Welcome to IWACO'17!

International Workshop on Aliasing, Capabilities and Ownership

Morning Schedule

- · Spencer: Tracing as a service Stephan Brandauer
- Are Your Incoming Aliases Really Necessary?
 Remembering the Cost of Object Ownership
 Alex Potanin
- Reference Capabilities in Practice: Examining Real-World Pony Code

Sylvan Clebsch

Lunch: 12:30-14:00

Schedule

- Aliasing, Capabilities and Ownership in Rust Felix Klock
- · Introducing Ownership Type Constraints to UML/OCL Jagadeeswaran Thangaraj & Senthil Kumaran
- Towards Reasonable Ownership
 Anya Helene Bagge, Kristoffer Haugsbakk & Vadim Zaytsev

Coffee: 15:30-16:00

 Adding Safe Manual Memory Management to .NET Dimitrios Vytiniotis

Spencer: Tracing as a Service

UPPSALA UNIVERSITET

Stephan Brandauer, Tobias Wrigstad http://stbr.me/spencer sbrandauer





• Web service: analyse pre-recorded program traces



- Web service: analyse pre-recorded program traces
- Focus on side effects, heap structure, aliasing, ...



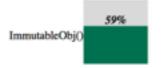
- Web service: analyse pre-recorded program traces
- Focus on side effects, heap structure, aliasing, ...
- Domain specific language (DSL) for trace analysis



Query



refine query >

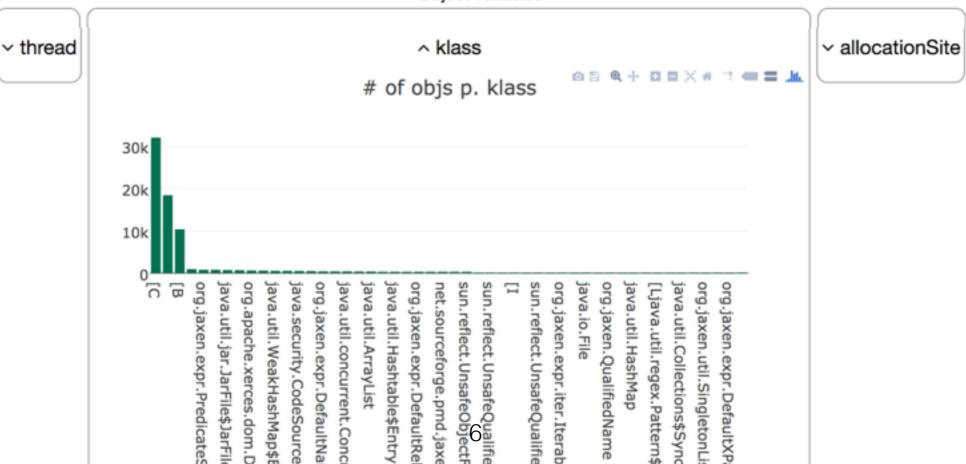


ImmutableObj()

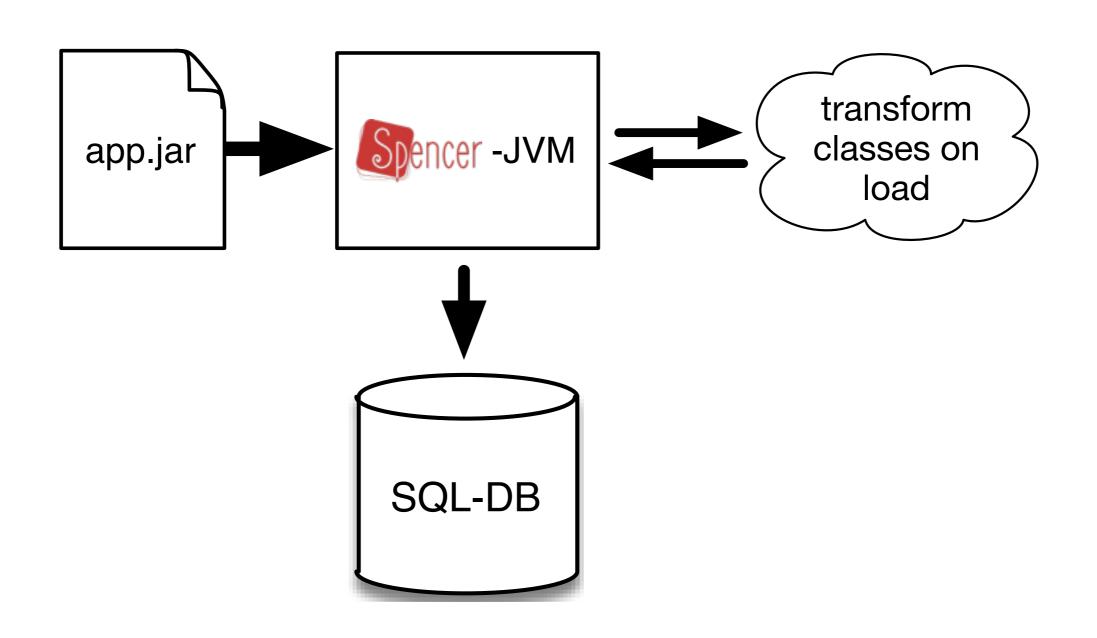
ImmutableObj()

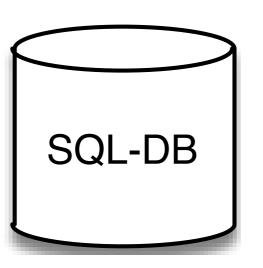
22262 3,55290 3,108807 3,40448 3,8533 3,66609 3,9243 3,10627 3,41308 3,54793 3,66093 3,48678 3,56196 3,77345 3,12858 4,54731 3,16278 3,29801 3,96673 3,39154 3,85392 3,68518 3,16408 3,141228 3,54121 3,139916 3,119341 3,62215 3,40253 3,49056 3,79561 3,96317 3,65342 3,63428 3,99460 3,124764 3,115231 3,101095 3,65977 3,84802 3,47793 3,34937 3,64994 3,75497 3,8716 3,146874 3,18539 3,64090 3,36016 3,38397 3,55562 3,11200 3,99036 3,24838 3,62344 3,12074 3,45433 3,106361 3,32199 3,85783 3,98466 3,74916 3,55009 3,71290 3,27721 3,143788 3,49658 3,40971 3,143747 3,142504 3,74381 3,44885 3,28015 3,18659 3,11283 3,43279 3,49995 3,71224 3,76333 3,55733 3,99476 3,124139 3,100185 3,31281 3,44301 3,82081 3,139543 3,76363 3,82299 3,146466 3,114103 3,19130 3,6700 3,86022 3,50274 3,145559 3,121670 3,56830 3,45940 3,77441 total

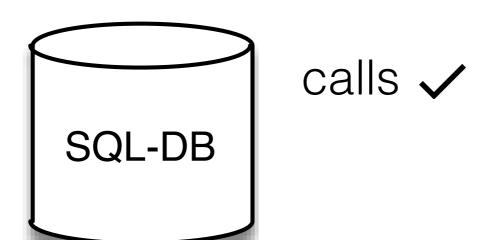
Object Variables



Collecting Data



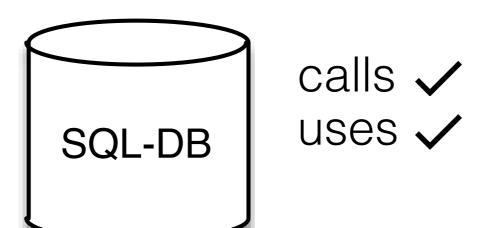




```
# SELECT * FROM calls WHERE callstart = 511073;

caller | callee | name | callstart | callend | callsitefile | callsiteline | thread

10530 | 10247 | startsWith | 511073 | 511091 | MetaIndex.java | 242 | main
```



