

# Integrated Impact Analysis for Managing Software Changes

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WILLIAM  
&  
MARY

# Change Impact Analysis

Software change impact analysis aims at estimating the potentially impacted entities of a system due to a proposed change [Bohner and Arnold '96]



# Impact Analysis (IA)



Bug 47087 – Incorrect request body handling with Express. And – consume it the buffers were not released when sending its response prior to sending its body

Status: RESOLVED FIXED  
Product: Apache HTTPD-2  
Component: Core  
Version: 2.2.11  
Platform: All All

Importance: P2 normal with 3 votes (vote)  
Target Milestone: ---  
Assigned To: Apache HTTPD Bugs Mailing List

URL:  
Keywords: FixedInTrunk, PatchAvailable

Depends on:  
Blocks:  
[Show dependency tree](#)

Reported: 2009-04-23 16:08 UTC by Steven Bush  
Modified: 2011-09-17 16:02 UTC (History)  
CC List: 7 users (show)

 Bugzilla

# Impact Analysis (IA)



Bug 47087 – Incorrect request body handling with Express. And – consume it the correct order when sending its response prior to sending its body

Status: RESOLVED FIXED  
Product: Apache Httpd-2  
Component: Core  
Version: 2.2.11  
Platform: All All

Importance: P2 normal with 3 votes (vote)  
Target Milestone: ---  
Assigned To: Apache HTTPD Bugs Mailing List

URL:  
Keywords: FixedInTrunk, PatchAvailable

Depends on:  
Blocks:  
[Show dependency tree](#)



**Bugzilla**



# Impact Analysis (IA)



Bug 47087 - Incorrect request body handling with Express. 200-response is sent before the response body is sent to the client.

Status: RESOLVED FIXED

Product: Apache httpd-2

Component: Core

Version: 2.2.11

Platform: All All

Importance: P2 normal with 3 votes (vote)

Target Milestone: ---

Assigned To: Apache HTTPD Bugs Mailing List

URL: [http://bz.apache.org/bugzilla/show\\_bug.cgi?id=47087](#)

Keywords: FixedInTrunk, PatchAvailable

Depends on: [#47086](#)

Blocks: [#47086](#)

Show dependency tree



**Bugzilla**

## Impact Set

```
index: modules/http/http_filters.c
diff --git a/modules/http/http_filters.c b/modules/http/http_filters.c
--- a/modules/http/http_filters.c (revision 831987)
+++ b/modules/http/http_filters.c (working copy)
@@ -338,6 +338,18 @@
     char *tmp;
     int len;

/* if we send an interim response, we're no longer
 * in a state of expecting one.
 */
f->r->expecting_100 = 0;
tmp = ap_get_pstrroot(f->r->pool, AP_SERVER_PROTOCOL, "
      ap_get_status(100, 25,
      NULL);
```



```
index: server/protocol.c
diff --git a/server/protocol.c b/server/protocol.c
--- a/server/protocol.c (revision 831987)
+++ b/server/protocol.c (working copy)
@@ -1682,6 +1682,7 @@
 {
     hdr_ptr x;
     char *status_line = NULL;
+    request_rec *rr;
```

if (r->proto\_num < 1001) {
 /\* don't send interim response to HTTP/1.0 Client \*/
}

return;

```
index: server/protocol.c
diff --git a/server/protocol.c b/server/protocol.c
--- a/server/protocol.c (revision 831987)
+++ b/server/protocol.c (working copy)
@@ -1682,6 +1682,7 @@
 {
     hdr_ptr x;
     char *status_line = NULL;
+    request_rec *rr;
```

if (r->proto\_num < 1001) {
 /\* don't send interim response to HTTP/1.0 Client \*/
}

return;

# Related Work

## Software change IA via Static and Dynamic Analysis

[Law and Rothermel ICSE'03] [Orso et al. ESEC/FSE'03] [Orso et al. ICSE'04] [Ren et al. OOPSLA'04]

## Software change IA via Information Retrieval

[Canfora and Cerula MSR'06] [Hill et al. ASE'07]  
[Kagdi et al. WCRE'10] [Poshyvanyk et al. EMSE'09]

