

DynaMine

Finding Common Error Patterns by
Mining Software Revision Histories

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Error Pattern Iceberg

The usual suspects

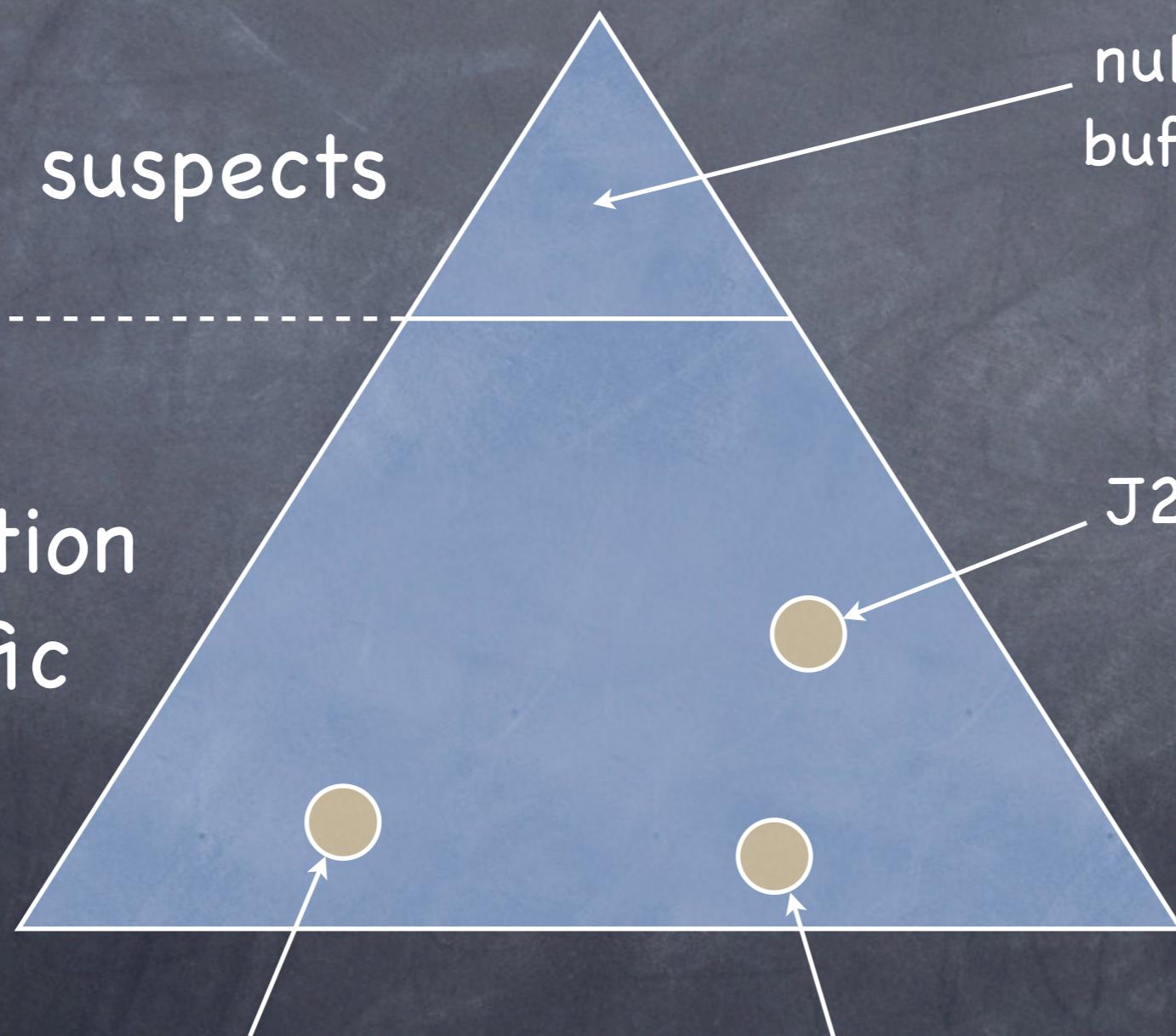
Application
specific

Device drivers

Linux code

null dereferences,
buffer overruns, ...