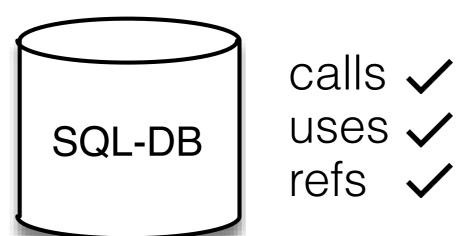
```
# SELECT * FROM calls WHERE callstart = 511073;
caller | callee | name | callstart | callend | callsitefile | callsiteline | thread

10530 | 10247 | startsWith | 511073 | 511091 | MetaIndex.java | 242 | main

# SELECT * FROM uses WHERE idx ≥ 511073 AND idx ≤ 511091;
caller | callee | name | method | kind | idx | thread

10247 | 10247 | var_1 | startsWith | varstore | 511074 | main
10247 | 10247 | var_1 | startsWith | varload | 511075 | main
... snip ...

10247 | 10247 | var_5 | startsWith | varload | 511088 | main
10247 | 10453 | _0 | startsWith | read | 511089 | main
```



```
# SELECT * FROM calls WHERE callstart = 511073;
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 ... snip ...
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# SELECT * FROM refs WHERE caller = 10247 AND kind = 'field';
caller | callee | kind | name | refstart | refend | thread
 10247 | 10248 | field | value | 421877 | | main
```

```
calls </br>
sQL-DB
uses 
refs
```

```
# SELECT * FROM calls WHERE callstart = 511073;
caller | callee | name | callstart | callend | callsitefile | callsiteline | thread
 10530 | 10247 | startsWith | 511073 | 511091 | MetaIndex.java | 242 | main
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 10247 | 10247 | var_1 | startsWith | varstore | 511074 | main
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caller | callee | kind | name | refstart | refend | thread
 10247 | 10248 | field | value | 421877 | | main
```

Spencer DSL

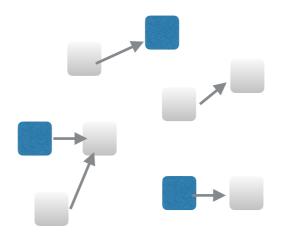
- Object selections as single expressions
- Compiled to SQL queries
- Simplicity > Expressivity

Spencer DSL

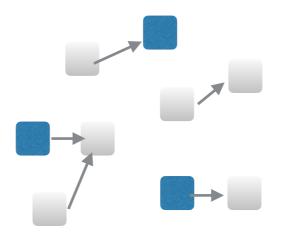
- Query combinators combine queries for more powerful analysis
- Query results are cached

MutableObj()

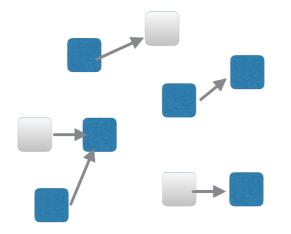
MutableObj()



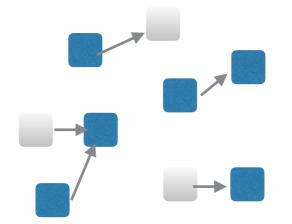
Not(MutableObj())



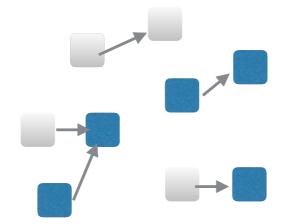
Not(MutableObj())



HeapDeeply(Not(MutableObj()))

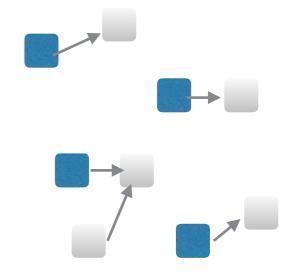


HeapDeeply(Not(MutableObj()))



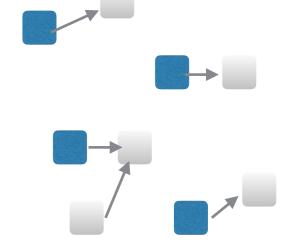
Spencer DSL — All Strings—

InstanceOf(java.lang.String)



Spencer DSL — All Data of Strings —

```
HeapReferredFrom(
  InstanceOf(java.lang.String)
)
```



Spencer DSL — All Data of Strings —

```
HeapReferredFrom(
  InstanceOf(java.lang.String)
)
```

Spencer DSL — All Shared Data of Strings —

```
And(
  HeapReferredFrom(
   InstanceOf(java.lang.String)
)
```

Spencer DSL — All Shared Data of Strings —

```
And(
  HeapReferredFrom(
   InstanceOf(java.lang.String)
  )
  Not(HeapUniqueObj())
)
```

Spencer DSL — All Shared Data of Strings —

```
And(
  HeapReferredFrom(
    InstanceOf(java.lang.String)
  )
  Not(HeapUniqueObj())
)
```

Spencer DSL

— All Objects Sharing Data With Strings —

```
HeapRefersTo(
 And (
  HeapReferredFrom(
   InstanceOf(java.lang.String)
  Not(HeapUniqueObj())
```

Spencer DSL

— All Objects Sharing Data With Strings —

```
HeapRefersTo(
 And (
  HeapReferredFrom(
   InstanceOf(java.lang.String)
  Not(HeapUniqueObj())
```

Spencer DSL: Primitive Queries

Query	Meaning
MutableObj()	Objects that are mutated after being constructed.
InstanceOf(java.foo.Bar)	Instances of a given class.
StationaryObj()	Objects that are never written after being read for the first time — "lazily initialised immutability".
HeapUniqueObj()	Objects that have one, not more aliases from fields of other objects.
TinyObj()	Objects that have no field references to other objects.
•••	

Spencer DSL: Query Combinators — Walking the Reference Graph —

Query	Meaning
RefersTo(Q)	Objects that have references to objects selected by $\it Q$.
CanReach(Q)	
ReferredFrom(Q)	
ReachableFrom(Q)	
Deeply(Q)	

Spencer DSL: Query Combinators — Walking the Reference Graph —

Query Meaning Objects that have references to objects selected by Q. RefersTo(Q) CanReach(Q) ReferredFrom(Q) ReachableFrom(Q) Deeply(Q)

Spencer DSL: Query Combinators — Walking the Reference Graph —

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Spencer DSL: Query Combinators — Walking the Reference Graph —

Query	Meaning
RefersTo(Q)	Objects that have references to objects selected by $\it Q$.
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ReachableFrom(Q)	
Deeply(Q)	

Query Meaning RefersTo(Q) Objects that have references to objects selected by Q. CanReach(Q) Objs that have **transitive** references to objs selected by Q. ReferredFrom(Q) ReachableFrom(Q) Deeply(Q)

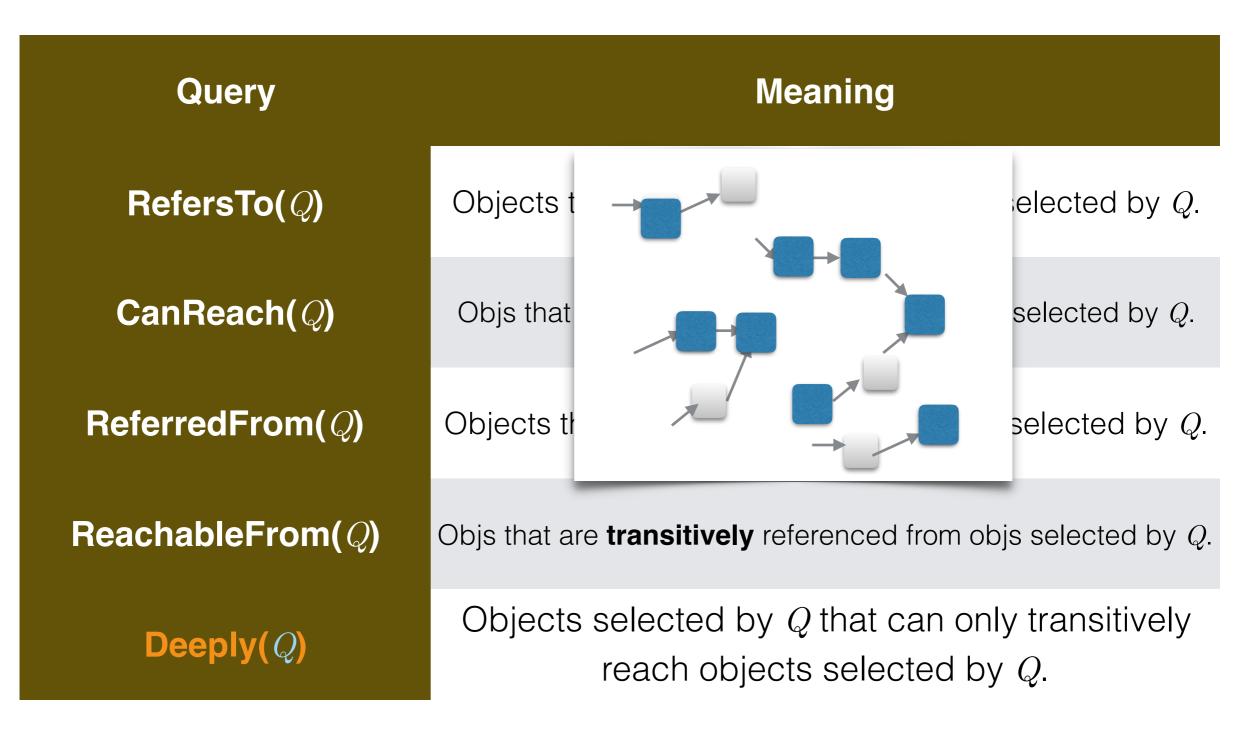
Query Meaning RefersTo(Q) Objects that have references to objects selected by Q. CanReach(Q) Objs that have **transitive** references to objs selected by Q. ReferredFrom(Q) ReachableFrom(Q) Deeply(Q)