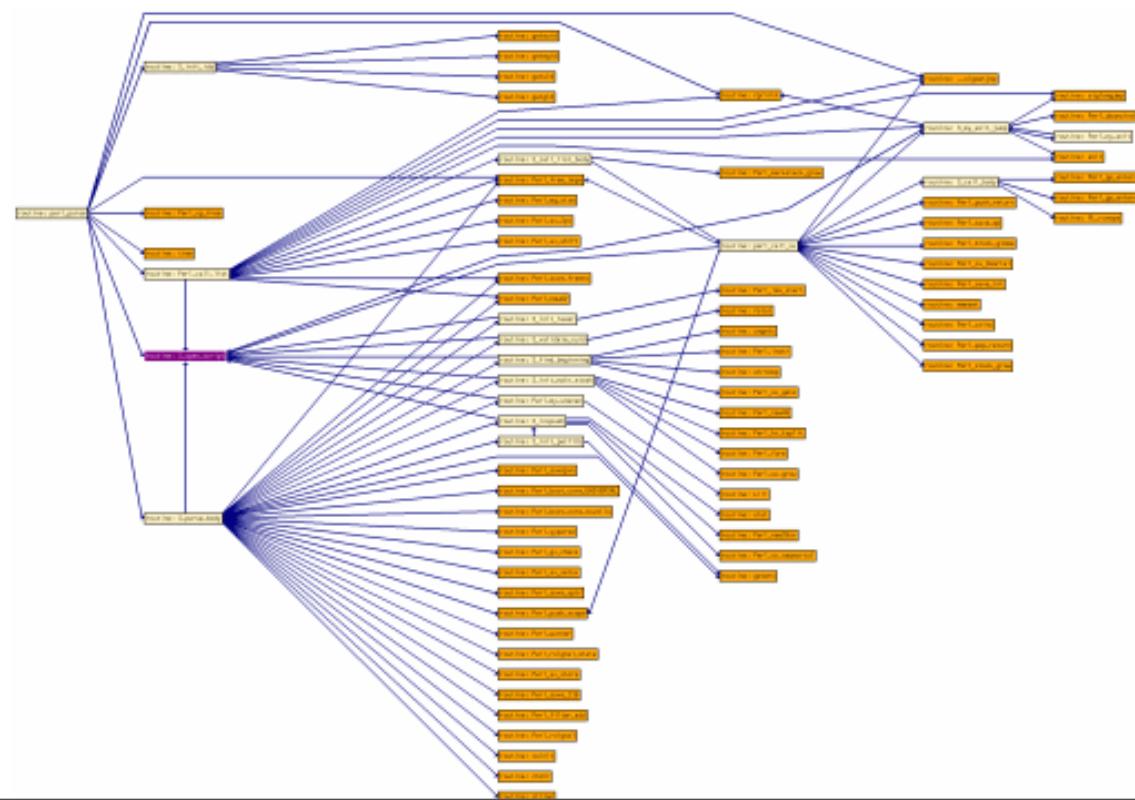
## Software change IA via Mining Software Repositories

[Zimmermann et al. TSE'05] [Gall et al. ICSM'98]  
[Kagdi et al. WCRE'10] [Canfora and Cerula MSR'06]

## Related Work

# Software change IA via static and dynamic Analysis

[Law and Rothermel ICSE'03] [Orso et al. ESEC/FSE'03] [Orso et al. ICSE'04] [Ren et al. OOPSLA'04]



# Related Work

Both relate to "corpus" processing

```
public void run(IProgressMonitor monitor)
    throws InvocationTargetException,
           InterruptedException{
    if ( m_iFlag == 0 )
        processCorpus(monitor,checkUpdate());
    else if ( m_iFlag == 2 )
        processCorpus(monitor,UD_UPDATECORPUS);
    else
        processQueryString(monitor);

    if ( monitor.isCanceled() )
        throw new InterruptedException("The long running
    )
```

```
public void run(IProgressMonitor monitor)
    throws InvocationTargetException,
           InterruptedException{
    if ( m_iFlag == 0 )
        processCorpus(monitor,checkUpdate());
    else if ( m_iFlag == 2 )
        processCorpus(monitor,UD_UPDATECORPUS);
    else
        processQueryString(monitor);

    if ( monitor.isCanceled() )
        throw new InterruptedException("The long running
    )
```

Software change IA via Information Retrieval

[Canfora and Cerula MSR'06] [Hill et al. ASE'07]

[Kagdi et al. WCRE'10] [Poshyvanyk et al. EMSE'09]

# Related Work



Implement functionality related  
to “request body handling”

```
Index: modules/http/http_filters.c
--- modules/http/http_filters.c (revision 831907)
+++ modules/http/http_filters.c (working copy)
@@ -330,6 +330,10 @@
     char *tmp;
     int len;

/* if we send an interim response, we're no longer
 * in a state of expecting one.
 */
f->r->expecting_100 = 0;
tmp = opr_pstrcat(f->r->pool, AP_SERVER_PROTOCOL, " ",
op_get_status_line(HTTP_CONTINUE), CRLF_CRLF,
NULL);
```

```
Index: server/protocol.c
--- server/protocol.c (revision 831907)
+++ server/protocol.c (working copy)
@@ -1682,6 +1682,7 @@
{
    hdr_ptr x;
    char *status_line = NULL;
+    request_rec *rr;

    if (r->proto_num < 1001) {
        /* don't send interim response to HTTP/1.0 Client */
@@ -1701,6 +1702,14 @@
    r->proto_num = 1001;
}
```

Software change IA via Mining Software Repositories

[Zimmermann et al. TSE'05] [Gall et al. ICSM'98]

[Kagdi et al. WCRE'10] [Canfora and Cerula MSR'06]

# Research Goal

Develop a novel Impact Analysis (IA) approach  
that adapts to specific maintenance scenarios

- Information Retrieval (IR), Latent Semantic Indexing (LSI)
- Mining Software Repositories (MSR), Itemset Mining
- Runtime information, execution traces



# Research Goal

How can we integrate these information sources for IA?

