - Remove non-literals
  - Remove stop words
  - **Split identifiers**
  - Stemming
- Indexing
  - Term-by-document matrix
  - Singular Value Decomposition
- User formulate query
- Generate results
- Ranked list

**Replace Camel Case with :**

- **Samurai**
- **“Perfect” Splitting algorithm (Oracle)**



	Name	Class	Probability
●	nodeToString	DomProbe	1.0
○	PRINT_ACTION	JDBV	0.97933716
●	PrintPreview	PrintPreview	0.79962546
○	NAME_VALUE	PrintPreviewAct...	0.79962546
○	NAME_VALUE	PrintAction	0.79962546
□	out	ConsoleTextArea	0.7915888
□	err	ConsoleTextArea	0.7915888

```
public class DocumentCreationListener implements EventListener {
    //really just for the test code
    public static final String HANDLED_EVENT = "Did We Handle The Event?";

    public static final SimpleDateFormat formatter=
        new SimpleDateFormat("EEEE, dd MMM", Locale.getDefault());

    public DocumentCreationListener() {
    }

    public void handleEvent(Event event) throws ClientException {
        //this is really just for the test to know we handled event
        //no functional value
        event.getContext().getProperties().put(HANDLED_EVENT, "true");

        //check what type of event context
        EventContext ctx=event.getContext();
        if (!ctx instanceof DocumentEventContext) {
            return;
        }

        // get the event context for a document event
        DocumentEventContext context = (DocumentEventContext) event.getContext()
    }
}
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**Extract Identifiers**



**All  
Identifiers**

**Building  
the Oracle**

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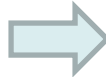
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    }
}
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**Extract Identifiers**



**All Identifiers**



**Same split?  
(CamelCase  
Samurai  
TIDIER)**

**YES**

**Concordant  
Split  
Identifiers**

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**Extract Identifiers**



**All Identifiers**



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**YES**

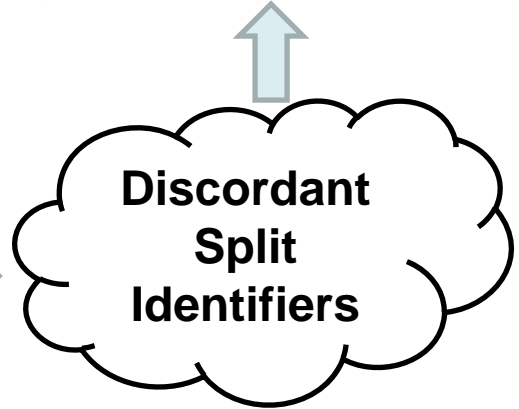
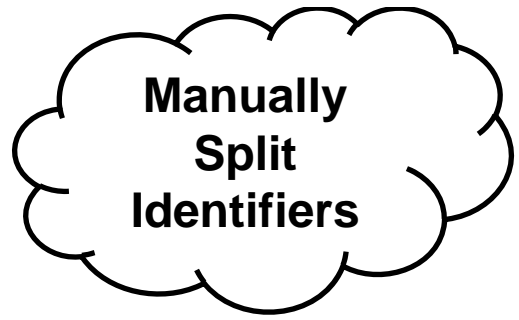
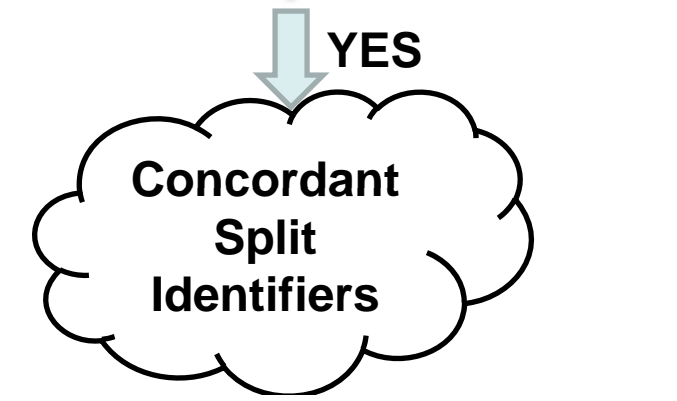
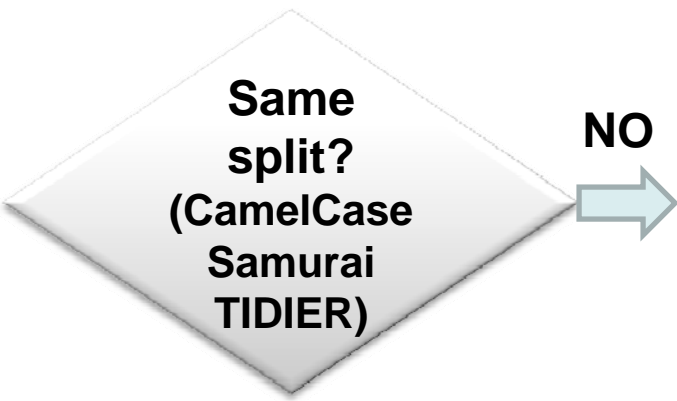
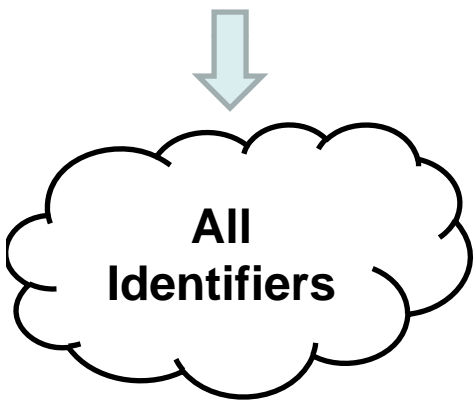
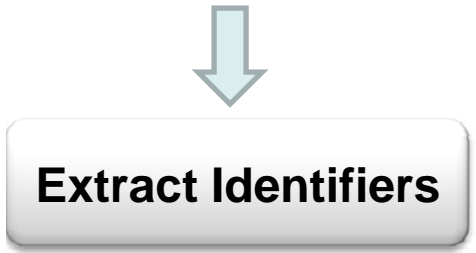
**Concordant  
Split  
Identifiers**

# Building the Oracle

- Assume they are correct
- Manually verified a sample
- Threat to validity



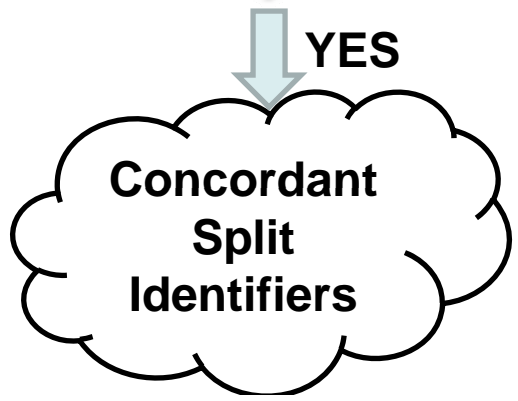
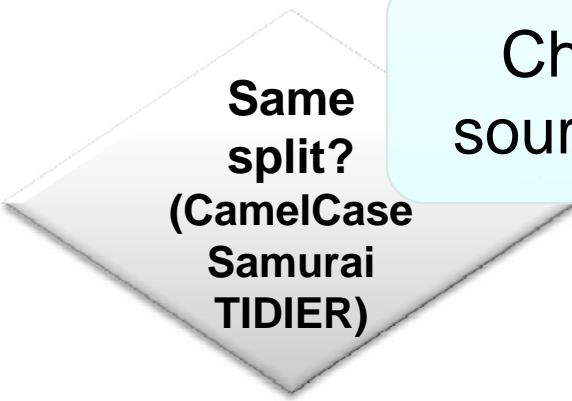
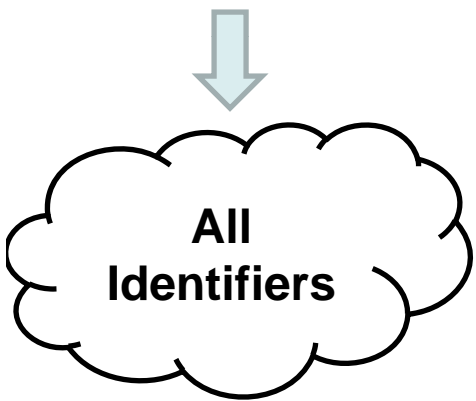
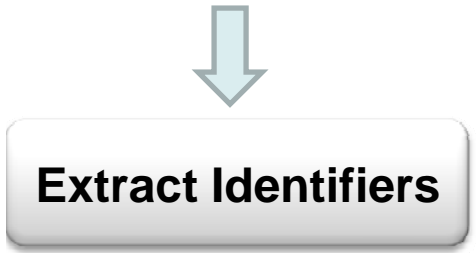
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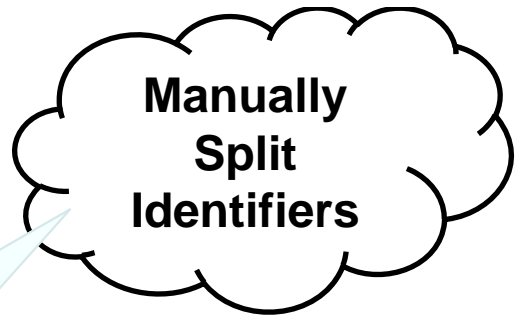
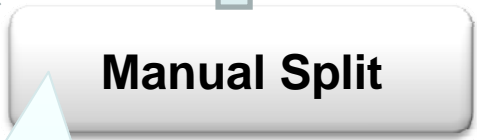
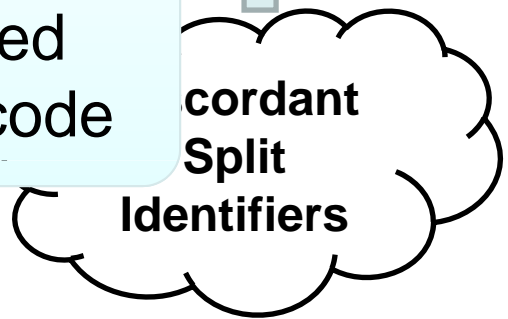
NO

# Building the Oracle

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}
```