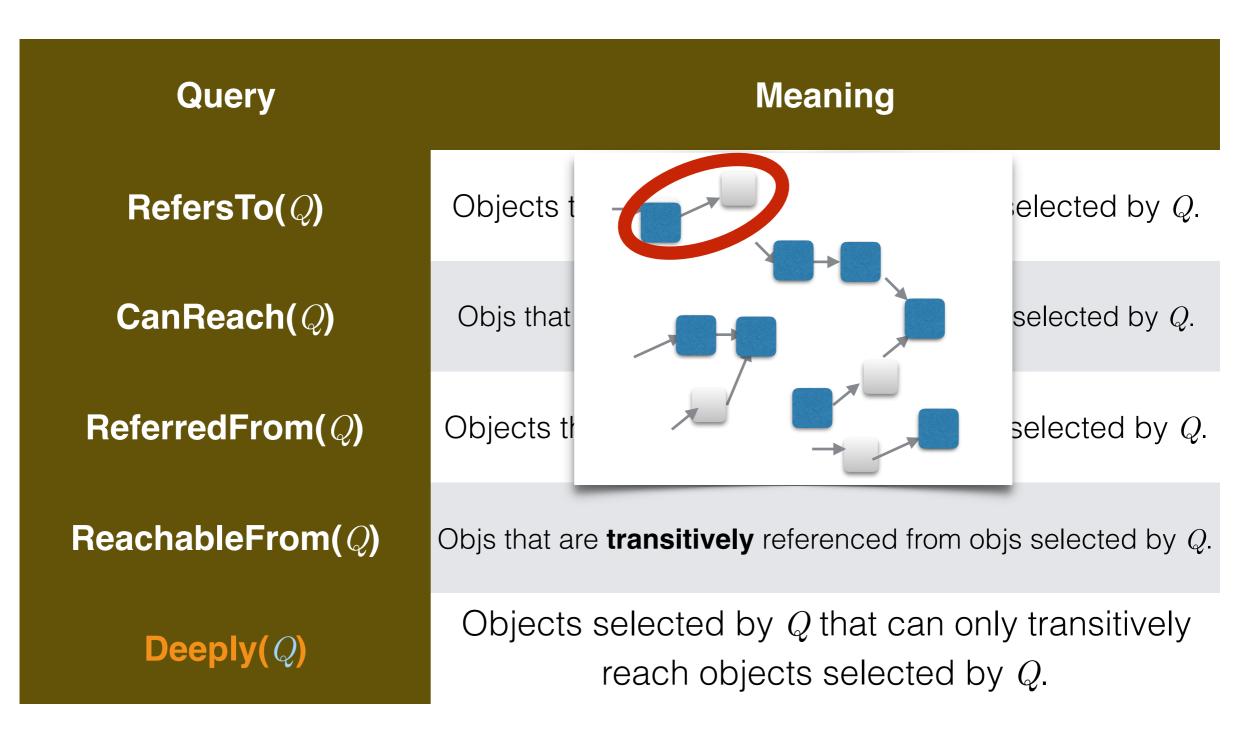
Query Meaning RefersTo(Q) Objects that have references to objects selected by Q. CanReach(Q) Objs that have **transitive** references to objs selected by Q. ReferredFrom(Q) ReachableFrom(Q) Deeply(Q)

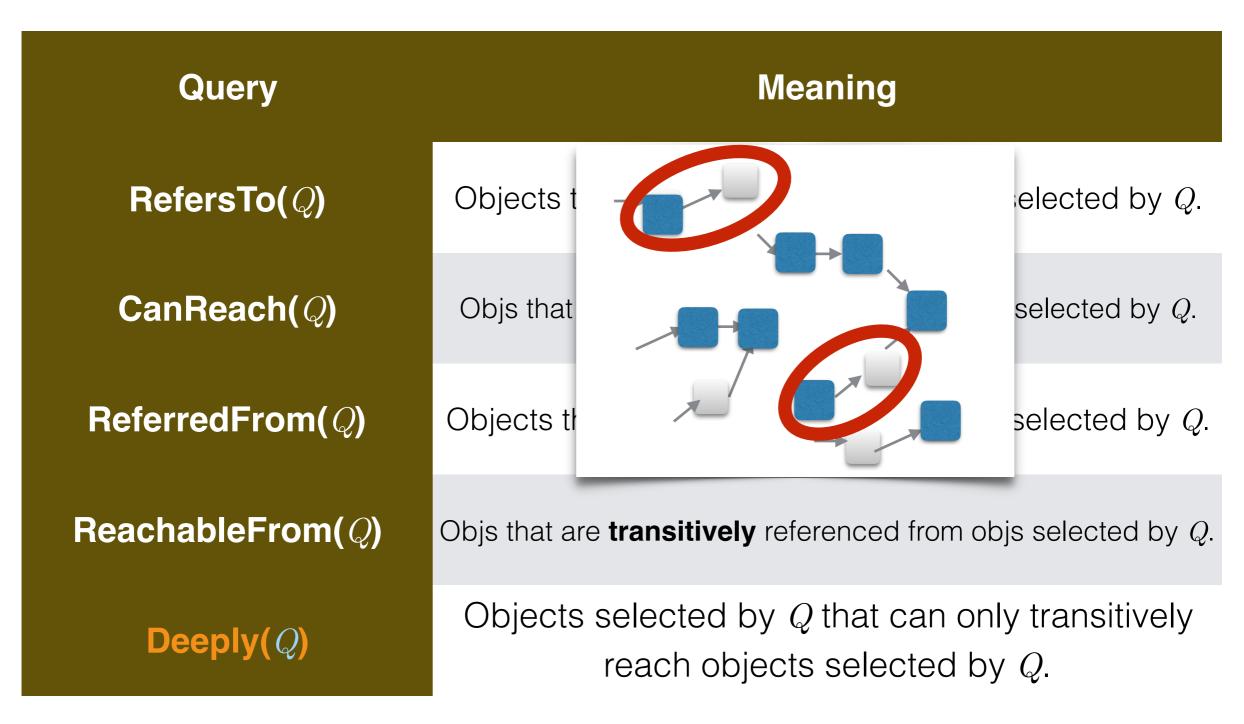
Query	Meaning				
RefersTo(Q)	Objects that have references to objects selected by $\it Q$.				
CanReach(Q)	Objs that have transitive references to objs selected by $\it Q$.				
ReferredFrom(Q)	Objects that are referenced from objects selected by \it{Q} .				
ReachableFrom(Q)					
$Deeply(\mathit{Q})$					