J2EE servlets



Co-changed items = patterns

Co-added Method Calls

```
public void createPartControl(Composite parent) {  
    ...  
}  
  
public void dispose() {  
    ...  
}
```

Co-added Method Calls

```
public void createPartControl(Composite parent) {  
    ...  
    // add listener for editor page activation  
    getSite().getPage().addPartListener(partListener);  
}  
  
public void dispose() {  
    ...  
    getSite().getPage().removePartListener(partListener);  
}
```

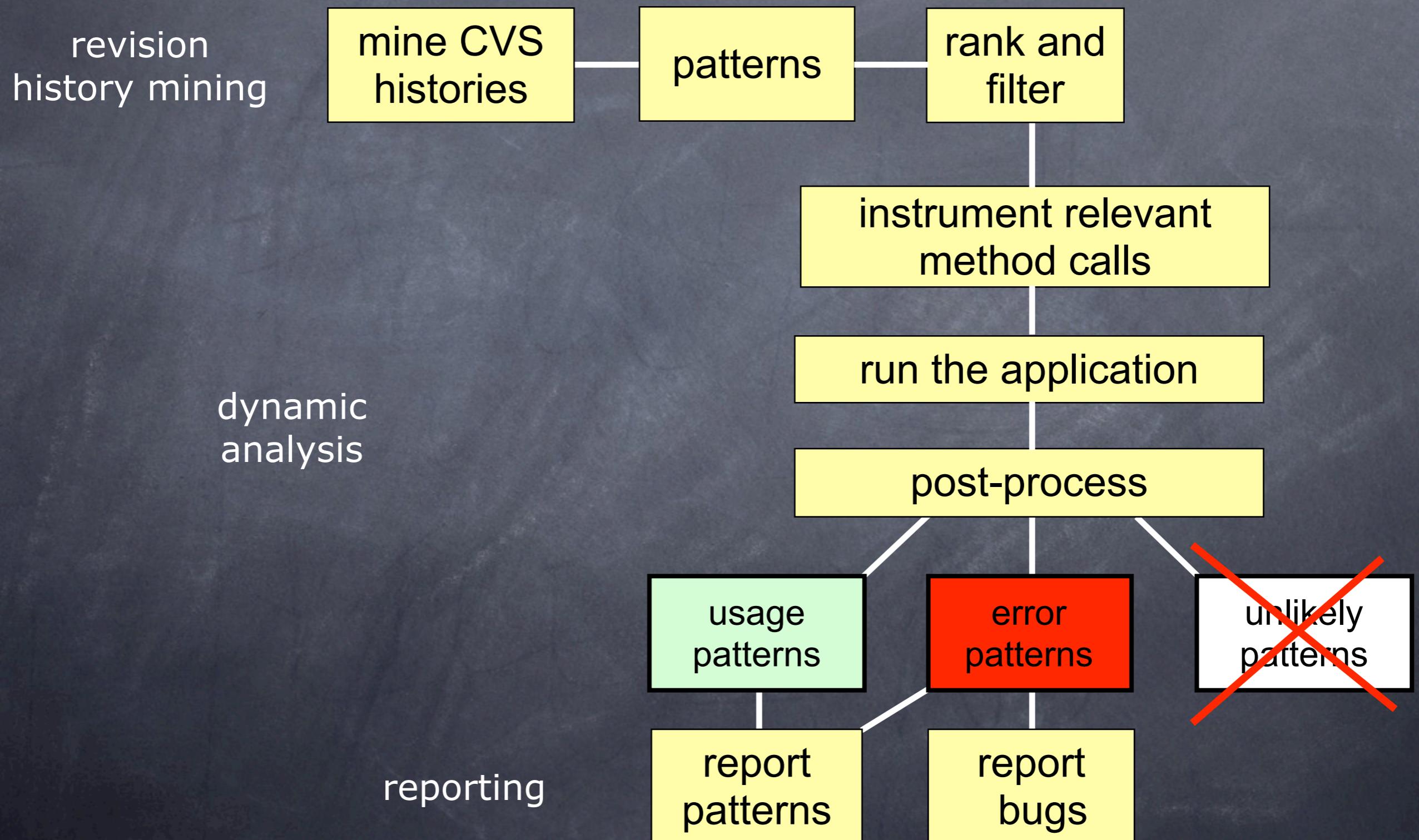