Checked source code



Consensus between authors

# Building the Oracle

```
public class DocumentCreationListener implements EventListener {
```

- Examples: DT, i3, P754, zzz, etc.
- Left unchanged

Identifiers that could not be split

Manually Split Identifiers

Manual Split

All Identifiers

Same split?  
(CamelCase  
Samurai  
TIDIER)

NO

Discordant Split Identifiers

YES

Concordant Split Identifiers

Building the Oracle

# Design of the Case Study

# Design of the Case Study

- RQ: Does a FLT with an advanced **splitting** algorithm produce better results than the same FLT using the CamelCase **splitting** algorithm?

# How to Compare two FLTs?

# How to Compare two FLTs?

- Effectiveness measure for each feature

## IR

Method	LSI score
M <sub>121</sub>	0.92
M <sub>64</sub>	0.89
M <sub>15</sub>	0.86
M <sub>29</sub>	0.80
M <sub>7</sub>	0.74
M <sub>152</sub>	0.65
M <sub>234</sub>	0.56
M <sub>12</sub>	0.54
M <sub>78</sub>	0.52

Gold set method

Effectiveness = 5

# How to Compare two FLTs?

- Effectiveness measure for each feature

IR		IRDyn	
Method	LSI score	Method	LSI score
M <sub>121</sub>	0.92	M <sub>15</sub>	0.86
M <sub>64</sub>	0.89	M <sub>7</sub>	0.74
M <sub>15</sub>	0.86	M <sub>234</sub>	0.56
M <sub>29</sub>	0.80	M <sub>12</sub>	0.54
M <sub>7</sub>	0.74	M <sub>78</sub>	0.52
M <sub>152</sub>	0.65		
M <sub>234</sub>	0.56		
M <sub>12</sub>	0.54		
M <sub>78</sub>	0.52		

Gold set method

Effectiveness = 2

Method

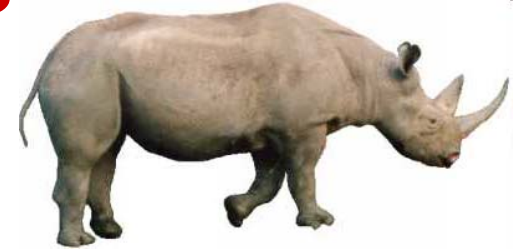
Executed method (from trace)



# Which FLTs are we Comparing?

$$\left\{ \begin{array}{l} IR \\ IR_{Dyn} \end{array} \right\} \times \left\{ \begin{array}{l} CamelCase \\ Samurai \\ Oracle \end{array} \right\} \rightarrow \left\{ \begin{array}{ll} IR_{CamelCase} & IR_{CamelCase}^{Dyn} \\ IR_{Samurai} & IR_{Samurai}^{Dyn} \\ IR_{Oracle} & IR_{Oracle}^{Dyn} \end{array} \right.$$

# Software Systems



- Rhino 1.6R5
- 138 classes, 1,870 methods, 32K LOC
- Eaddy et al.'s data\*
- 2 datasets

<b>Dataset</b>	<b>Size</b>	<b>Queries</b>	<b>Gold Sets</b>	<b>Execution Information</b>
Rhino <sub>Features</sub>	241	Sections of ECMAScript documentation	Eaddy et al.*	Full Execution Traces (from unit tests)
Rhino <sub>Bugs</sub>	143	Bug title and description	Eaddy et al.* (CVS)	N/A

\* <http://www.cs.columbia.edu/~eaddy/concerntagger/>

# Software Systems



- jEdit 4.3
- 483 classes, 6.4K methods, 109K LOC
- 2 datasets

Dataset	Size	Queries	Gold Sets	Execution Information
jEdit <sub>Features</sub>	64	Feature (or Patch) title and description	SVN	Marked Execution Traces
jEdit <sub>Bugs</sub>	86	Bug title and description	SVN	Marked Execution Traces

**Datasets available at:**

<http://www.cs.wm.edu/semeru/data/icpc11-identifier-splitting/>

# Generating the jEdit Datasets

---

r13898 | shlomy | 2008-10-17 00:45:12 -0400 (Fri, 17 Oct 2008) | 2 lines  
Changed paths:

  M /jEdit/trunk/doc/CHANGES.txt  
  M /jEdit/trunk/org/gjt/sp/jedit/search/HyperSearchRequest.java

Fixed bug #2173112: Search within selection of regexp '\$' does not match the last line. This was caused by an exception - if the last selection line is empty, buffer.getSegment() was called with a negative length of -1. Also removed an unused variable.

---

**SVN Commits between  
v4.2-v4.3**

# Generating the jEdit Datasets

```
-----  
r13898 | shlomy | 2008-10-17 00:45:12 -0400 (Fri, 17 Oct 2008) | 2 lines  
Changed paths:  
  M /jEdit/trunk/doc/CHANGES.txt  
  M /jEdit/trunk/org/gjt/sp/jedit/search/HyperSearchRequest.java  
Fixed bug #2173112: Search within selection of regexp '$' does not match  
the last line. This was caused by an exception - if the last selection  
line is empty, buffer.getSegment() was called with a negative length of  
-1. Also removed an unused variable.  
-----
```

**SVN commit  
message**

**Title**

**+**

**Description**

**=**

**Query**

5 4.3pre16: regex '\$' does not match last line in selection. ID: 2173112

**Details:**

- In a new buffer, make 10 empty lines. (NOTE: they don't have to be empty)
- Select any five lines (i.e. a text selection)
- Search for \$ (with hypersearch, selection, and regular expressions turned on)
- This only matches the first 4 lines. The fifth is not matched
- Now search for \$ and replace with z
- Since the fifth line was not matched, z is placed on only the first 4 lines.
- Please note:
  - ^ works fine. Just \$ demonstrates this behaviour
  - the lines do not have to be empty. This is reproducible for non-empty lines as well, and any mixture of empty non-empty lines

<b>Submitted:</b> Carlos ( solrac776 ) - 2008-10-16 23:00:21 UTC	<b>Assigned:</b> Shlomy Reinstein
<b>Priority:</b> 5	<b>Category:</b> search and replace
<b>Status:</b> Closed	<b>Group:</b> None
<b>Resolution:</b> Fixed	<b>Visibility:</b> Public

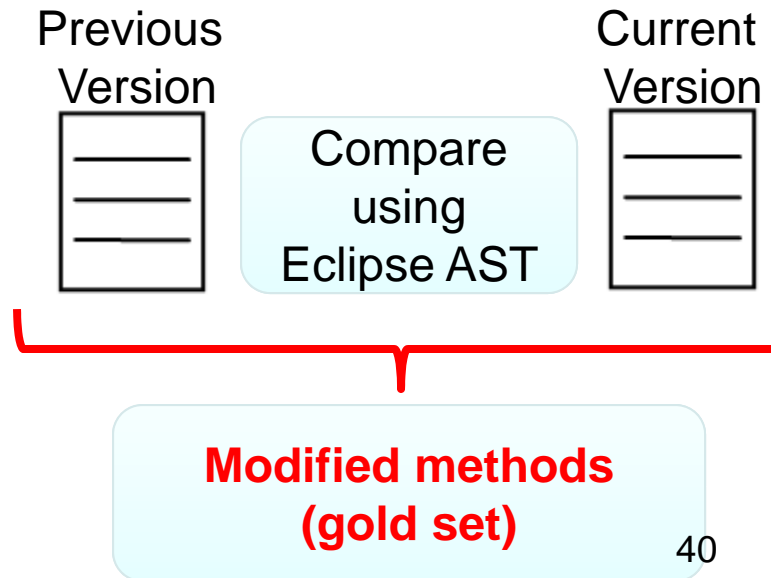
# Generating the jEdit Datasets

-----  
r13898 | shlomy | 2008-10-17 00:45:12 -0400 (Fri, 17 Oct 2008) | 2 lines  
Changed paths:

M /jEdit/trunk/doc/CHANGES.txt  
M /jEdit/trunk/org/gjt/sp/jedit/search/HyperSearchRequest.java

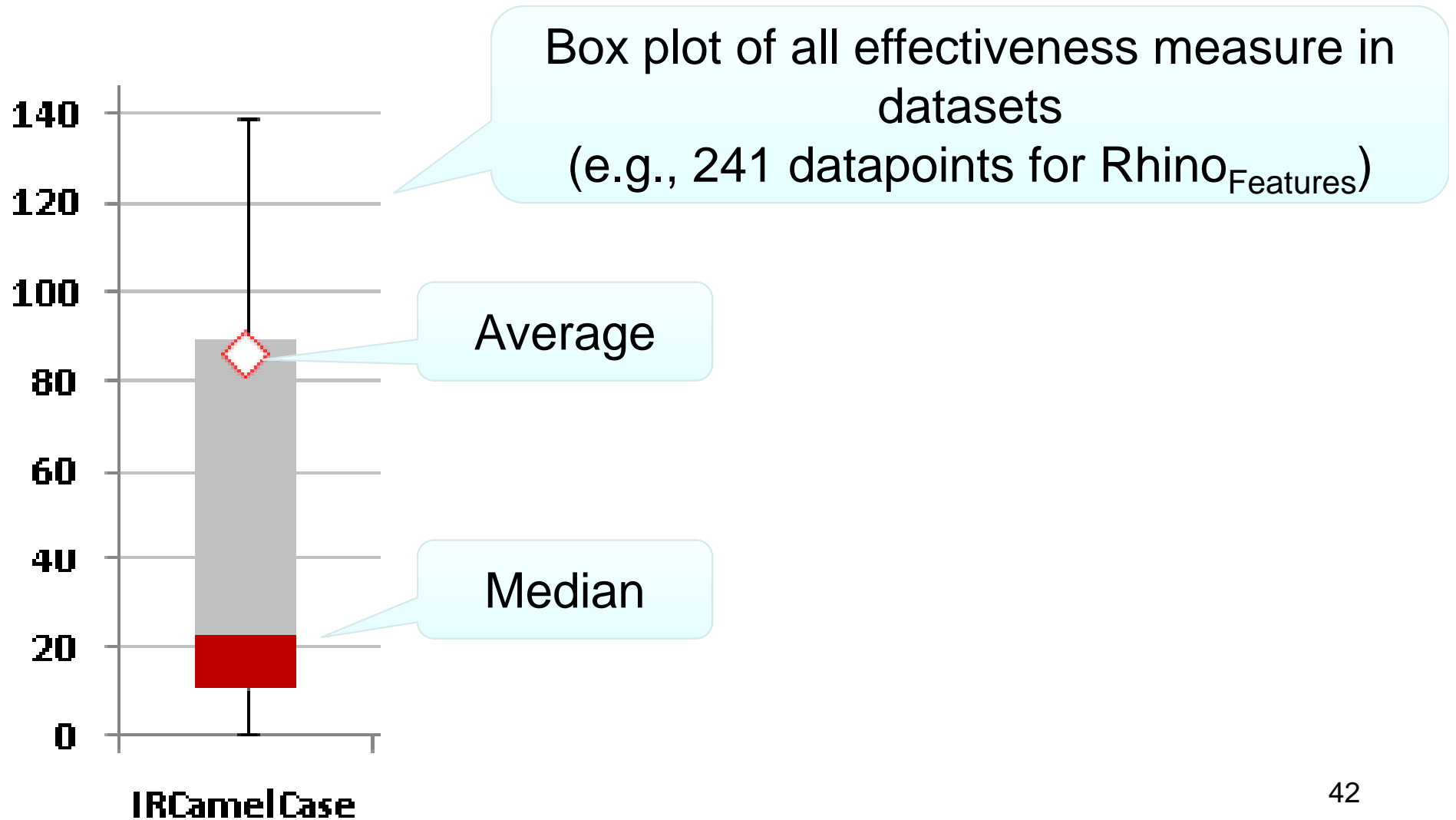
Fixed bug #2173112: Search within selection of regexp '\$' does not match the last line. This was caused by an exception - if the last selection line is empty, buffer.getSegment() was called with a negative length of -1. Also removed an unused variable.  
-----