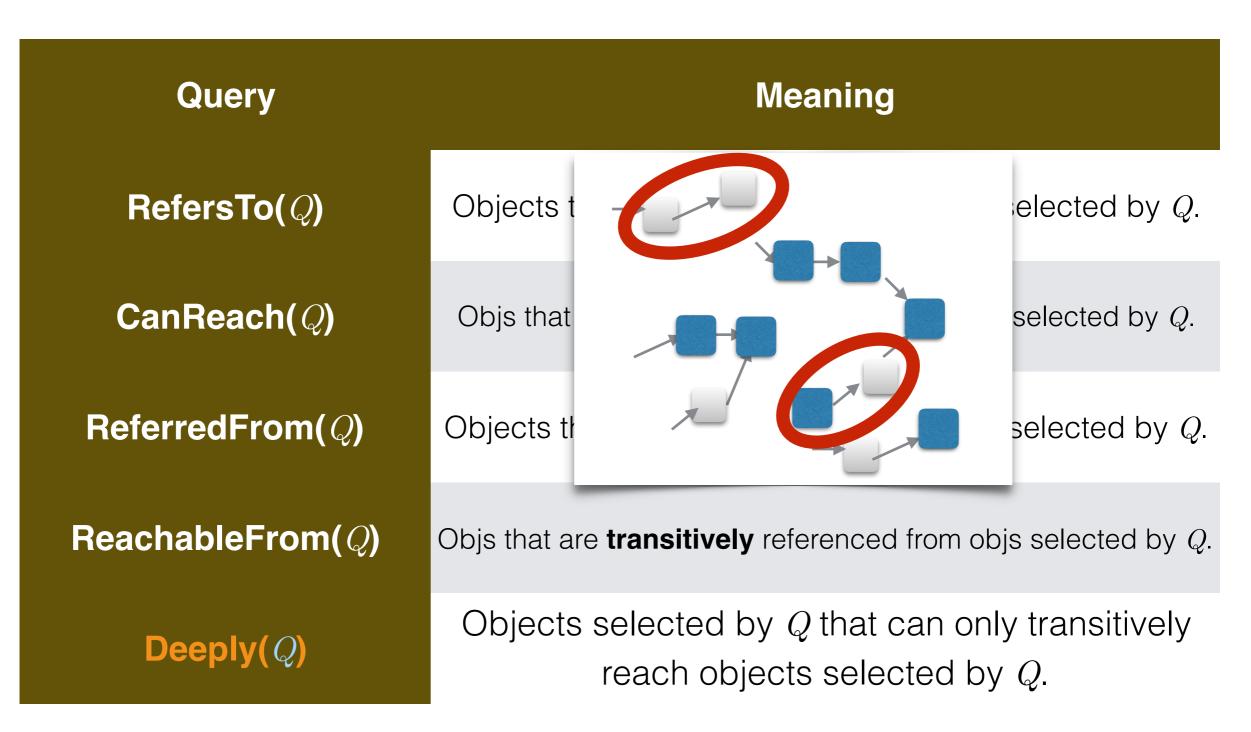
Query	Meaning				
$RefersTo(\mathit{Q})$	Objects that have references to objects selected by \it{Q} .				
CanReach(Q)	Objs that have transitive references to objs selected by $\it Q$.				
${\bf ReferredFrom}({\it Q})$	Objects that are referenced from objects selected by \it{Q} .				
ReachableFrom(Q)	Objs that are transitively referenced from objs selected by Q .				
$Deeply(\mathit{Q})$					

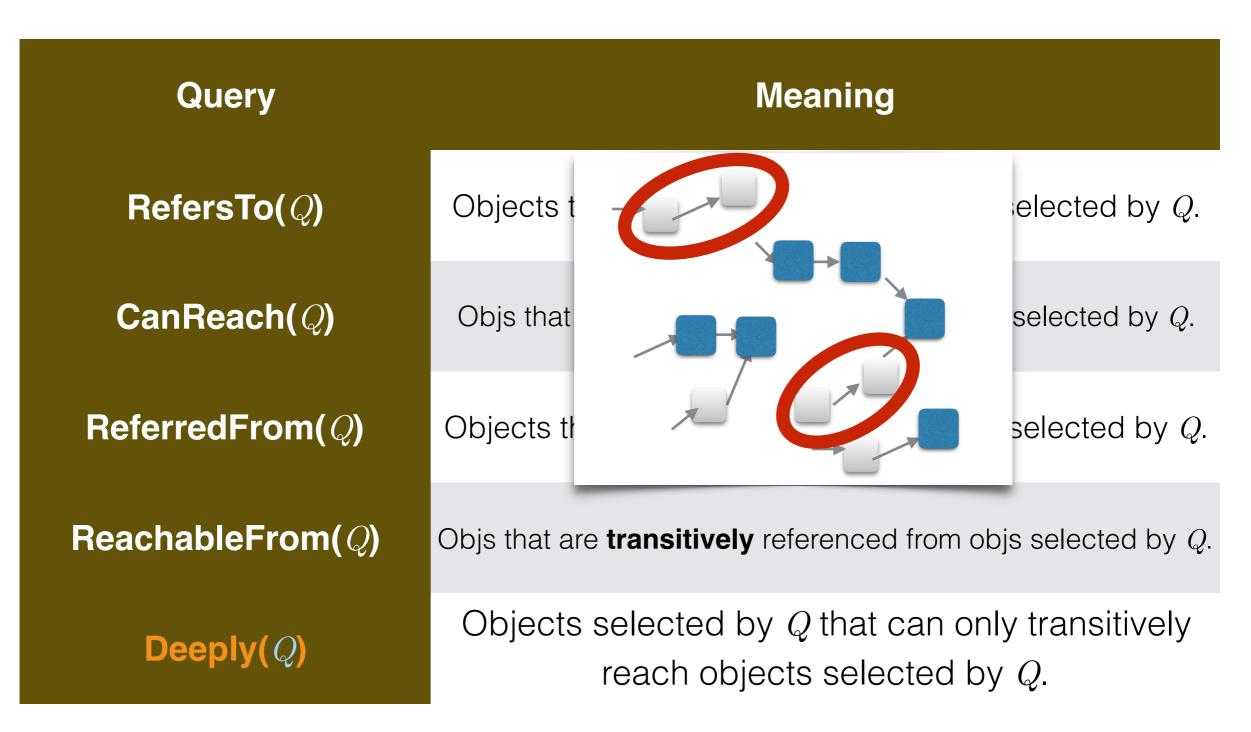
Query	Meaning				
RefersTo(Q)	Objects that have references to objects selected by $\it Q$.				
CanReach(Q) Objs that have transitive reference	Objs that have transitive references to objs selected by $\it Q$.				
ReferredFrom(Q)	Objects that are referenced from objects selected by \it{Q} .				
ReachableFrom(Q)	Objs that are transitively referenced from objs selected by \it{Q} .				
Deeply(Q)	Objects selected by ${\cal Q}$ that can only transitively reach objects selected by ${\cal Q}$.				