Co-added Method Calls

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public void createPartControl(Composite parent) {  
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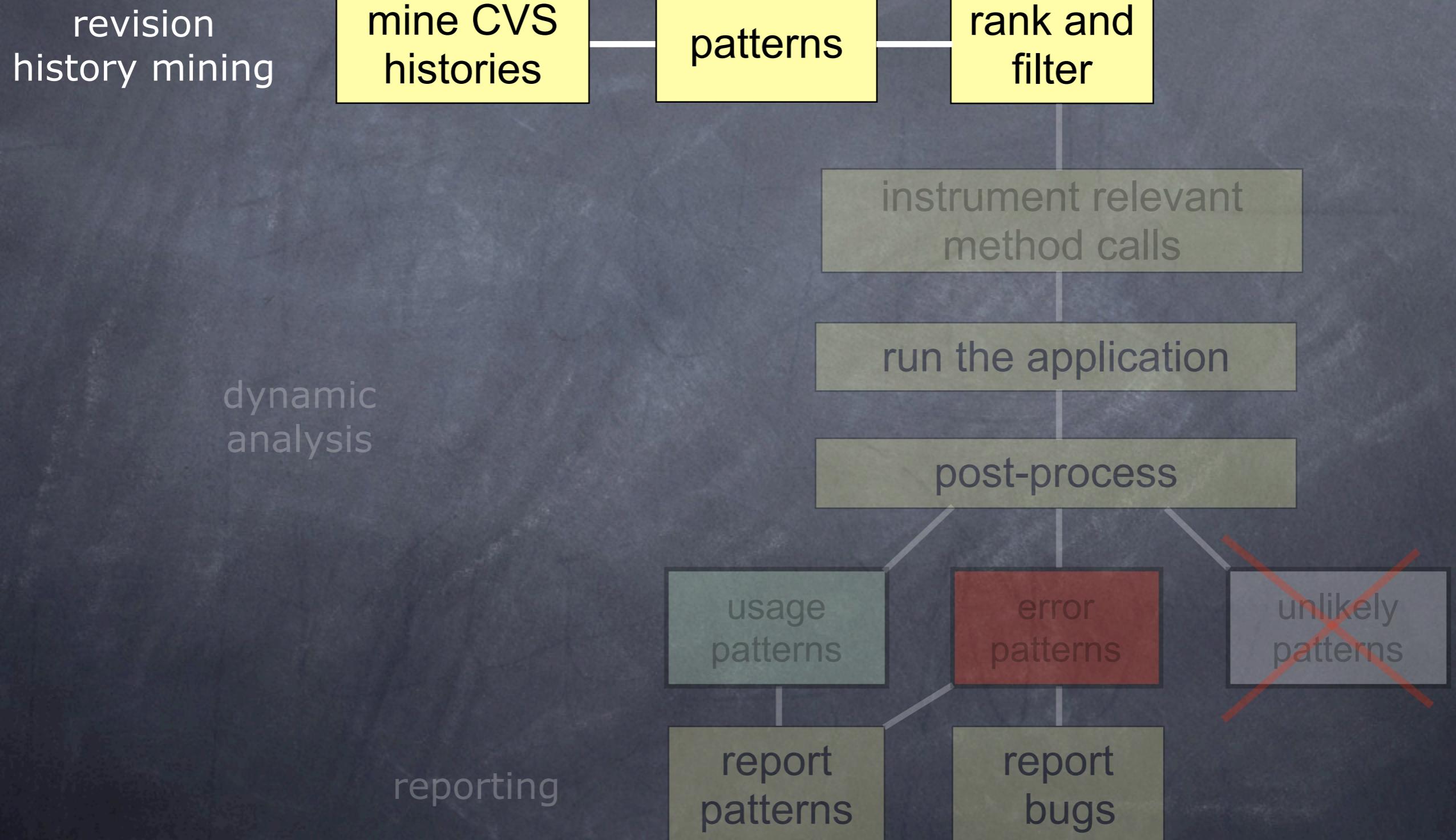


co-added

How DynaMine Works



Mining Patterns



Mining Method Calls

Foo.java
1.12

o1.addListener()
o1.removeListener()

Bar.java
1.47

o2.addListener()
o2.removeListener()
System.out.println()

Baz.java
1.23

o3.addListener()
o3.removeListener()
list.iterator()
iter.hasNext()
iter.next()