• Mining data  
• Itemset Mining  
• Run time information, execution environment



## Scenario-Driven Approach

Default: Given a textual change request, an Information Retrieval (IR) (e.g., Latent Semantic Indexing) is used to estimate the impact set.

# Scenario-Driven Approach

Default: Given a textual change request, an Information Retrieval (IR) (e.g., Latent Semantic Indexing) is used to estimate the impact set.

## Scenario 1:

user provides a verified  
starting entity

```
338,18 08
...
int len;

/* if we send an interim response, we're no longer
 * in a state of expecting one.
 */
f->r->expecting_100 = 0;
tmp = apr_pstrcat(f->r->pool, AP_SERVER_PROTOCOL, " ",
    ap_get_status_line(HTTP_CONTINUE), CRLF,
    NULL);
```



# Scenario-Driven Approach

Default: Given a textual change request, an Information Retrieval (IR) (e.g., Latent Semantic Indexing) is used to estimate the impact set.

## Scenario 2:

user provides an execution trace



```
readAndDispatch -- org.eclipse.swt.widgets.Display  
checkDevice -- org.eclipse.swt.widgets.Display  
isDisposed -- org.eclipse.swt.graphics.Device  
drawMenuBar -- org.eclipse.swt.widgets.Display  
runPopups -- org.eclipse.swt.widgets.Display  
filterMessage -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Control  
WM_TIMER -- org.eclipse.swt.widgets.Control  
windowProc -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Control  
WM_TIMER -- org.eclipse.swt.widgets.Control  
windowProc -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Control
```

# Scenario-Driven Approach

Default: Given a textual change request, an Information Retrieval (IR) (e.g., Latent Semantic Indexing) is used to estimate the impact set.

## Scenario 3:

Both verified starting entity and run-time information are available

```
338,18 08
...
int len;
...
/* if we send an interim response, we're no longer
 * in a state of expecting one.
 */
f->r->expecting_100 = 0;
tmp = apr_pstrcat(f->r->pool, AP_SERVER_PROTOCOL, " ",
    ap_get_status_line(HTTP_CONTINUE), CRLF,
    NULL);
```



```
readAndDispatch -- org.eclipse.swt.widgets.Display
checkDevice -- org.eclipse.swt.widgets.Display
isDisposed -- org.eclipse.swt.graphics.Device
drawMenuBar -- org.eclipse.swt.widgets.Display
runPopups -- org.eclipse.swt.widgets.Display
filterMessage -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Control
WM_TIMER -- org.eclipse.swt.widgets.Control
windowProc -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Control
WM_TIMER -- org.eclipse.swt.widgets.Control
windowProc -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Control
```

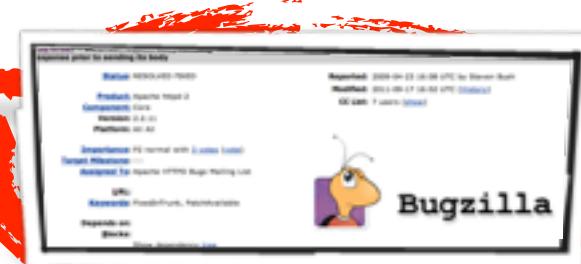
# Approach (IR)

IR (default): Analyzing textual information via IR



# Approach (IR)

IR (default): Analyzing textual information via IR



## Impact Set

```
index http://httpd.apache.org/docs/2.2/modules/http_filters.html
+- modules/http/http_filters.c (revision 831987)
++ modules/http/http_filters.c (working copy)
M -338,6 +338,18 @@
```

char \*tmp;

int len;

/\* if we send an interim response, we're no longer

\* in a state of expecting one.

\*/

f->r->expecting\_100 = 0;

tmp = ~~over\_pstrroot~~(f->r->pool, AP\_SERVER\_PROTOCOL, "

ap\_net\_status\_100\_25

");

NULL);

```
index: server/protocol.c
+- server/protocol.c (revision 831987)
++ server/protocol.c (working copy)
@ -1682,6 +1682,7 @@
```

+

    hdr\_ptr x;

    char \*status\_line = NULL;

+

    request\_rec \*rr;

+

    if (r->proto\_num < 1001) {

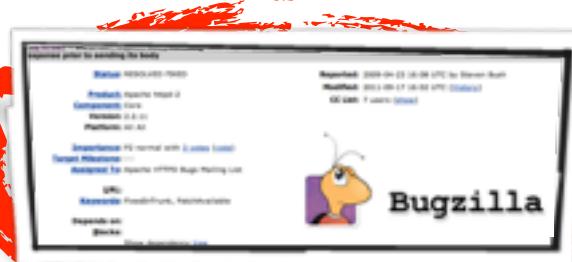
        /\* don't send interim response to HTTP/1.0 Client \*/