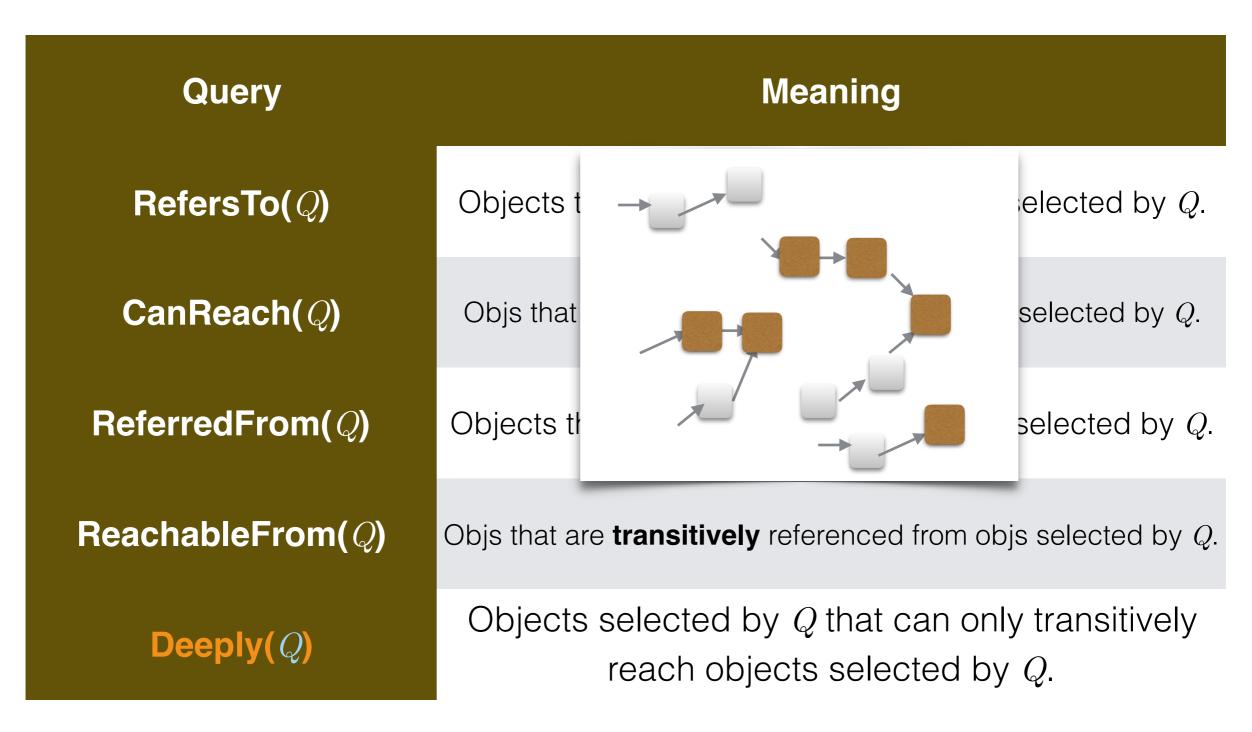




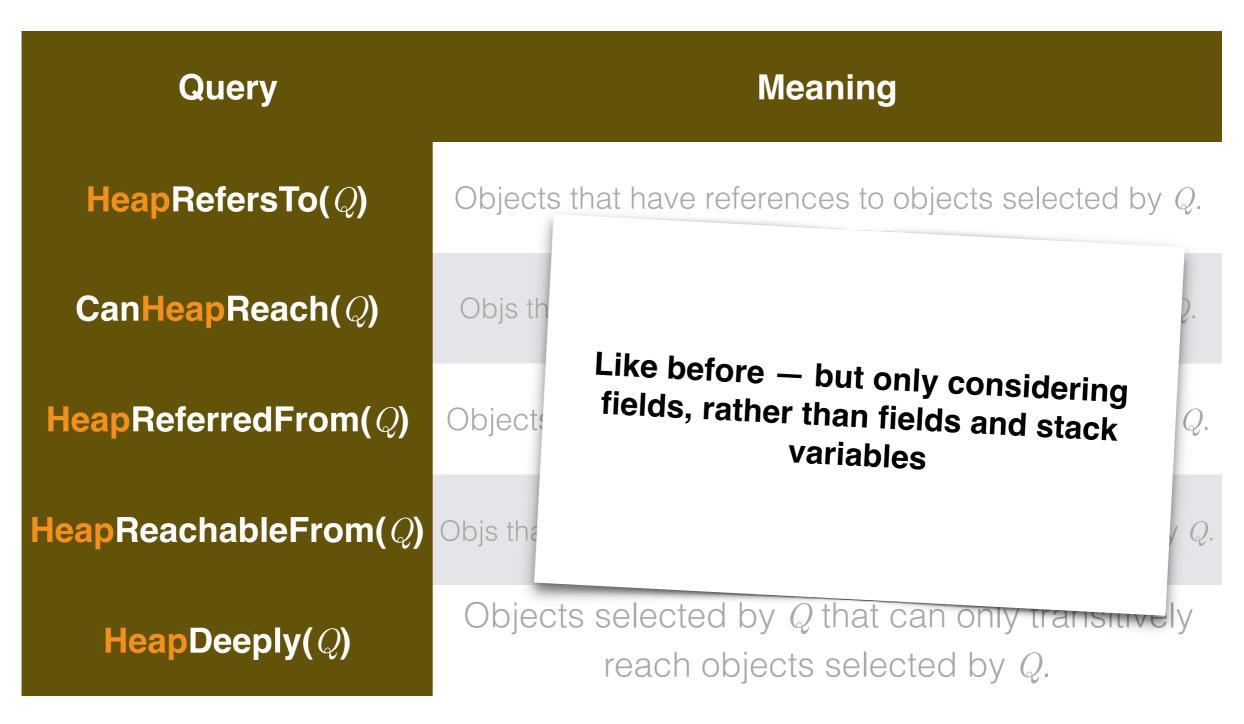




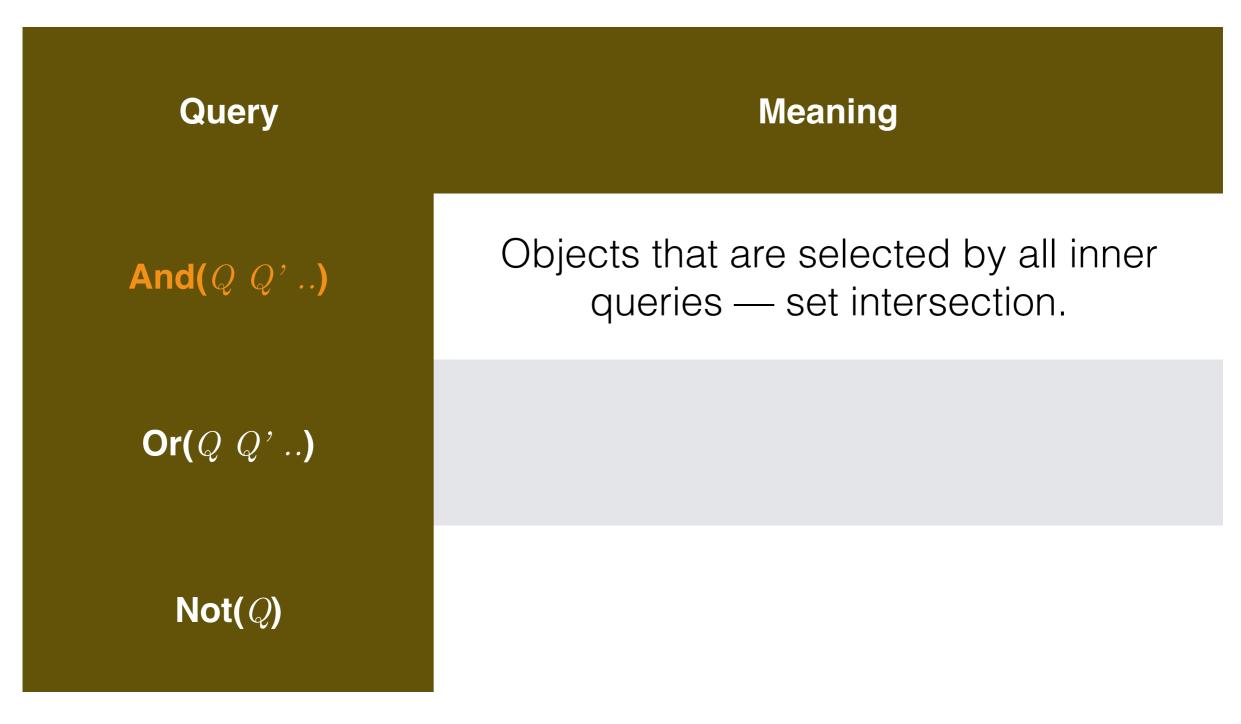




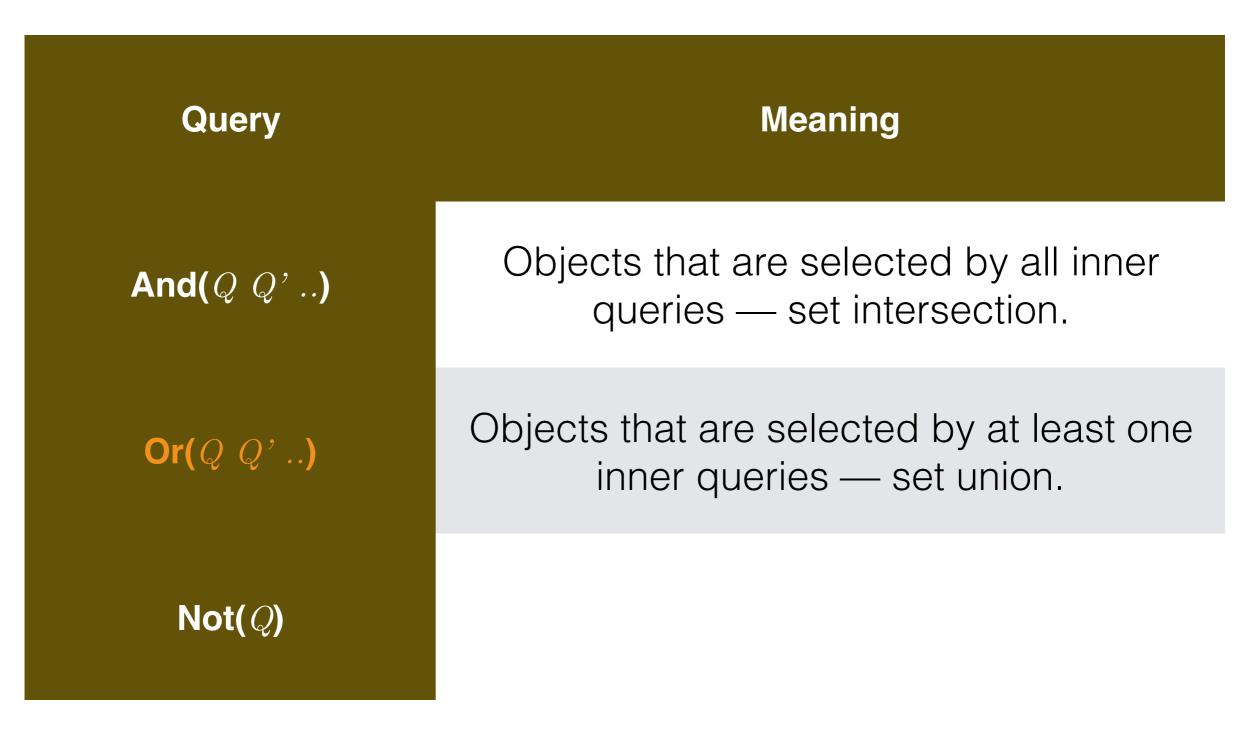
Spencer DSL: Query Combinators — Walking the Heap —