**Changed files**



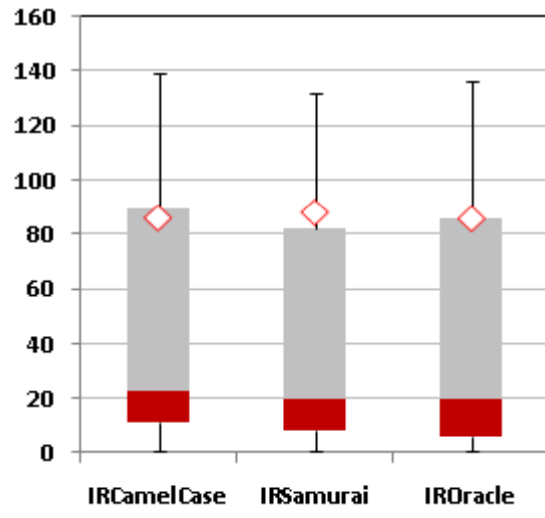
# Presenting the Results

# Presenting the Results

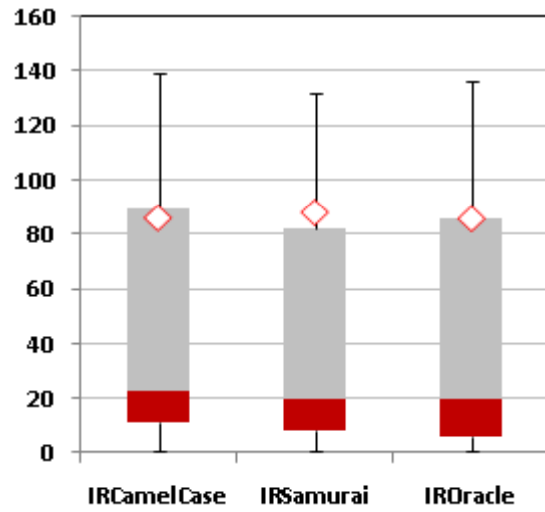




# IR FLTs



RhinoFeatures



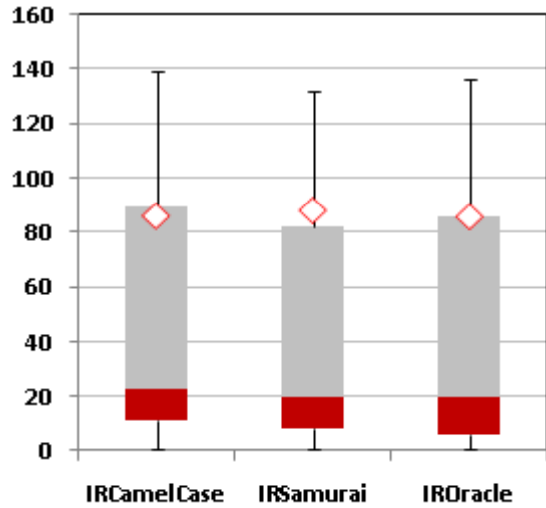
# IR FLTs

Similar median  
and average

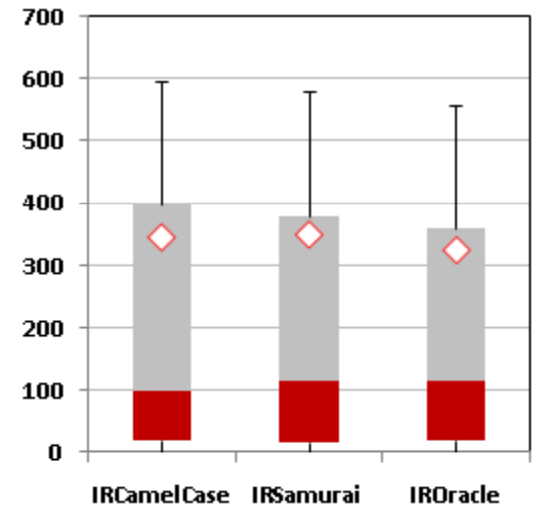
RhinoFeatures

# IR FLTs

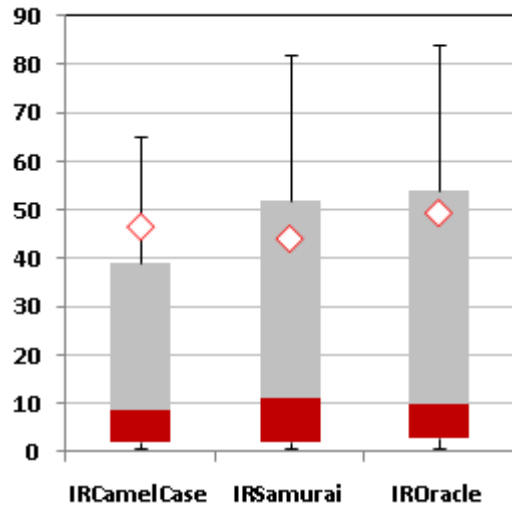
Similar median and average



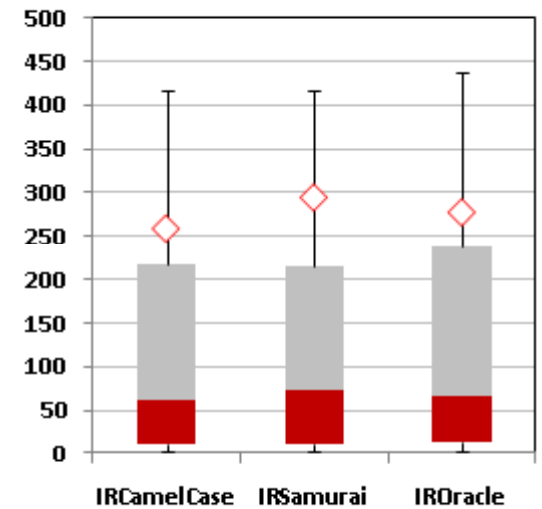
RhinoFeatures



RhinoBugs

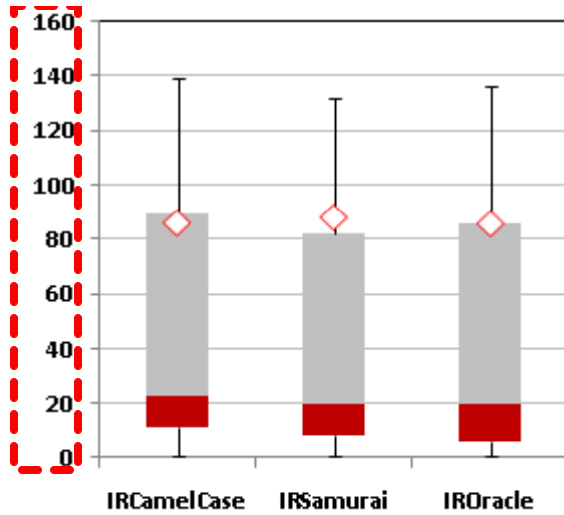


jEditFeatures

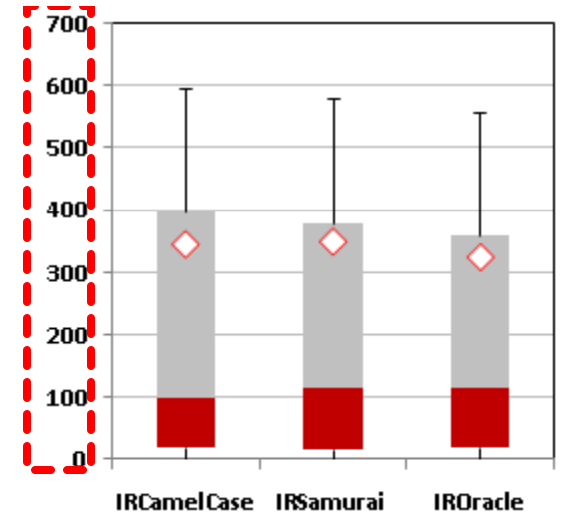


jEditBugs <sup>45</sup>

# IR FLT's

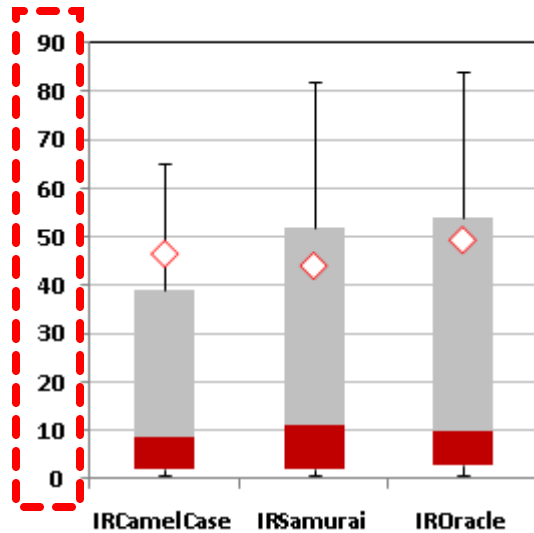


Rhino<sub>Features</sub>



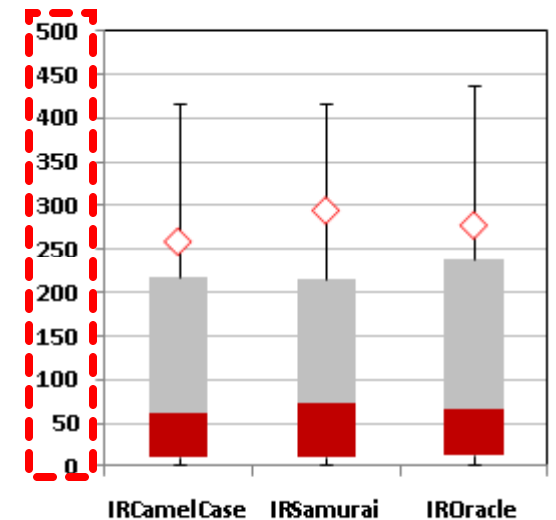
Rhino<sub>Bugs</sub>

Similar median and average



jEdit<sub>Features</sub>

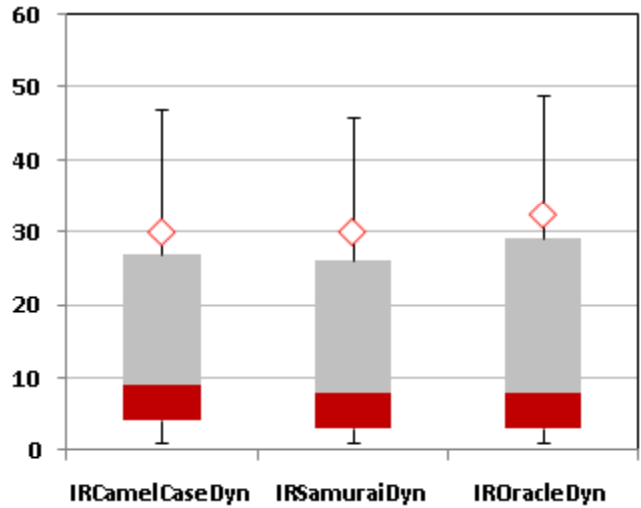
Datasets with features have better results than datasets with bugs



jEdit<sub>Bugs</sub> 46

# IRDyn FLTs

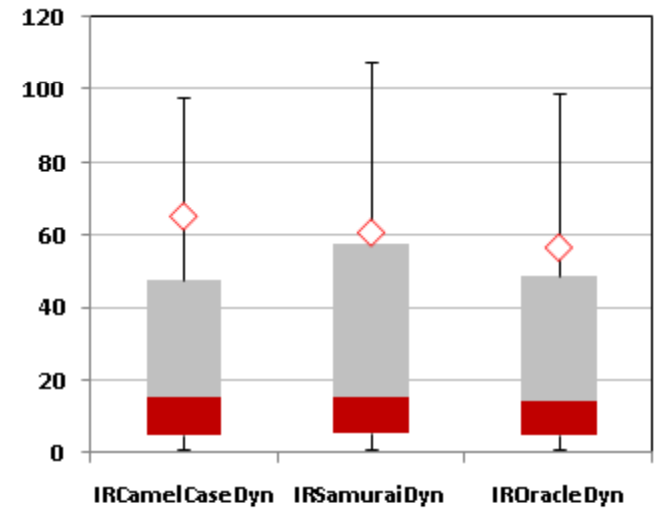
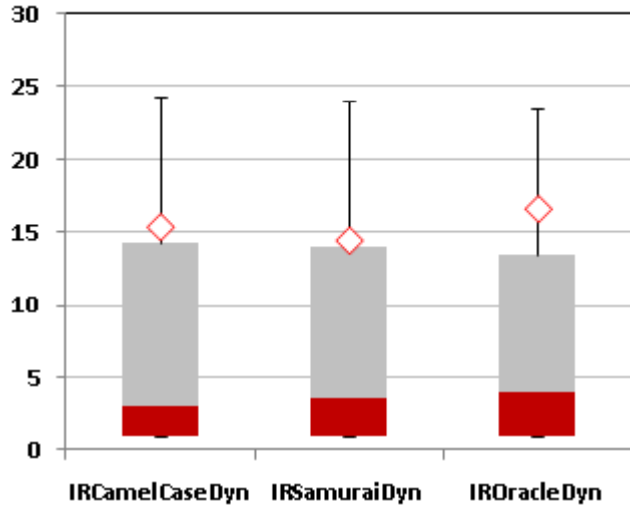
N/A