@ -1701,6 +1702,14 @@

        return;

# Approach (IR+Dyn)

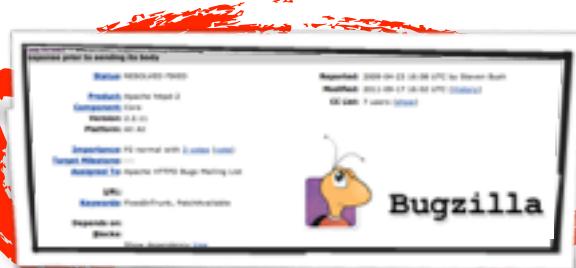
IR+Dyn: Analyzing textual information via IR and execution information via dynamic analysis



```
readAndDispatch -- org.eclipse.swt.widgets.Display
checkDevice -- org.eclipse.swt.widgets.Display
isDisposed -- org.eclipse.swt.graphics.Device
drawMenuBar -- org.eclipse.swt.widgets.Display
runPopups -- org.eclipse.swt.widgets.Display
filterMessage -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Display
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WM_TIMER -- org.eclipse.swt.widgets.Control
windowProc -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Control
```

# Approach (IR+Dyn)

IR+Dyn: Analyzing textual information via IR and execution information via dynamic analysis



```
readAndDispatch -- org.eclipse.swt.widgets.Display
checkDevice -- org.eclipse.swt.widgets.Display
isDisposed -- org.eclipse.swt.graphics.Device
drawMenuBar -- org.eclipse.swt.widgets.Display
runPopups -- org.eclipse.swt.widgets.Display
filterMessage -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Control
WM_TIMER -- org.eclipse.swt.widgets.Control
windowProc -- org.eclipse.swt.widgets.Display
WM_TIMER -- org.eclipse.swt.widgets.Control
windowProc -- org.eclipse.swt.widgets.Display
windowProc -- org.eclipse.swt.widgets.Control
```



## Impact Set

index

```
-- modules/http/http_filters.c (revision 831987)
++ modules/http/http_filters.c (working copy)
M -338,6 +338,18 @@
```

char \*http\_send\_interim\_response(...);

... we send an interim response, we're no longer in state of expecting one.

```
f->proto_num = 8;
tape_set_header(f->r->spool, AP_SERVER_PROTOCOL,
                ap_get_status_line(1702, 0),
                HTTP23);
```

Index: server/protocol.c

```
-- server/protocol.c (revision 831987)
++ server/protocol.c (working copy)
@ -1682,6 +1682,7 @@
```

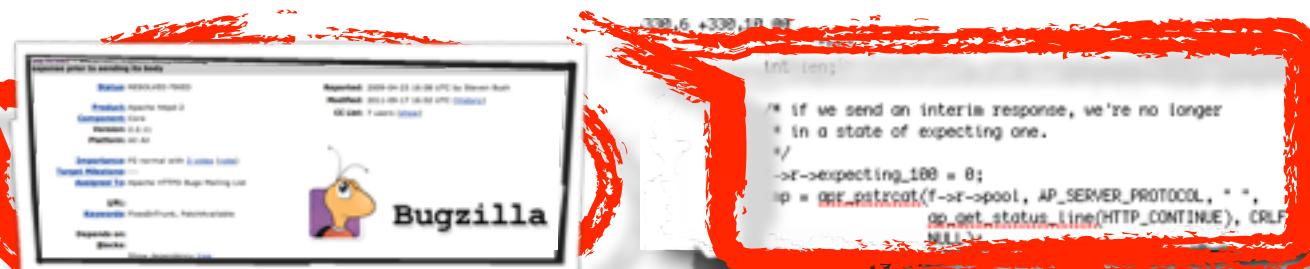
```
    hdr_str x;
    char *status_line = NULL;
    request_rec *r;
```

```
    if (r->proto_num < 1001) {
        /* don't send interim response to HTTP/1.0 Client */
@ -1701,6 +1702,14 @@
```

```
        return;
```

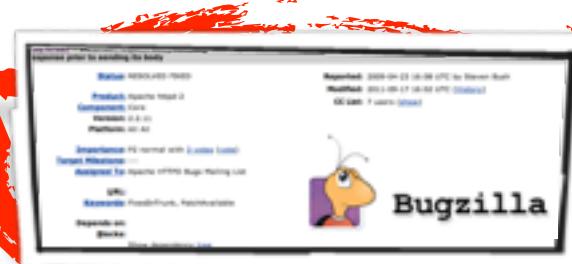
# Approach (IR+Dyn+Hist)

IR+Dyn+Hist: Analyzing textual information via IR, execution information via dynamic analysis, and history via data mining

A red brushstroke continues from the first connection, sweeping across the slide to another screenshot. This one shows a debugger window with assembly code. The code includes instructions like '/\* if we send an interim response, we're no longer in a state of expecting one.', '\*/', '->-expecting\_100 = 0;', and 'op = op->strcat(f->r->pool, AP\_SERVER\_PROTOCOL, " ", op->get\_status\_line(HTTP\_CONTINUE), CRLF, NULL);'. The debugger interface shows memory addresses at the top.