Spencer DSL: Query Combinators — Logical Connectives —



Spencer DSL: Query Combinators — Logical Connectives —



Spencer DSL: Query Combinators — Logical Connectives —

Query	Meaning				
And(Q Q')	Objects that are selected by all inner queries — set intersection.				
Or(Q Q')	Objects that are selected by at least one inner queries — set union.				
Not(<i>Q</i>)	Objects that are not selected by the inner query.				

Spencer: Tracing as a Service

Spencer hosts trace data for you to analyse.

We built a DSL for object queries that lets you explore a data set iteratively.

http://spencer-t.racing

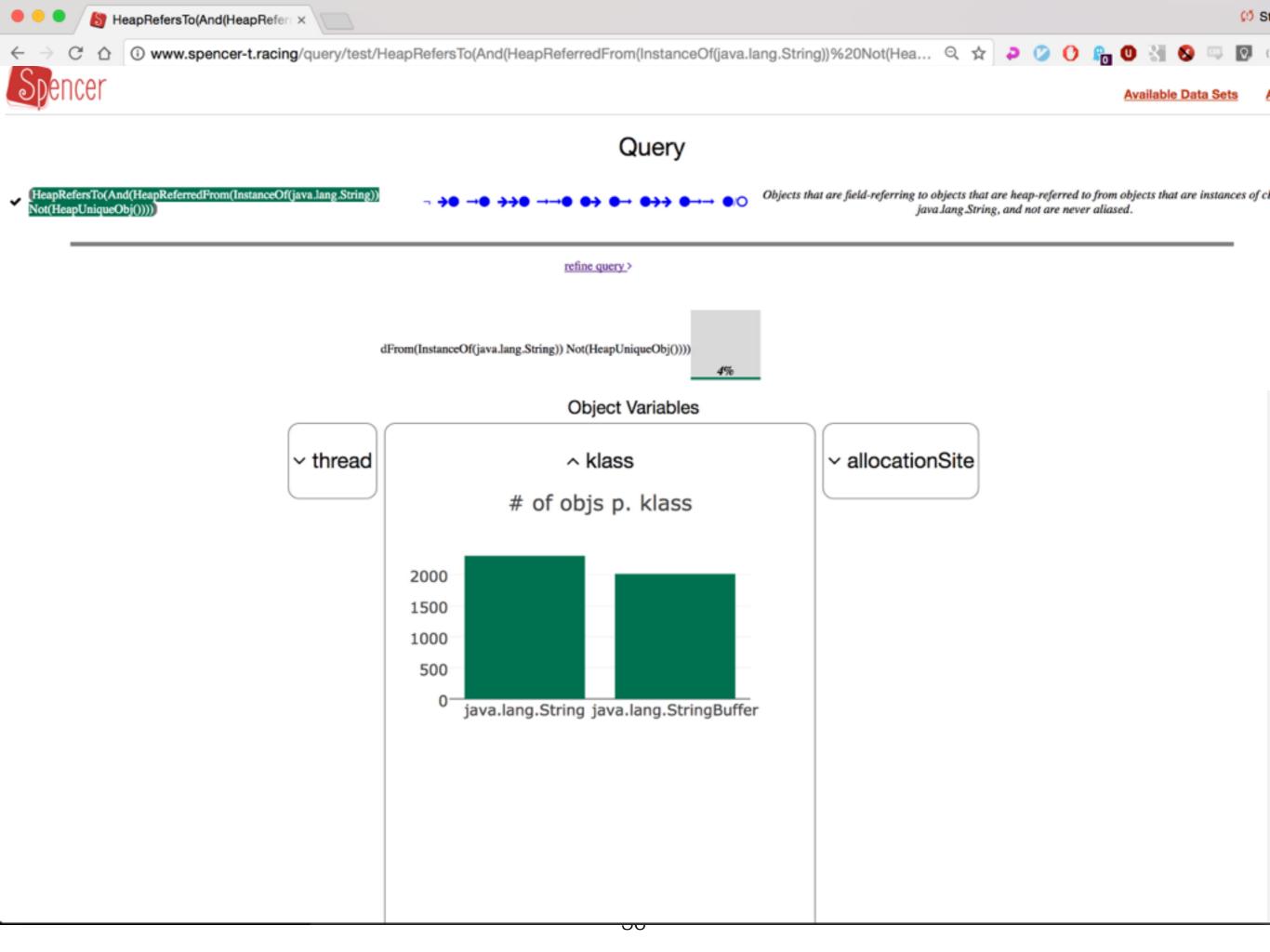
- "Mining for Safety using Interactive Trace Analysis", Workshop on Quantitative Aspects of Programming Languages and Systems (QAPL) 2017
- "Spencer: Interactive Heap Analysis for the Masses", 14th International Conference on Mining Software Repositories (MSR) 2017

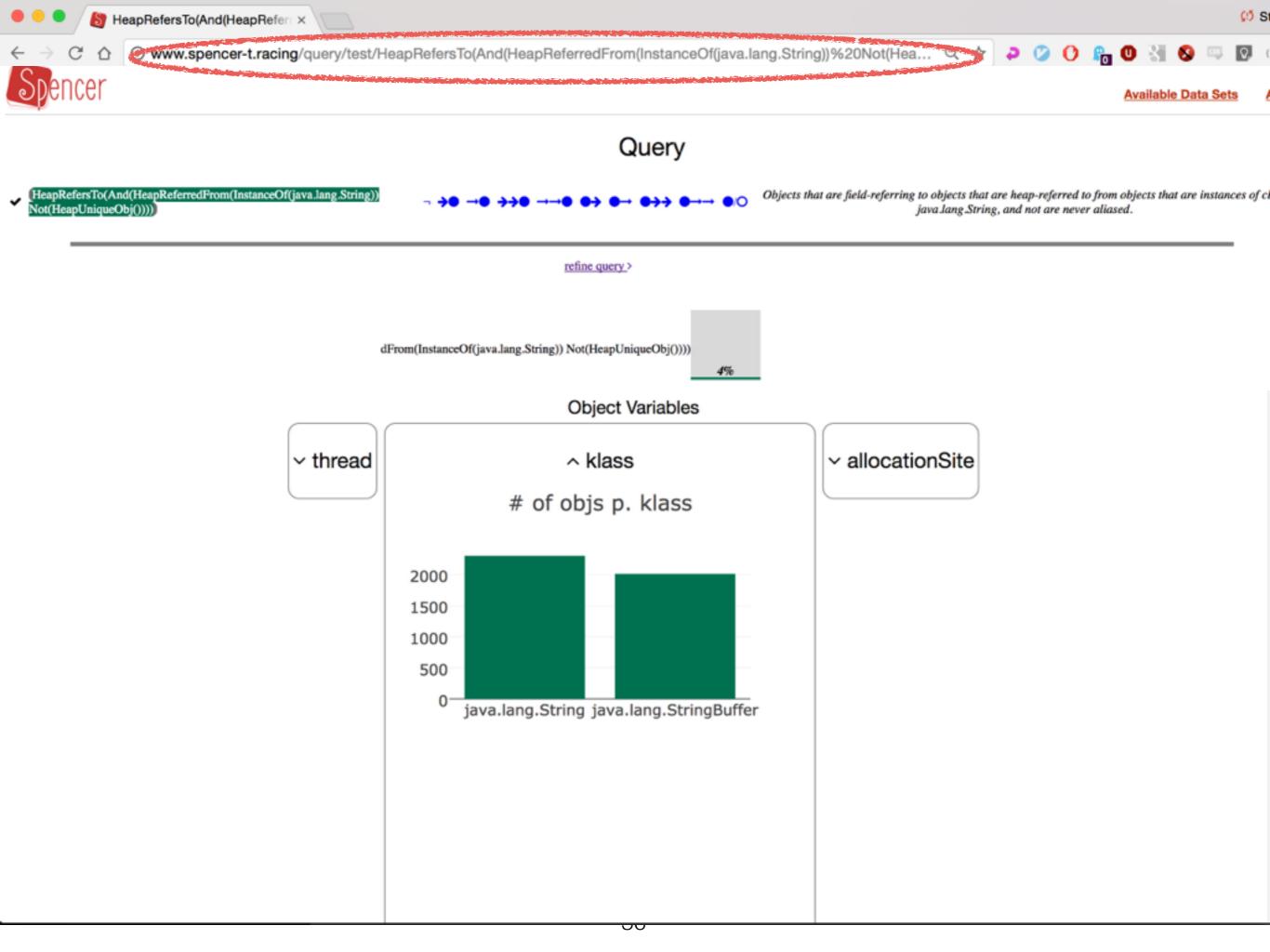
Stephan Brandauer, Tobias Wrigstad http://stbr.me/spencer
sbrandauer