Similar median and average

## Rhino<sub>Features</sub>

## Rhino<sub>Bugs</sub>

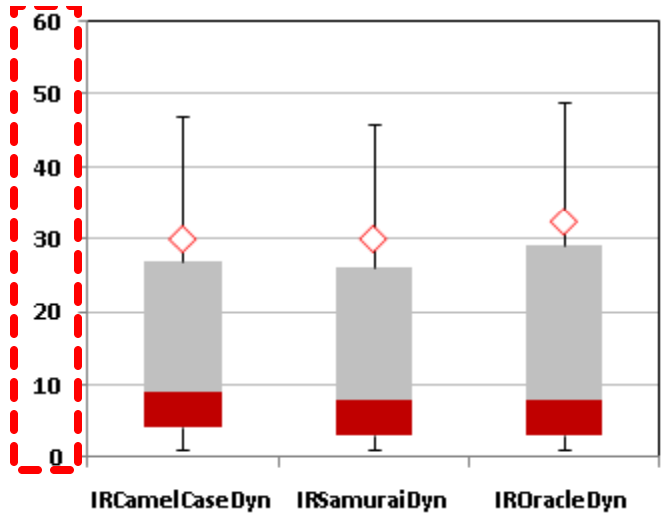


## jEdit<sub>Features</sub>

## jEdit<sub>Bugs</sub> <sup>47</sup>

# IRDyn FLTs

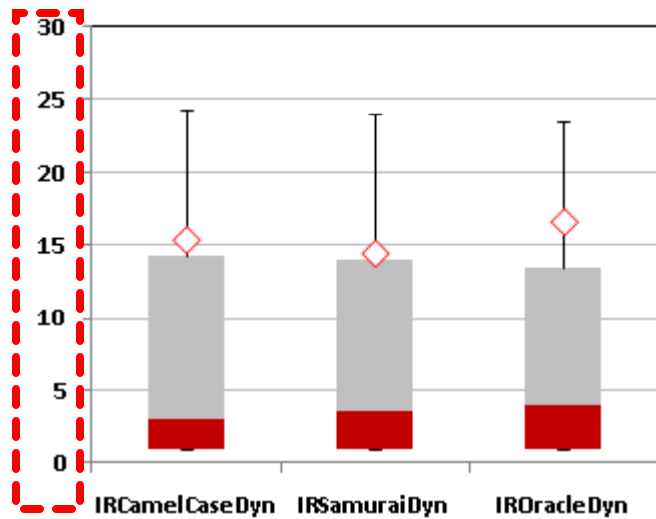
N/A



Similar median and average

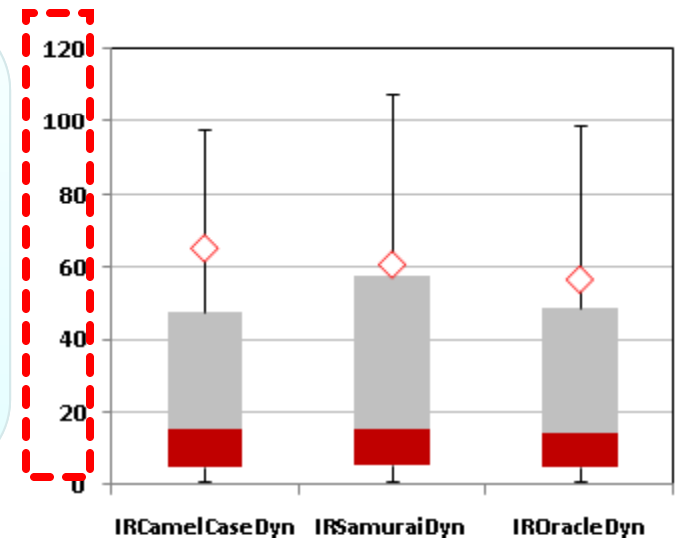
Rhino<sub>Features</sub>

Rhino<sub>Bugs</sub>



Datasets with features have better results than datasets with bugs

jEdit<sub>Features</sub>



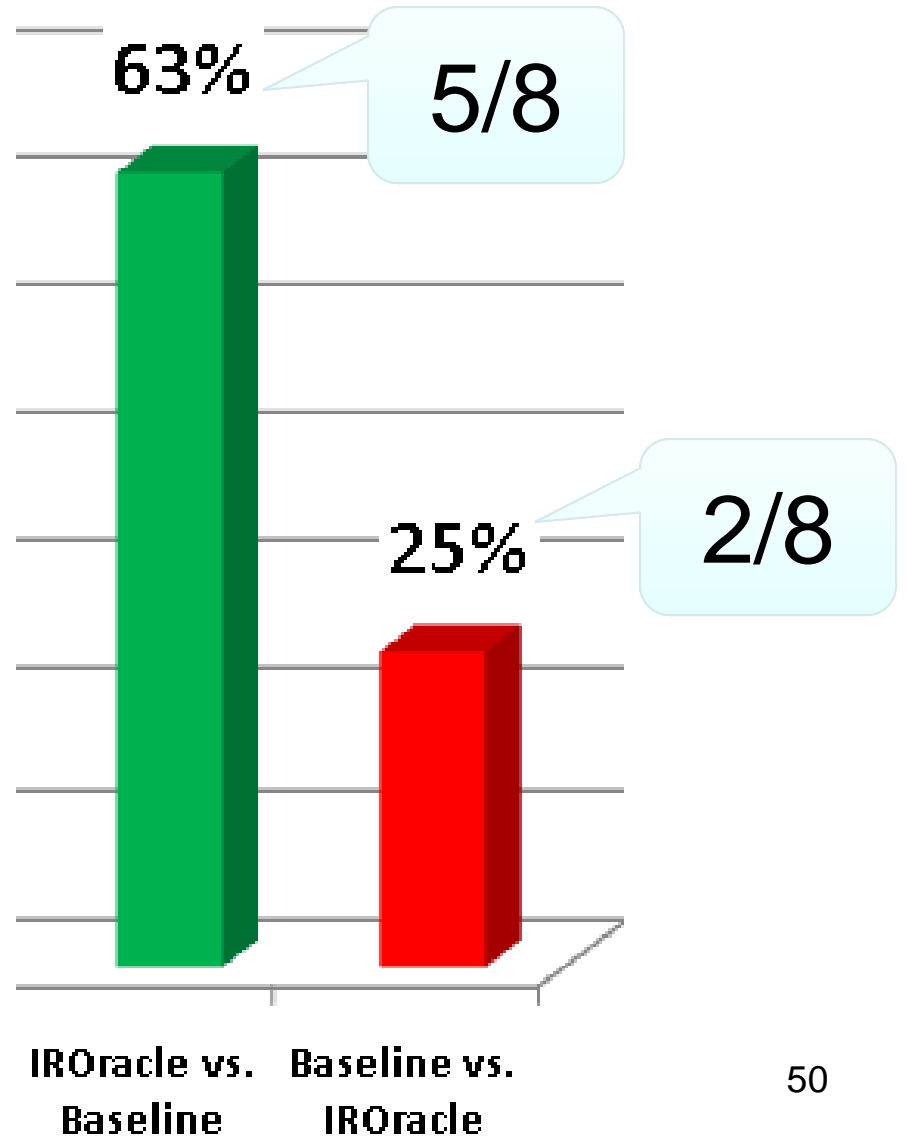
jEdit<sub>Bugs</sub><sup>48</sup>

# Compare FLTs by Percentages

<b>IR<sub>Oracle</sub></b>	<b>IRCamelCase (Baseline)</b>
<b>10</b>	<b>17</b>
<b>20</b>	<b>15</b>
<b>18</b>	<b>18</b>
<b>5</b>	<b>9</b>
<b>4</b>	<b>16</b>
<b>19</b>	<b>7</b>
<b>12</b>	<b>28</b>
<b>14</b>	<b>15</b>