Qux.java
1.41

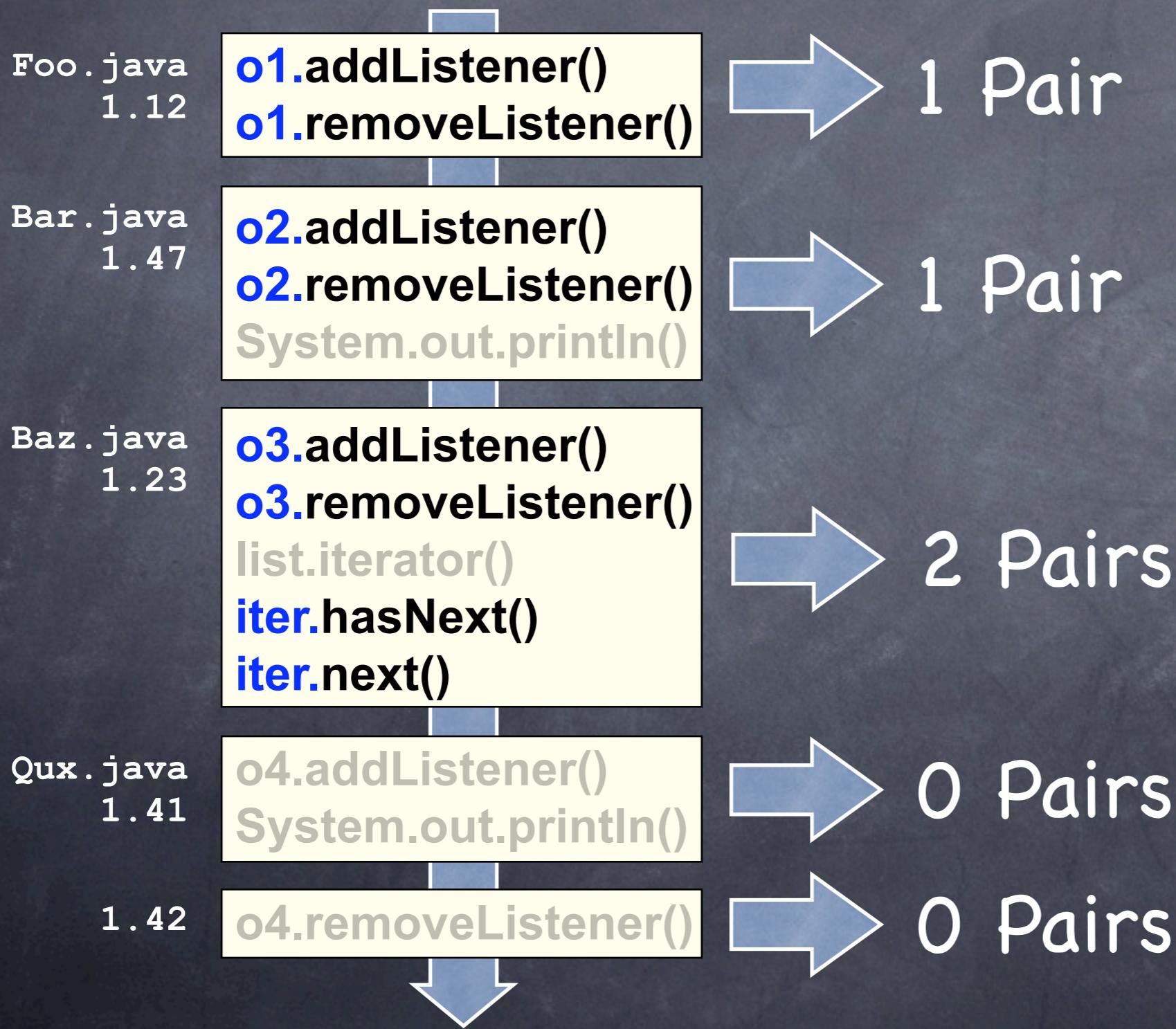
o4.addListener()
System.out.println()

1.42

o4.removeListener()

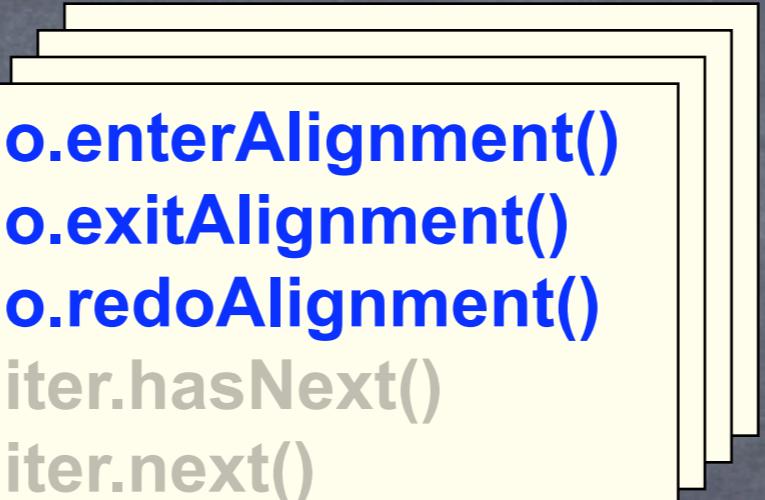


Finding Pairs



Finding Patterns

- Find “frequent itemsets” (with Apriori)



o.enterAlignment()
o.exitAlignment()
o.redoAlignment()
iter.hasNext()
iter.next()



{enterAlignment(), exitAlignment(),
redoAlignment()}

Ranking Patterns

Foo.java
1.12

o1.addListener()
o1.removeListener()

Bar.java
1.47

o2.addListener()
o2.removeListener()
`System.out.println()`

Baz.java
1.23

o3.addListener()
o3.removeListener()
`list.iterator()`
`iter.hasNext()`
`iter.next()`

Qux.java
1.41

o4.addListener()
`System.out.println()`

1.42

o4.removeListener()

- ⦿ Support count =
#occurrences of a pattern
- ⦿ Confidence =
strength of a pattern, $P(A|B)$

Ranking Patterns

Foo.java
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1.41

o4.addListener()
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o4.removeListener()