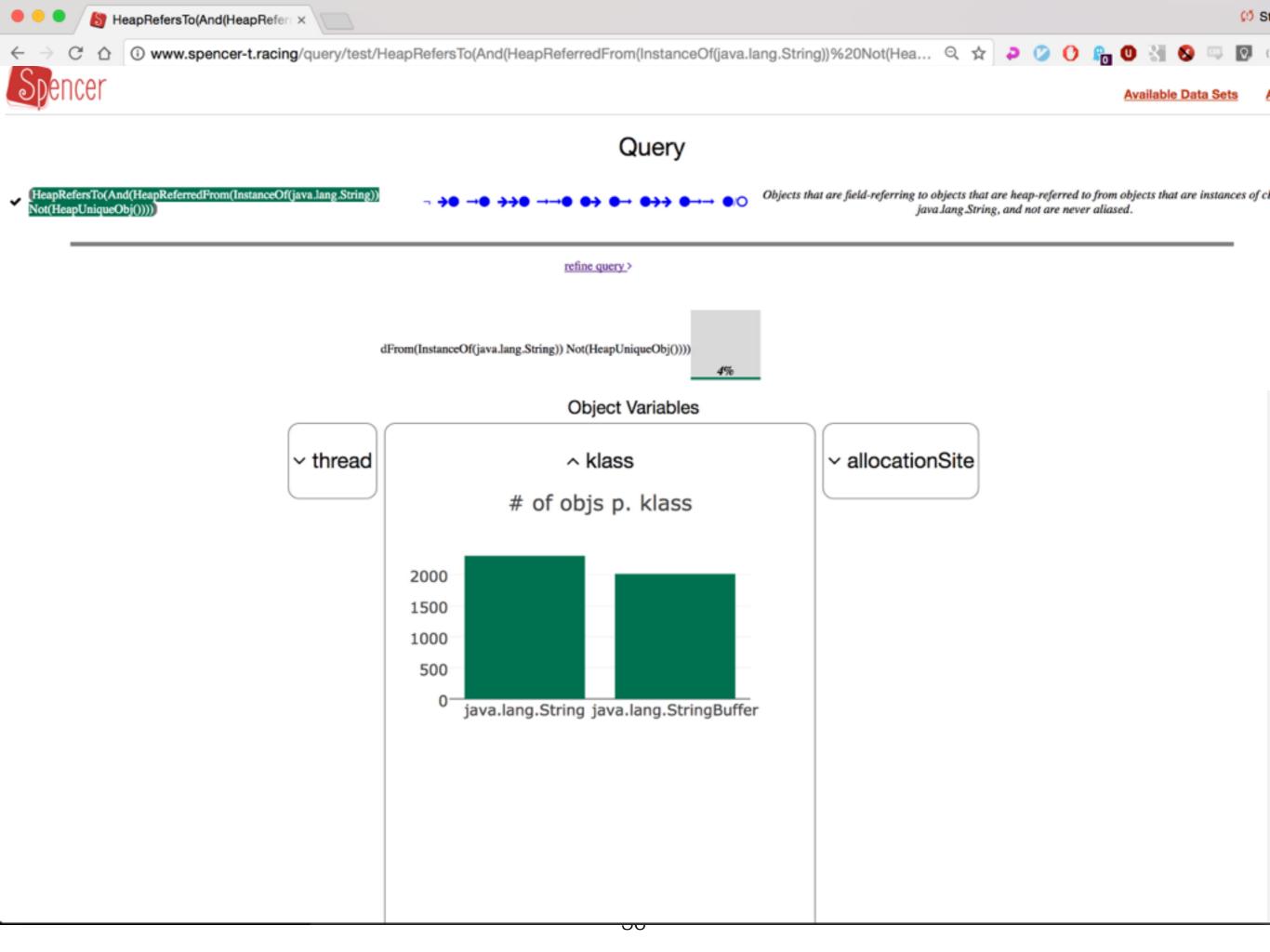
Demo

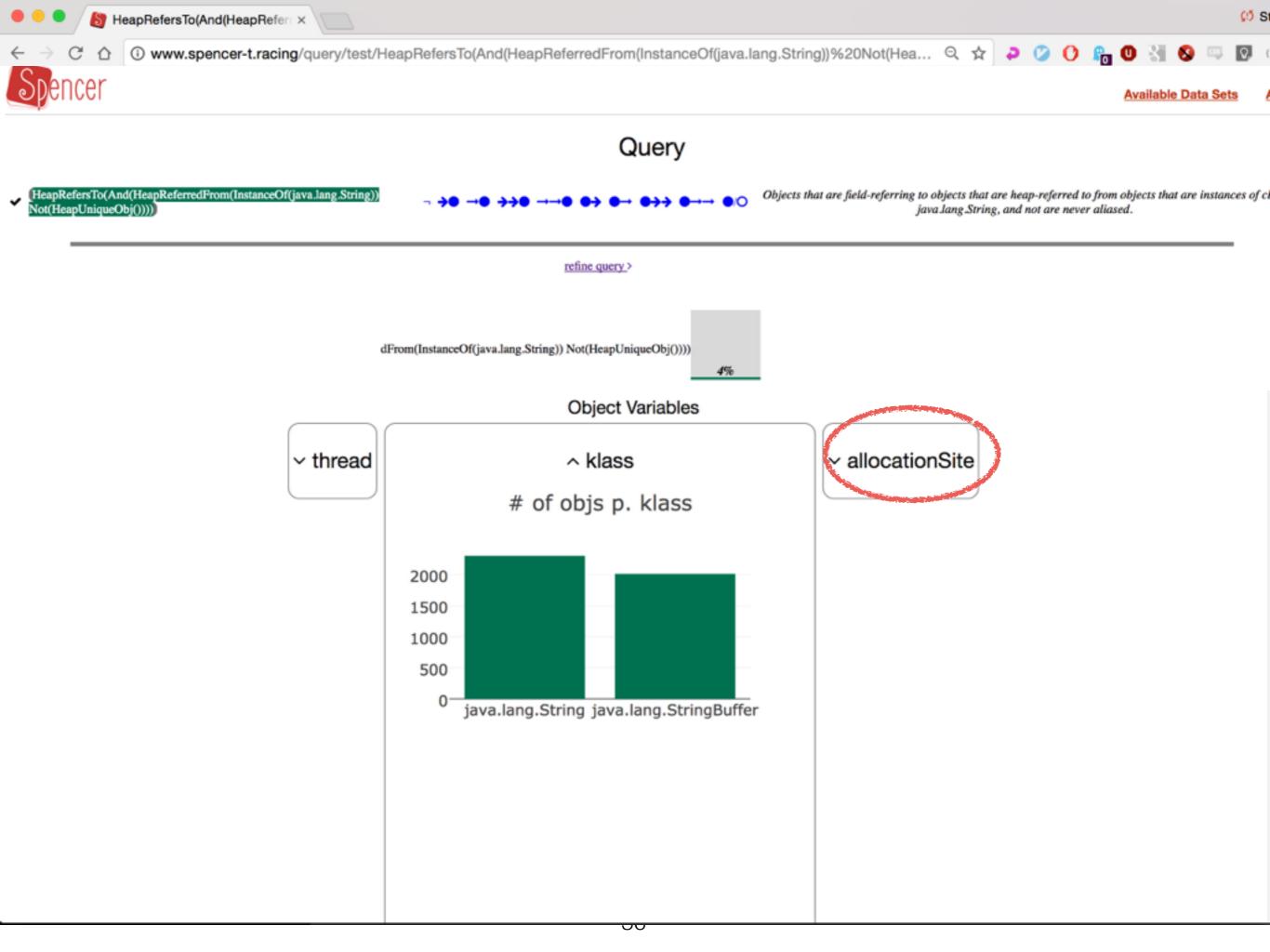
http://spencer.it.uu.se/query/test/InstanceOf(java.lang.String)