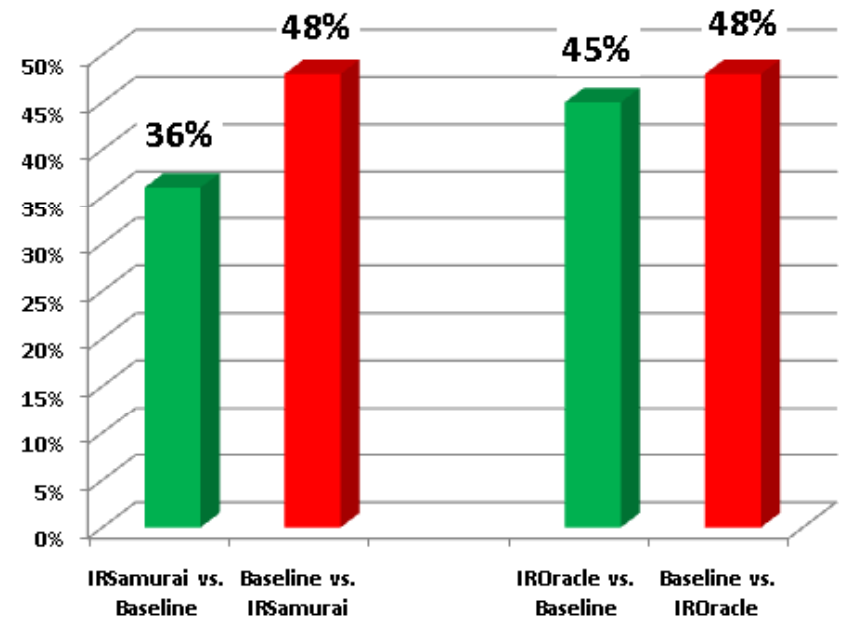
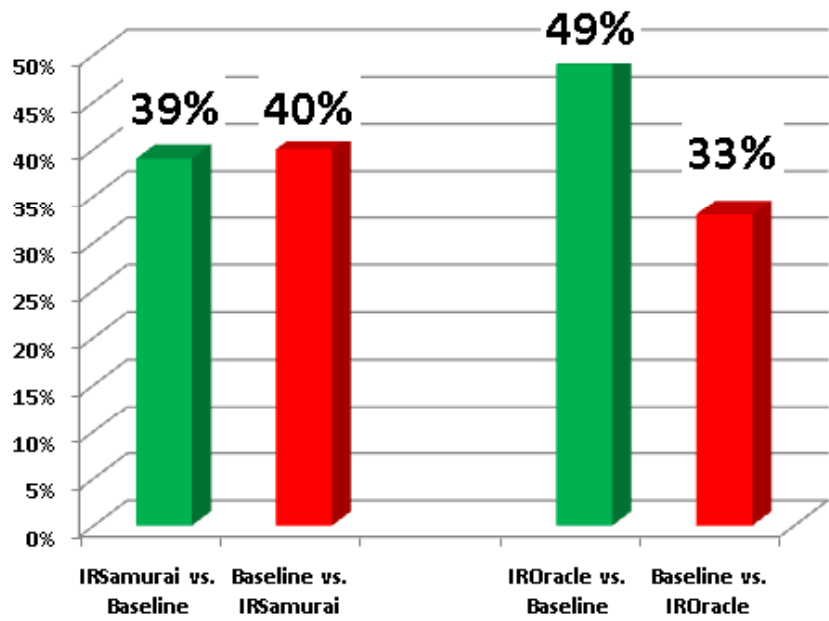
# Compare FLTs by Percentages

$IR_{Oracle}$	IRCamelCase (Baseline)
10	17
20	15
18	18
5	9
4	16
19	7
12	28
14	15



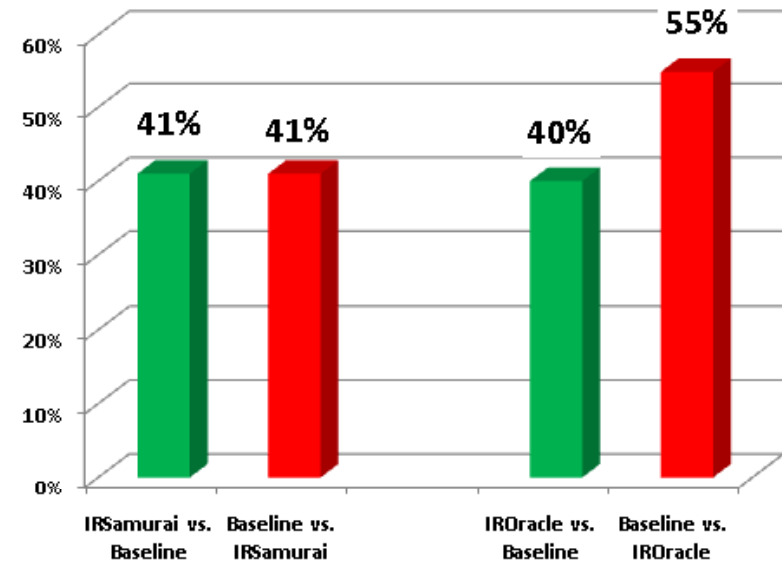
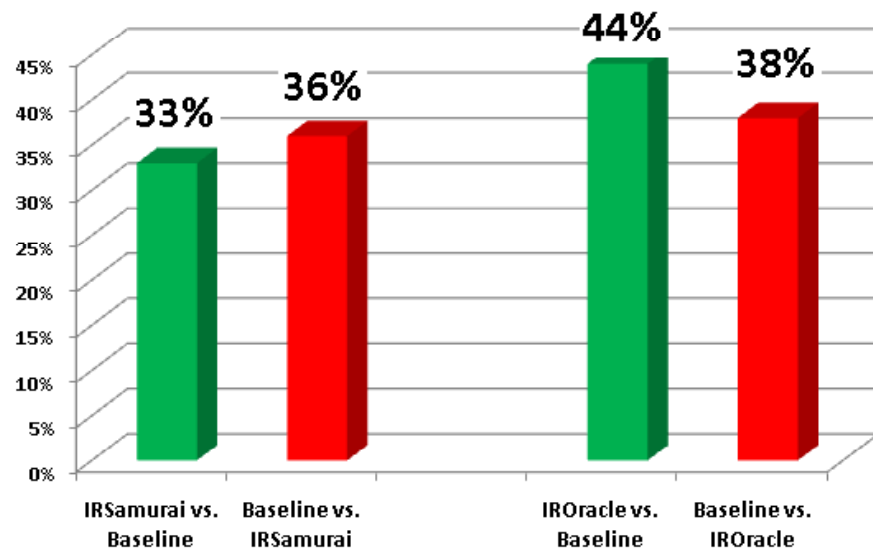


IR



Rhino<sub>Features</sub>

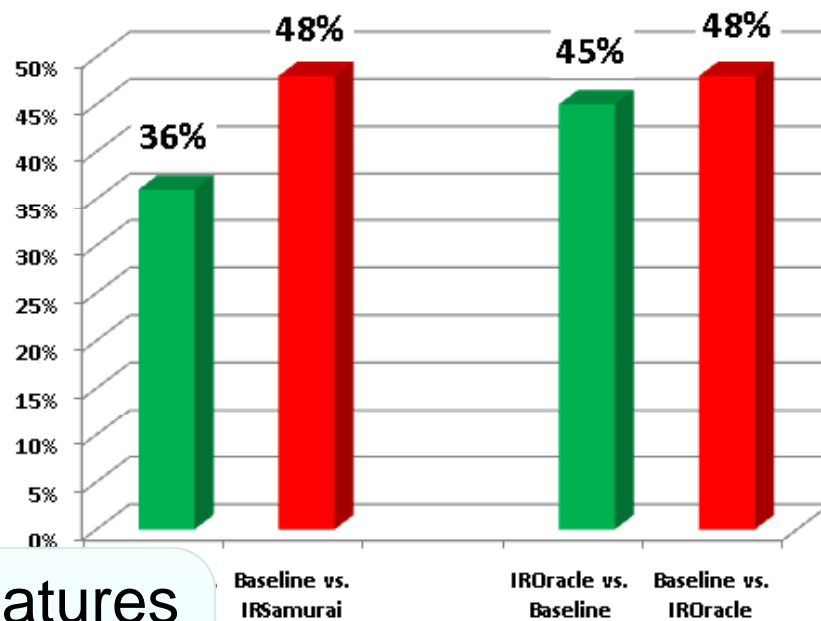
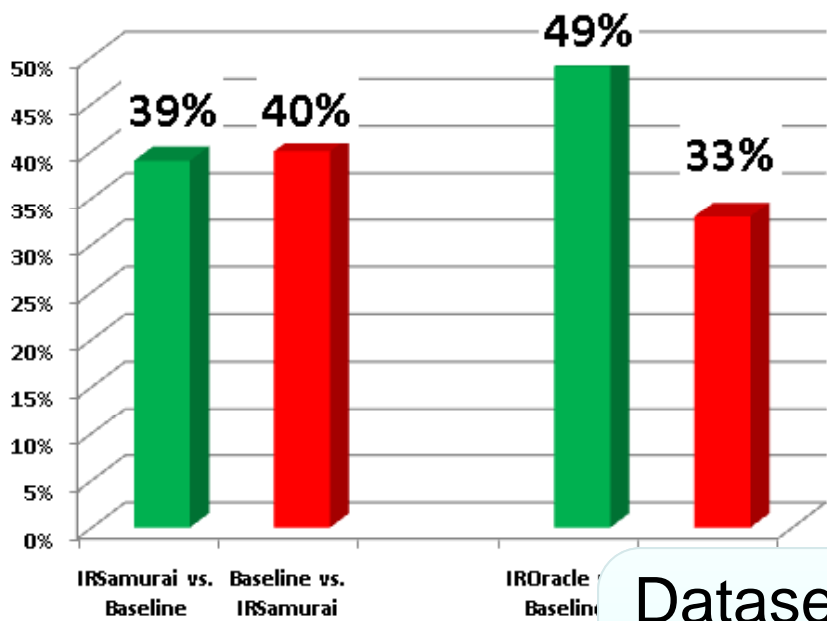
Rhino<sub>Bugs</sub>