# Approach (IR+Hist)

IR+Hist: Analyzing textual information via IR and history via data mining



```
338,6 +338,18 @@
```

```
    /* if we send an interim response, we're no longer
     * in a state of expecting one.
     */
-sr->expecting_100 = 0;
+ap = apr_pcroot(f->r->pool, AP_SERVER_PROTOCOL, "",
+    ap_get_status_line(HTTP_CONTINUE), CRLF,
+    NULL);
```



## Impact Set

```
index https://bz.apache.org/bugzilla/show_bug.cgi?id=55111
+- modules/http/http_filters.c (revision 831987)
++ modules/http/http_filters.c (working copy)
M -338,6 +338,18 @@
```

```
    char *tap;
    int len;
```

```
    /* if we send an interim response, we're no longer
     * in a state of expecting one.
     */
-sr->expecting_100 = 0;
+ap = apr_pcroot(f->r->pool, AP_SERVER_PROTOCOL, "",
+    ap_get_status_line(HTTP_CONTINUE),
+    NULL);
```

```
Index: server/protocol.c
---
```

```
    --- server/protocol.c (revision 831987)
    +++ server/protocol.c (working copy)
@ -1682,6 +1682,7 @@
```

```
    {
        hdr_ptr x;
        char *status_line = NULL;
+        request_rec *rr;
```

```
        if (r->proto_num < 1001) {
            /* don't send interim response to HTTP/1.0 Client */
@ -1701,6 +1702,7 @@
```

```
            return;
```

```
Index: server/protocol.c
---
```

```
    --- server/protocol.c (revision 831987)
    +++ server/protocol.c (working copy)
@ -1682,6 +1682,7 @@
```

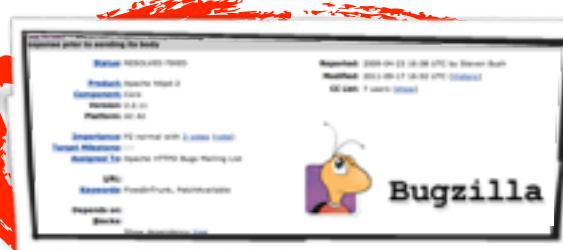
```
    {
        hdr_ptr x;
        char *status_line = NULL;
+        request_rec *rr;
```

```
        if (r->proto_num < 1001) {
            /* don't send interim response to HTTP/1.0 Client */
@ -1701,6 +1702,7 @@
```

```
            return;
```

# Approach (IR+Hist)

IR+Hist: Analyzing textual information via IR and history via data mining

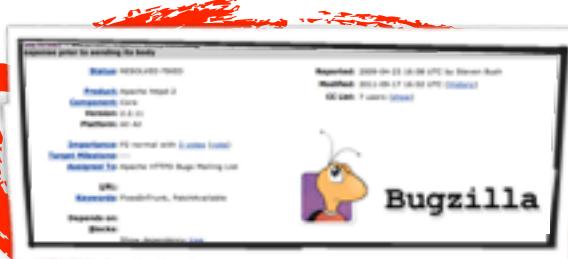


```
-300,6 +336,10 @@  
    int len;  
  
    /* if we send an interim response, we're no longer  
     * in a state of expecting one.  
     */  
    f->r->expecting_100 = 0;  
    tap = apr_pstrcat(f->r->pool, AP_SERVER_PROTOCOL, " ",  
                      ap_get_status_line(HTTP_CONTINUE), CRLF);
```

```
readAndDispatch -- org.eclipse.swt.widgets.Display  
checkDevice -- org.eclipse.swt.widgets.Display  
isDisposed -- org.eclipse.swt.graphics.Device  
drawMenuBar -- org.eclipse.swt.widgets.Display  
runPopups -- org.eclipse.swt.widgets.Display  
filterMessage -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Display  
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WM_TIMER -- org.eclipse.swt.widgets.Control  
windowProc -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Control  
WM_TIMER -- org.eclipse.swt.widgets.Control  
windowProc -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Control
```

# Approach (IR+Hist)

IR+Hist: Analyzing textual information via IR and history via data mining



```
-338,6 +338,18 @@  
    int len;  
  
    /* if we send an interim response, we're no longer  
     * in a state of expecting one.  
     */  
-f->r->expecting_100 = 8;  
tap = apr_pstrcat(f->r->pool, AP_SERVER_PROTOCOL, "",  
                  ap_get_status_line(HTTP_CONTINUE), CRLF  
                  );
```

```
readAndDispatch -- org.eclipse.swt.widgets.Display  
checkDevice -- org.eclipse.swt.widgets.Display  
isDisposed -- org.eclipse.swt.graphics.Device  
drawMenuBar -- org.eclipse.swt.widgets.Display  
runPopups -- org.eclipse.swt.widgets.Display  
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WM_TIMER -- org.eclipse.swt.widgets.Control  
windowProc -- org.eclipse.swt.widgets.Display  
windowProc -- org.eclipse.swt.widgets.Control
```