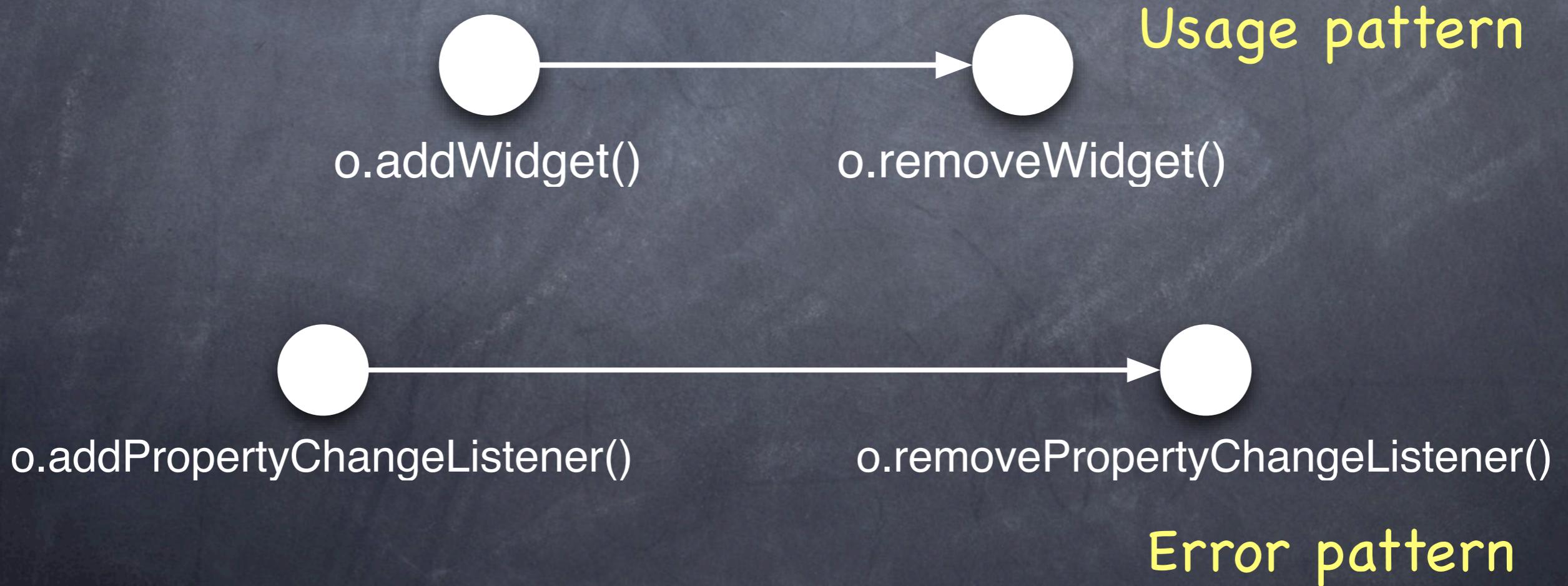
This is a fix!
Rank removeListener()
patterns higher

Investigated Projects

	JEDIT	ECLIPSE
since	2000	2001
developers	92	112
lines of code	700,000	2,900,000
revisions	40,000	400,000