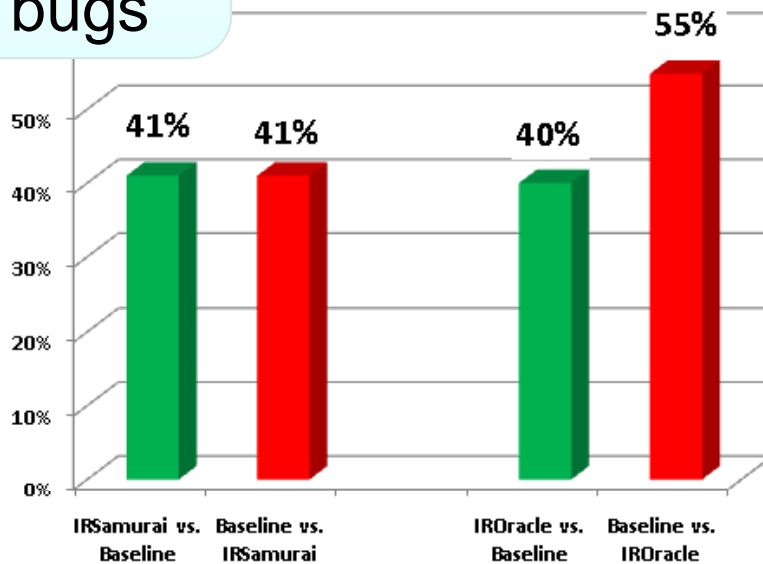
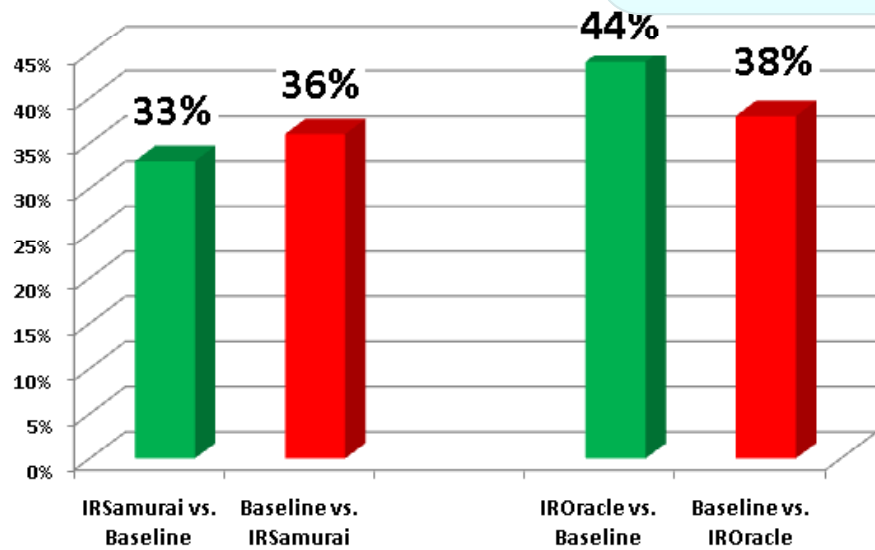
jEdit<sub>Features</sub>

jEdit<sub>Bugs</sub>

IR

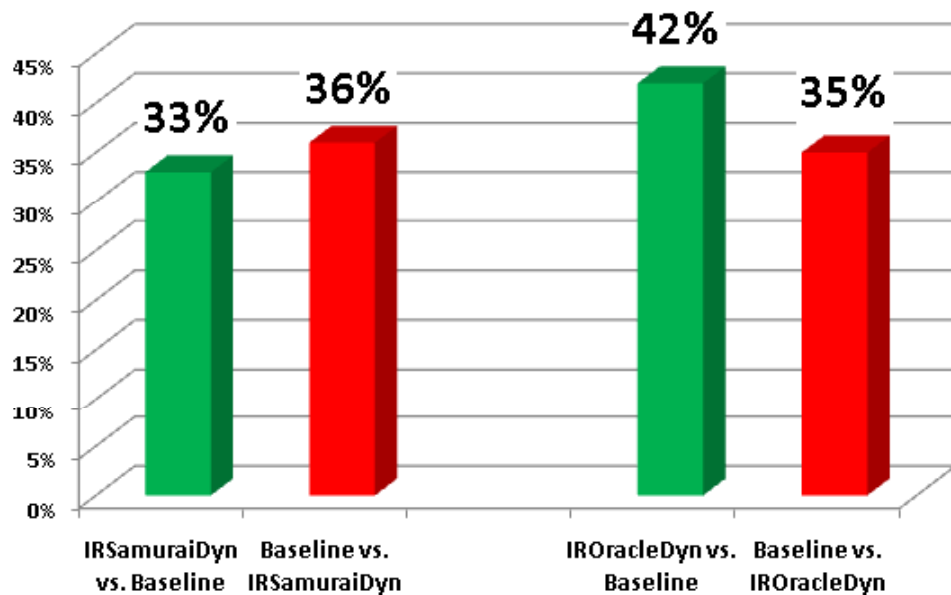


Datasets with features vs. Datasets with bugs



jEditFeatures

jEditBugs



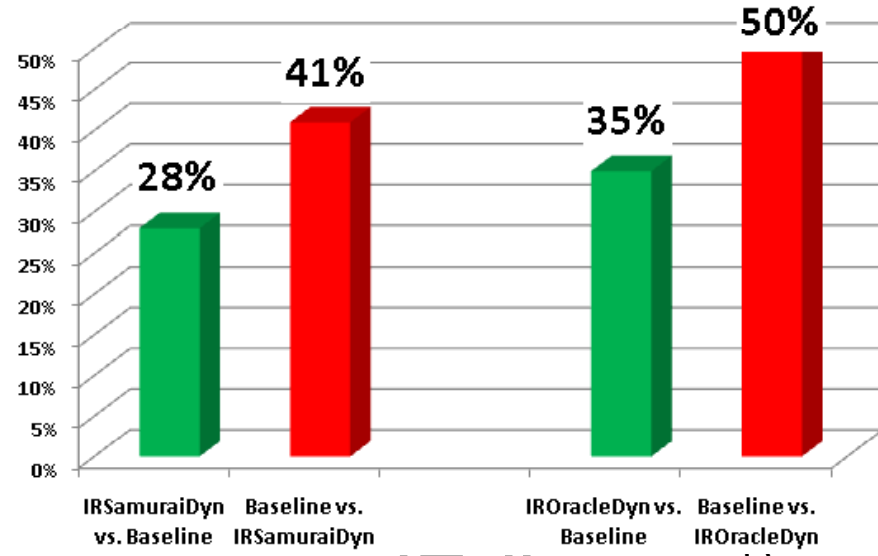
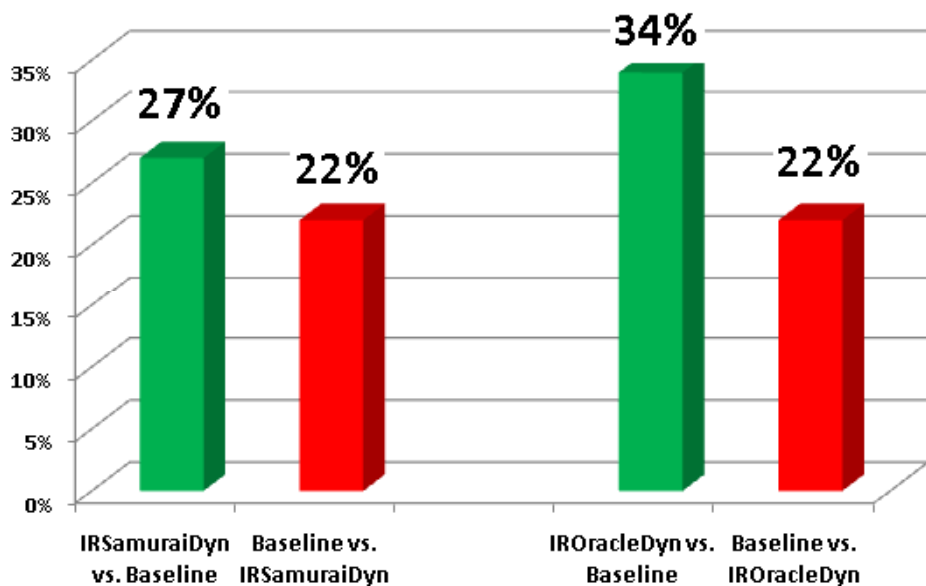
IRDyn