## Impact Set

Index: server/protocol.c  
--- modules/http/http\_filters.c (revision 831987)  
++ modules/http/http\_filters.c (working copy)  
M -338,6 +338,18 @@  
 char \*x;  
 int len;  
  
 /\* if we send an interim response, we're no longer  
 \* in a state of expecting one.  
 \*/  
-f->r->expecting\_100 = 8;  
tap = apr\_pstrcat(f->r->pool, AP\_SERVER\_PROTOCOL, "",  
 ap\_get\_status\_line(HTTP\_CONTINUE), CRLF  
 );

Index: server/protocol.c  
--- server/protocol.c (revision 831987)  
++ server/protocol.c (working copy)  
M -1682,6 +1682,7 @@  
f  
- hdr\_ptr x;  
- char \*status\_line = NULL;  
+ request\_rec \*rr;  
  
if (r->proto\_num < 1001) {  
 /\* don't send interim response to HTTP/1.0 Client \*/  
- 1701,6 -1702,14 @@  
 return;

Index: server/protocol.c  
--- server/protocol.c (revision 831987)  
++ server/protocol.c (working copy)  
M -1682,6 +1682,7 @@  
f  
- hdr\_ptr x;  
- char \*status\_line = NULL;  
+ request\_rec \*rr;  
  
if (r->proto\_num < 1001) {  
 /\* don't send interim response to HTTP/1.0 Client \*/  
- 1701,6 -1702,14 @@  
 return;

# Impact Analysis - Motivating Example

ArgoUML Bug #2472:

"Wrong keyboard focus in settings dialog after close & reopen [...]"

- 16 methods impacted by bug #2472

Issue 2472

Issue #: 2472	Platform: All	Reporter: mvw (Michiel van der Wulp)
Component: argouml	OS: Windows XP	
Subcomponent: Other	Version: 0.15.2	
Status: CLOSED	Priority: P3	
Resolution: FIXED	Issue type: DEFECT	
	Target milestone: 0.21.2	

Assigned to: tfmorris (Tom Morris)  
URL:  
\* Summary: Wrong keyboard focus in Settings dialog after close & reopen  
Status whiteboard:  
Attachments:  
Issue 2472 depends on: Show dependency tree  
Issue 2472 blocks:  
Votes for issue 2472: Vote for this issue  
[View issue activity](#) | [Format for printing](#) | [Format as XML](#)  
Description: Opened: Sat Jan 3 14:38:00 -0700 2004 Sort by: Oldest first  
The keyboard focus (indicated by a blue rectangle) location remains after losing the Settings dialog box with the close button in the window border and reopening it.

- IR (default):

2,16,30,...

- IR+DYN

1,3,5,7,11,12,14,29,...

# Impact Analysis - Case Study

Four open source software systems, namely ArgouML, JabRef, jEdit and muCommander

Commits in the version history used as ground truth, i.e., actual impact sets

Widely used metrics precision (false positives), recall (false negatives), and f-measure (combination of precision and recall) used for accuracy measure