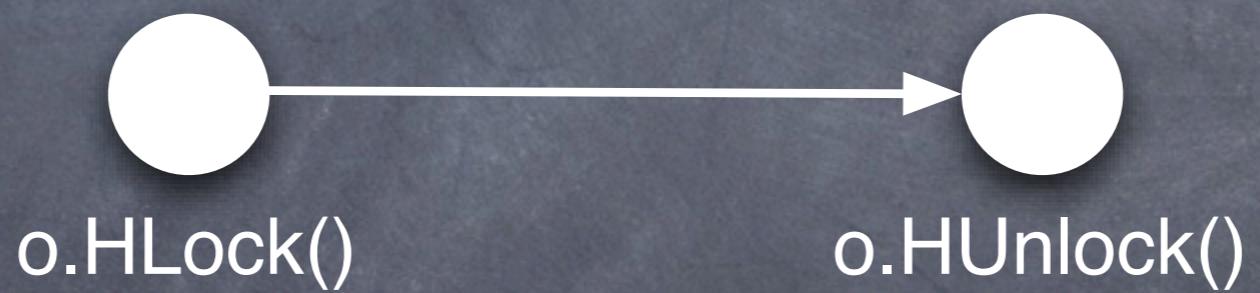
Simple Method Pairs

GUIs & Listener



Simple Method Pairs

⌚ Locking of Resources

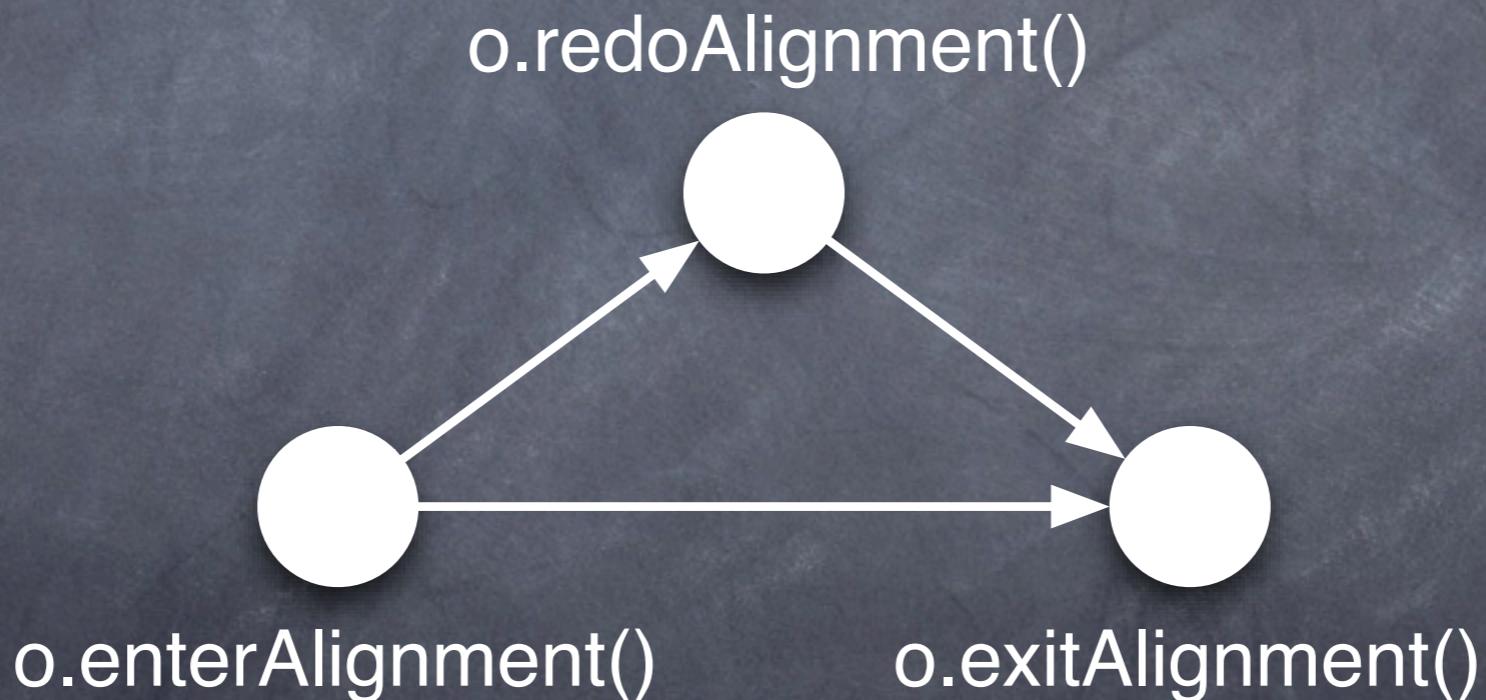


Not hit at runtime

State Machines in Eclipse

⌚ Pretty-printing

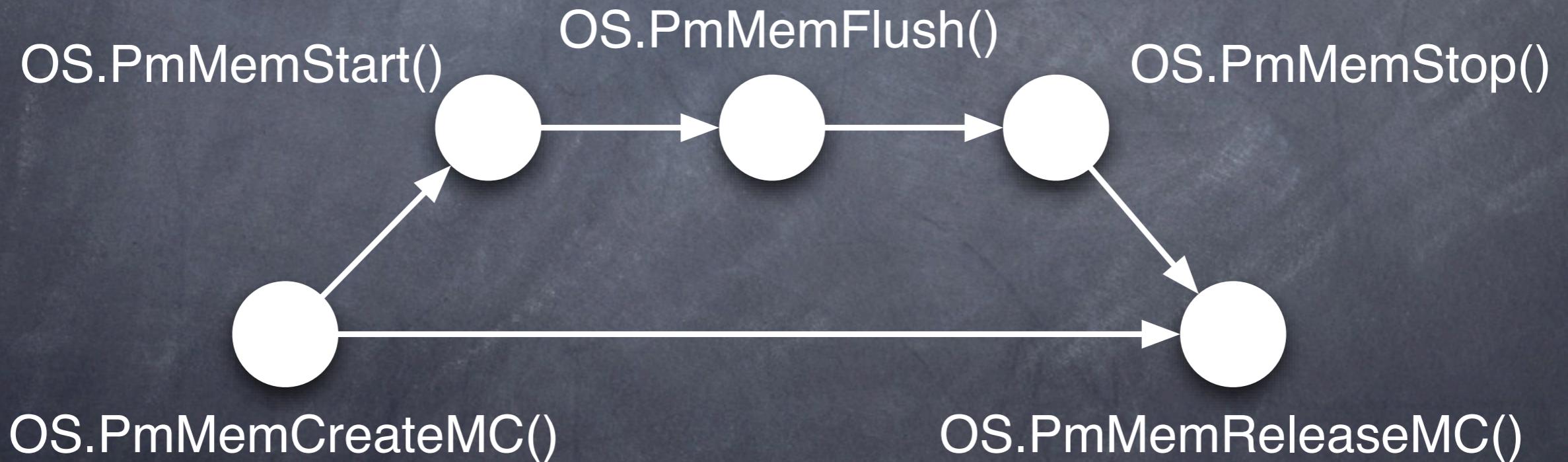
Usage pattern



State Machines in Eclipse

- Memory context manipulation

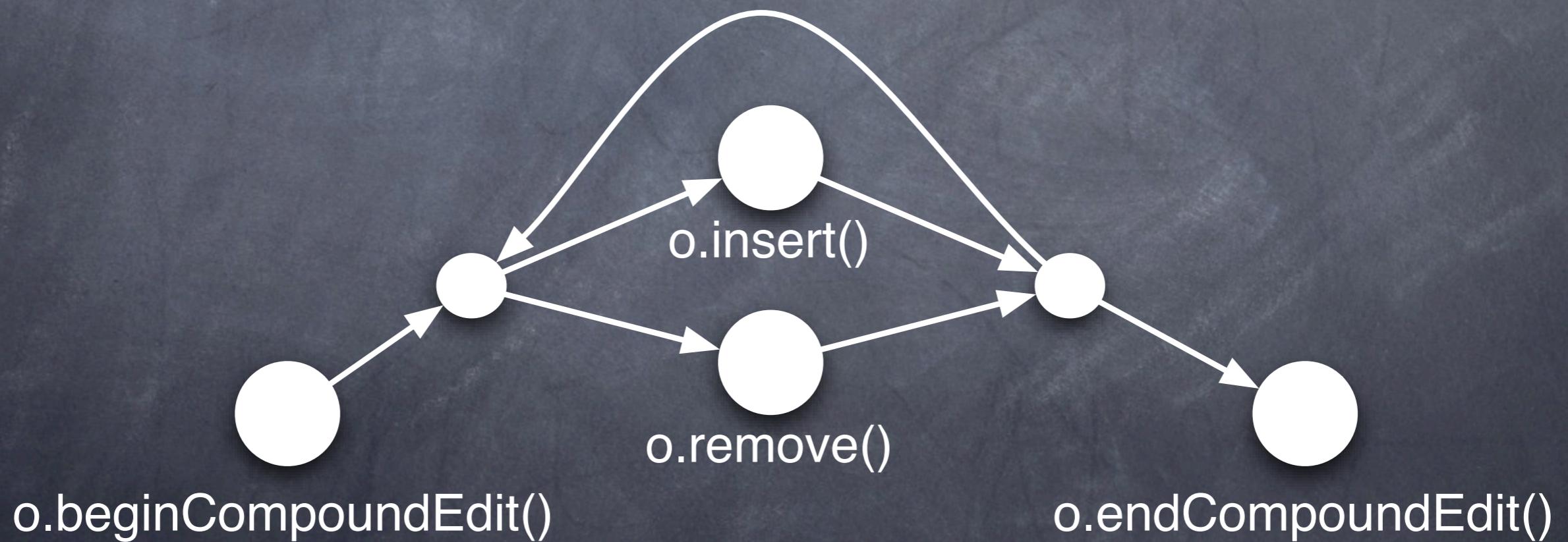
Not hit at runtime



State Machines in JEdit

- Compound edits (for undo/redo)

Usage pattern



Complex Patterns

```
try {
    monitor.beginTask(null, Policy.totalWork);
    int depth = -1;
    try {
        workspace.prepareOperation(null, monitor);
        workspace.beginOperation(true);
        depth = workspace.getWorkManager().beginUnprotected();
        return runInWorkspace
            (Policy.subMonitorFor(monitor, Policy.opWork,
                SubProgressMonitor.PREPEND_MAIN_LABEL_TO_SUBTASK));
    } catch (OperationCanceledException e) {
        workspace.getWorkManager().operationCanceled();
        return Status.CANCEL_STATUS;
    } finally {
        if (depth >= 0)
            workspace.getWorkManager().endUnprotected(depth);
        workspace.endOperation(null, false,
            Policy.subMonitorFor(monitor, Policy.endOpWork));
    }
} catch (CoreException e) {
    return e.getStatus();
} finally {
    monitor.done();
}
```

Complex Patterns

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```

Workspace Transactions

Usage pattern

S → O*

O → w.prepareOperation()
w.beginOperation()
U*
w.endOperation()

U → w.getWorkManager().beginUnprotected()
S
[w.getWorkManager().operationCanceled()]
w.getWorkManager().beginUnprotected()