N/A

Similar trend

Rhino<sub>Features</sub>

Rhino<sub>Bugs</sub>



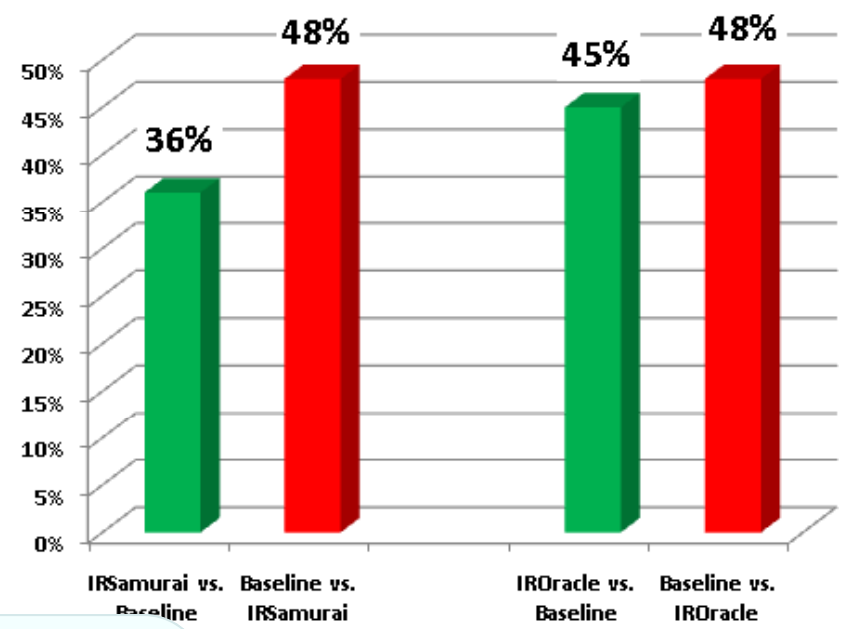
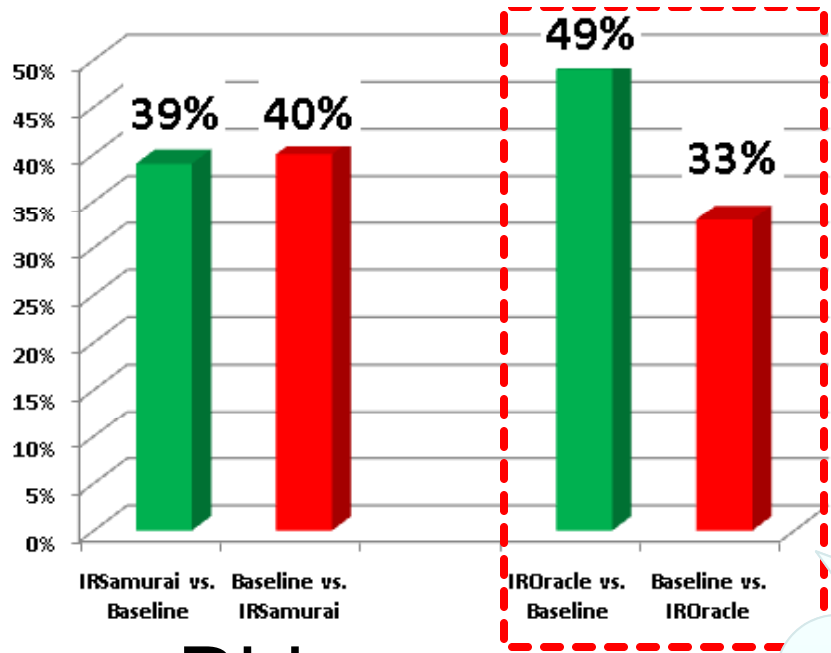
jEdit<sub>Features</sub>

jEdit<sub>Bugs</sub>

# Statistical Results

- Wilcoxon signed-rank test
- Null hypothesis
  - There is no statistical significance difference in terms of effectiveness between  $IR_{\text{Samurai}}/IR_{\text{Oracle}}$  and  $IR_{\text{CamelCase}}$
- Alternative hypothesis
  - $IR_{\text{Samurai}}/IR_{\text{Oracle}}$  has statistically significantly higher effectiveness than  $IR_{\text{CamelCase}}$
- alpha = 0.05

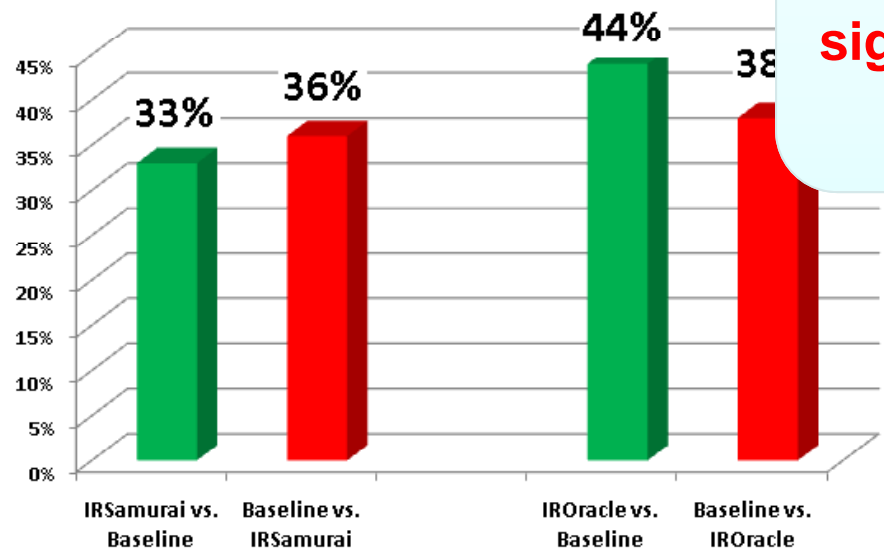
IR



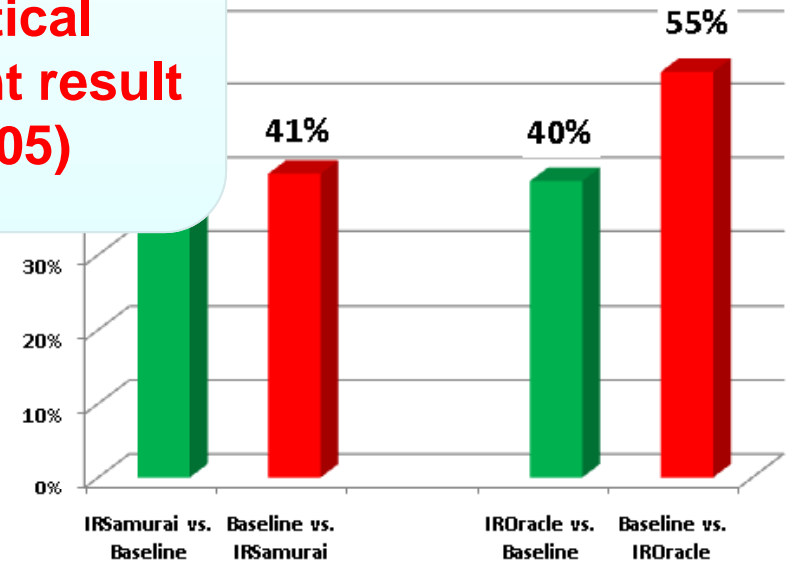
RhinoFeatures

RhinoBugs

The only statistical significant result (p=0.05)



jEditFeatures



iFdit

# Qualitative Results

- Vocabulary mismatch between queries and code:
  - Name of developers (e.g., Slava, Carlos)
  - Identifiers specific to communication (e.g., thanks, greetings, annoying)

# Qualitative Results

- Features are more “descriptive” than bugs

## Tracker: Bugs

5 C+j bug - ID: 1575505

**Details:** Enter this text:

```
: (solid)  
solid-color gl-color rect-dim >r origin get r> ;
```

Select the word (solid). Press C+j.

Expected behavior:

```
: (solid) solid-color gl-color rect-dim >r origin get r> ;
```

Actual:

Nothing happens

# Qualitative Results

- Features are more “descriptive” than bugs

## Tracker: Bugs

5 C+j bug - ID: 1575505

**Details:** Enter this text:

```
: (solid)  
solid-color gl-color rect-dim >r origin get r> ;
```

Select the word (solid). Press C+j.

Expected behavior:

```
: (solid) solid-color gl-color rect-dim >r origin get r> ;
```

Actual:

Nothing happens

**Words “join” and  
“line” are not  
mentioned**



# Threats to Validity

- External
  - 2 Java applications (different domains)
  - More systems needed
- Construct
  - Errors may be present in Oracle and gold sets
  - We used data produced by other researchers
- Internal
  - Subjectivity and bias in building the Oracle
- Conclusion
  - Non-parametric test: Wilcoxon signed-rank

# Research Questions

- RQ1 Does  $IR_{\text{Samurai}}$  outperform  $IR_{\text{CamelCase}}$  in terms of effectiveness? **NO**
- RQ2 Does  $IR_{\text{Samurai}}^{\text{Dyn}}$  outperform  $IR_{\text{CamelCase}}^{\text{Dyn}}$  in terms of effectiveness? **NO**
- RQ3 Does  $IR_{\text{Oracle}}$  outperform  $IR_{\text{CamelCase}}$  in terms of effectiveness? **In some cases (Rhino)**
- RQ4 Does  $IR_{\text{Oracle}}^{\text{Dyn}}$  outperform  $IR_{\text{CamelCase}}^{\text{Dyn}}$  in terms of effectiveness? **NO**

# Future Work

- More systems and datasets
- Different maintenance tasks
  - Traceability link recovery
- Consider other splitting algorithms

# Conclusions

- Advanced splitting technique could improve FLTs
  - We found some empirical evidence
- Splitting has more impact on IR FLT
- If execution information is available, it is not necessary to use an advance splitting technique

# Thank you! Questions?

SEMERU @ William and Mary

<http://www.cs.wm.edu/semeru/>

[bdit@cs.wm.edu](mailto:bdit@cs.wm.edu)



**SEMERU**



**WILLIAM  
& MARY**

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