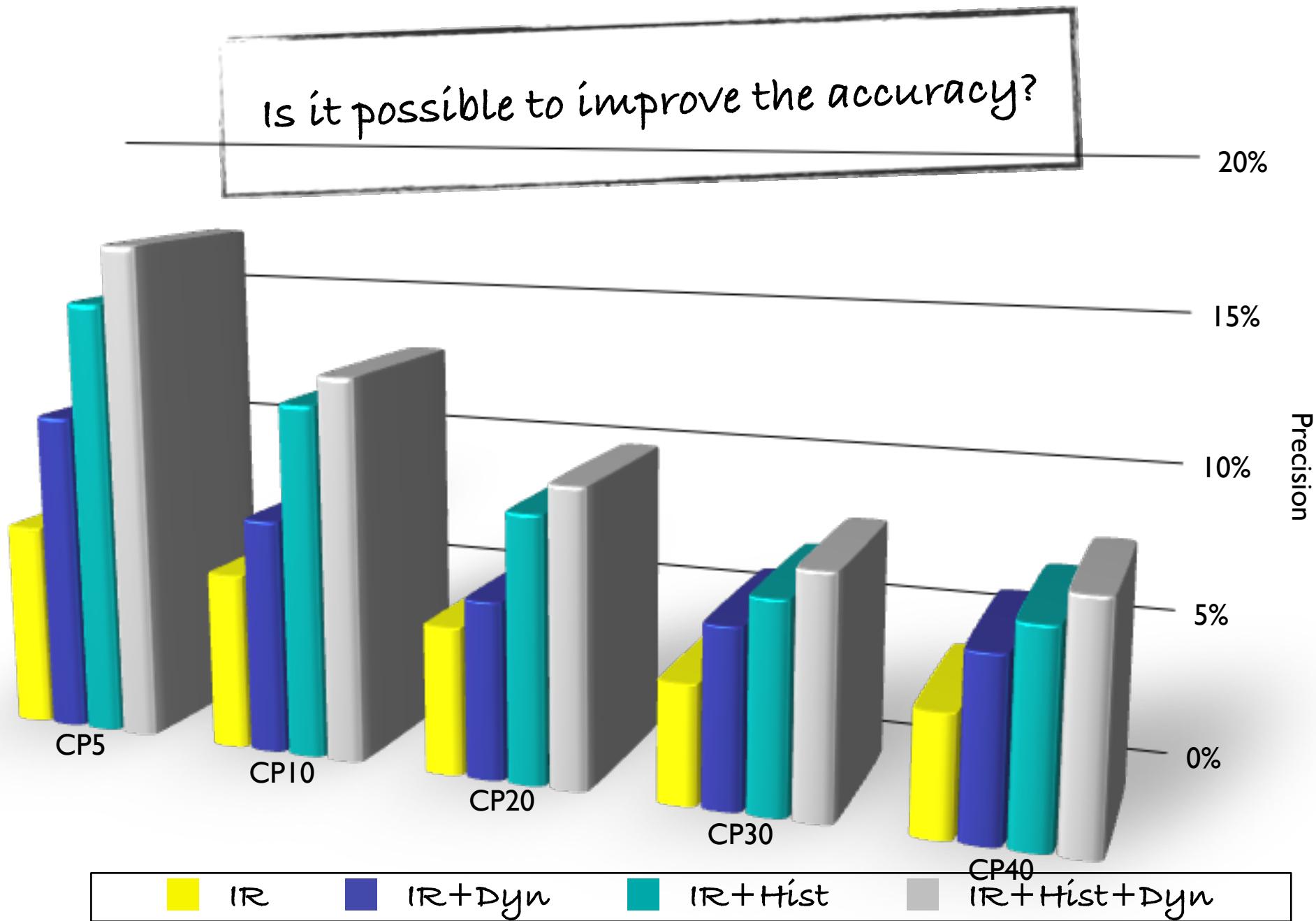
System	Version	LOC	Files	Methods	Terms
ArgouML	0.22	148K	503	6K	4K
JabRef	2.6	74K	1,439	11K	5K
jEdit	4.3	103K	1,069	8K	4K
muCommander	0.8.5	76K	577	4K	5K

# Impact Analysis - Research Question

Does providing more information improve the accuracy of IA when compared to the default approach?