Dynamic Validation

revision
history mining

mine CVS
histories

patterns

rank and
filter

instrument relevant
method calls

dynamic
analysis

run the application

post-process

usage
patterns

error
patterns

unlikely
patterns

reporting

report
patterns

report
bugs

Pattern classification

post-process

v validations, e violations

usage
patterns

$e < v/10$

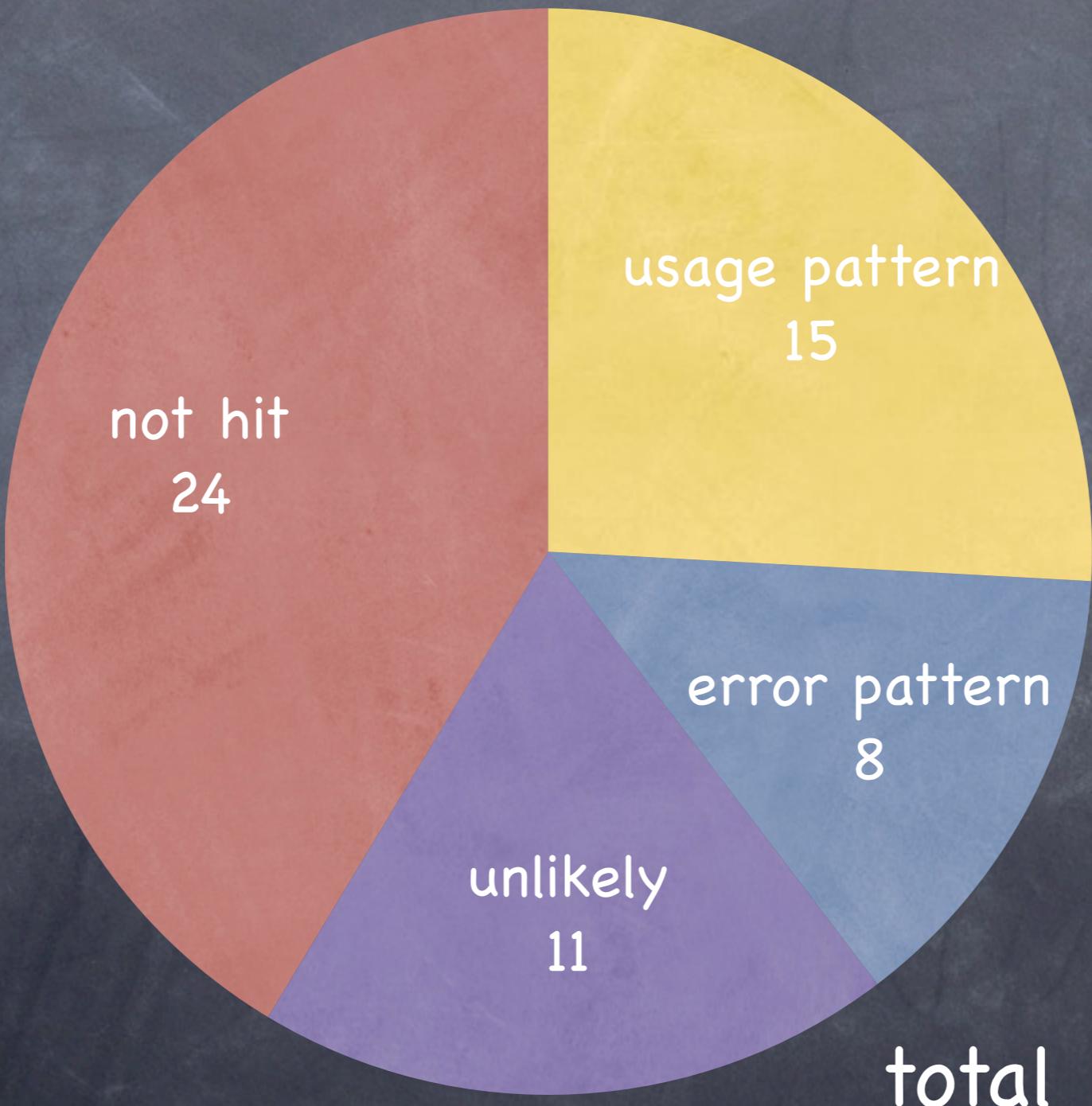
error
patterns

$v/10 \leq e \leq 2v$

unlikely
patterns

otherwise

Experiments



Future Work

- ⦿ Automatically generate state machines
- ⦿ Additional patterns by textual matching
- ⦿ Programmer assist tools
Programmers who inserted a call to open()
inserted a call to close()
- ⦿ Aspect Mining

Contributions

- DynaMine learns usage patterns from large version archives.
- DynaMine ranks patterns effectively, especially for finding error patterns.
- DynaMine increases trust in patterns by dynamic analysis