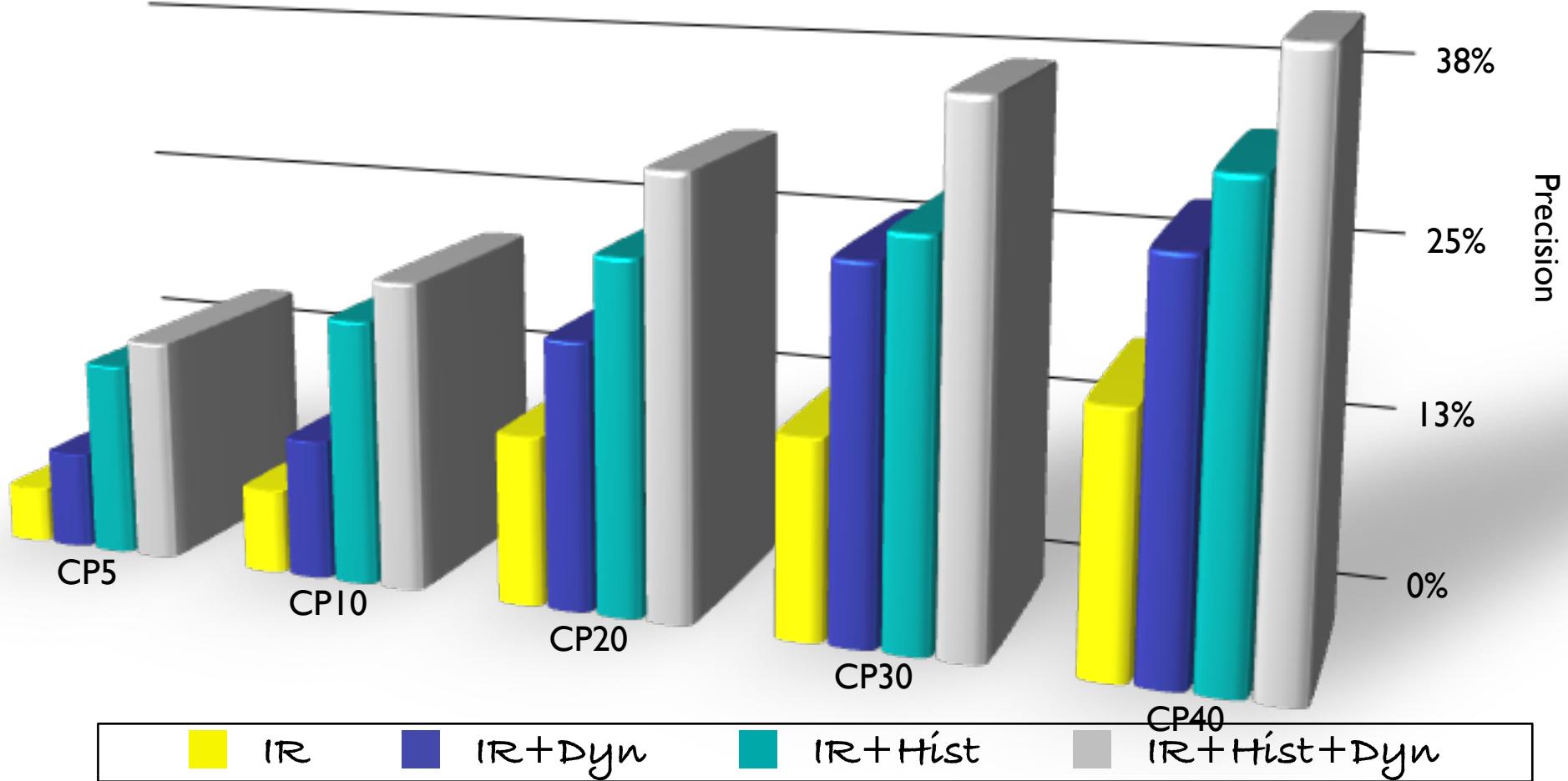


# Impact Analysis - Main Results



# Impact Analysis - Main Results

Is it possible to improve the accuracy?



## Impact Analysis - Main Results

The best results are obtained in scenarios where both a verified starting entities and execution information are available.

Recall improvements of up to 41% over the default approach and up to 17% over the evolutionary technique in iBatis



# Impact Analysis - Main Results

The best results are obtained in scenarios  
with verified starting entities and  
all parameters are available.

ARE OUR RESULTS STATISTICALLY SIGNIFICANT?

Recall implementation approach and up-to-date default technique in iBatis



# Impact Analysis - Statistical Test

Does providing more information significantly improve results of impact analysis compared to using the default approach?



# Impact Analysis - Results of Wilcoxon Signed-Rank Test

System	$H_{OPI}$	$H_{OR1}$	$H_{OP2}$	$H_{OR2}$	$H_{OP3}$	$H_{OR3}$
ArgouML	<u>&lt; 0.0001</u>					
JabRef	0.266	0.324	0.381	<u>&lt; 0.0001</u>	0.091	<u>&lt; 0.0001</u>
jEdit	<u>&lt; 0.0001</u>	<u>&lt; 0.0001</u>	0.068	<u>&lt; 0.0001</u>	<u>&lt; 0.0001</u>	<u>&lt; 0.0001</u>
muCommander	<u>&lt; 0.0001</u>	<u>&lt; 0.0001</u>	0.425	<u>&lt; 0.0001</u>	<u>&lt; 0.0001</u>	<u>&lt; 0.0001</u>

$H_{OPI}$ : IR+Dyn does not significantly improve precision (compared to IR)

$H_{OR1}$ : IR+Dyn does not significantly improve recall (compared to IR)

$H_{OP2}$ : IR+Hist does not significantly improve precision (compared to IR)

$H_{OR2}$ : IR+Hist does not significantly improve recall (compared to IR)

$H_{OP3}$ : IR+Dyn+Hist does not significantly improve precision (compared to IR)

$H_{OR3}$ : IR+Dyn+Hist does not significantly improve recall (compared to IR)

# Impact Analysis - Results of Wilcoxon Signed-Rank Test

	$H_{OPI}$	$H_{OP2}$	$H_{OR2}$	$H_{OP3}$	$H_{OR3}$
JabRef			< 0.0001	< 0.0001	< 0.0001
jEdit	< 0.0001			0.091	< 0.0001
muCommander	< 0.0001	< 0.0001			< 0.0001

**RESULTS ARE STATISTICALLY SIGNIFICANT!**

$H_{OPI}$ : IR+Dyn does not significantly improve precision (compared to IR)

$H_{OR1}$ : IR+Dyn does not significantly improve recall (compared to IR)

$H_{OP2}$ : IR+Hist does not significantly improve precision (compared to IR)

$H_{OR2}$ : IR+Hist does not significantly improve recall (compared to IR)

$H_{OP3}$ : IR+Dyn+Hist does not significantly improve precision (compared to IR)

$H_{OR3}$ : IR+Dyn+Hist does not significantly improve recall (compared to IR)

# Threats to validity

Commits used as gold standard for accuracy computation

- Not all the entities in a commit maybe related to a single change request
- All the entities related to a single change request maybe present in a single commit
- Developer established actual change-sets

Quality of dynamic traces obtained for change request

Statistically significant results for the four open source Java systems may not generalize

# Conclusion

Scenario-driven combination of IR, dynamic analysis and MSR techniques for IA

Recall improvements of up to 41% over the default approach

Precision improvement up to 17% over the default approach

# Thank You



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