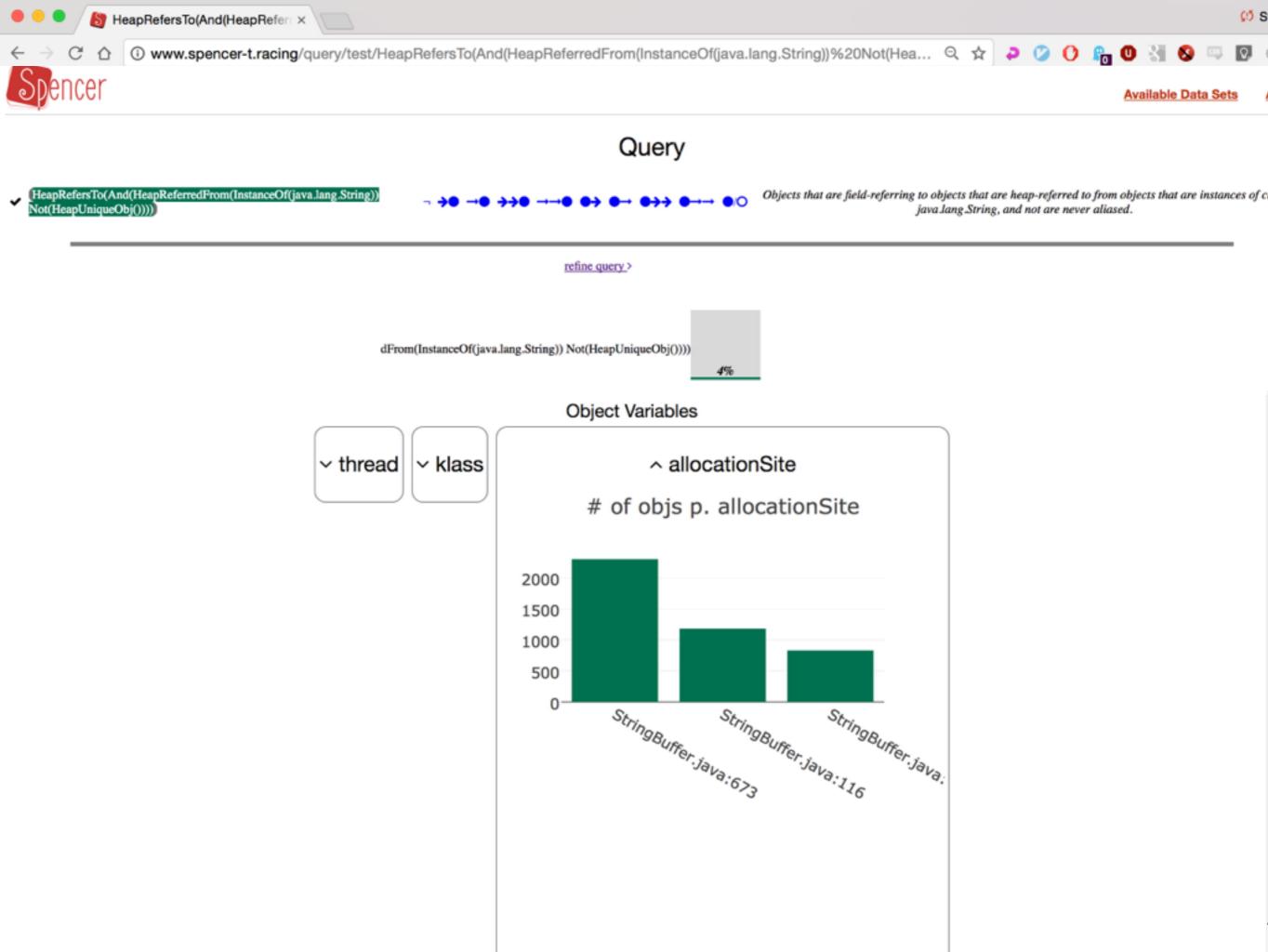
Demo Failure Slides





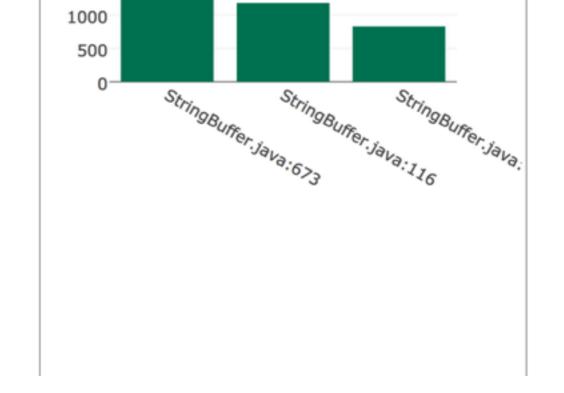






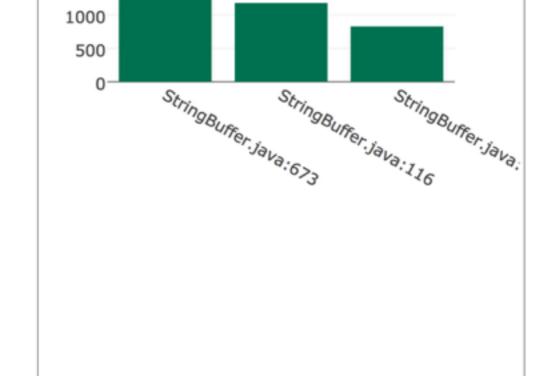
Percentage of objects referred to from a field that was selected by the query.

Field Name	Selected [%]
net.sourceforge.pmd.rules.basic.BooleanInstantiation::description	100
net.sourceforge.pmd.rules.basic.BrokenNullCheck::properties	100
net.sourceforge.pmd.rules.basic.BrokenNullCheck::examples	100
net.sourceforge.pmd.rules.basic.BrokenNullCheck::description	100
net.sourceforge.pmd.rules.basic.BooleanInstantiation::properties	100
net.sourceforge.pmd.rules.basic.BooleanInstantiation::ruleChainVisits	100
sun.util.locale.provider.LocaleServiceProviderPool::providers	100
java.io.BufferedWriter::cb	100
sun.util.locale.provider.LocaleResources::cache	100
sun.util.locale.provider.JRELocaleProviderAdapter::numberFormatProvider	100
sun.util.locale.provider.JRELocaleProviderAdapter::localeResourcesMap	100
	400



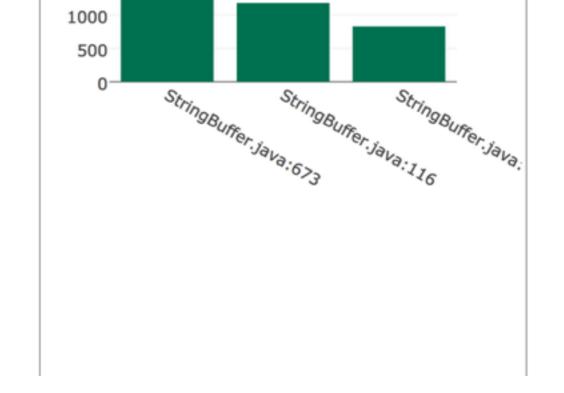
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net.sourceforge.pmd.rules.basic.BooleanInstantiation::properties	100
net.sourceforge.pmd.rules.basic.BooleanInstantiation::ruleChainVisits	100
sun.util.locale.provider.LocaleServiceProviderPool::providers	100
java.io.BufferedWriter::cb	100
sun.util.locale.provider.LocaleResources::cache	100
sun.util.locale.provider.JRELocaleProviderAdapter::numberFormatProvider	100
sun.util.locale.provider.JRELocaleProviderAdapter::localeResourcesMap	100
	100



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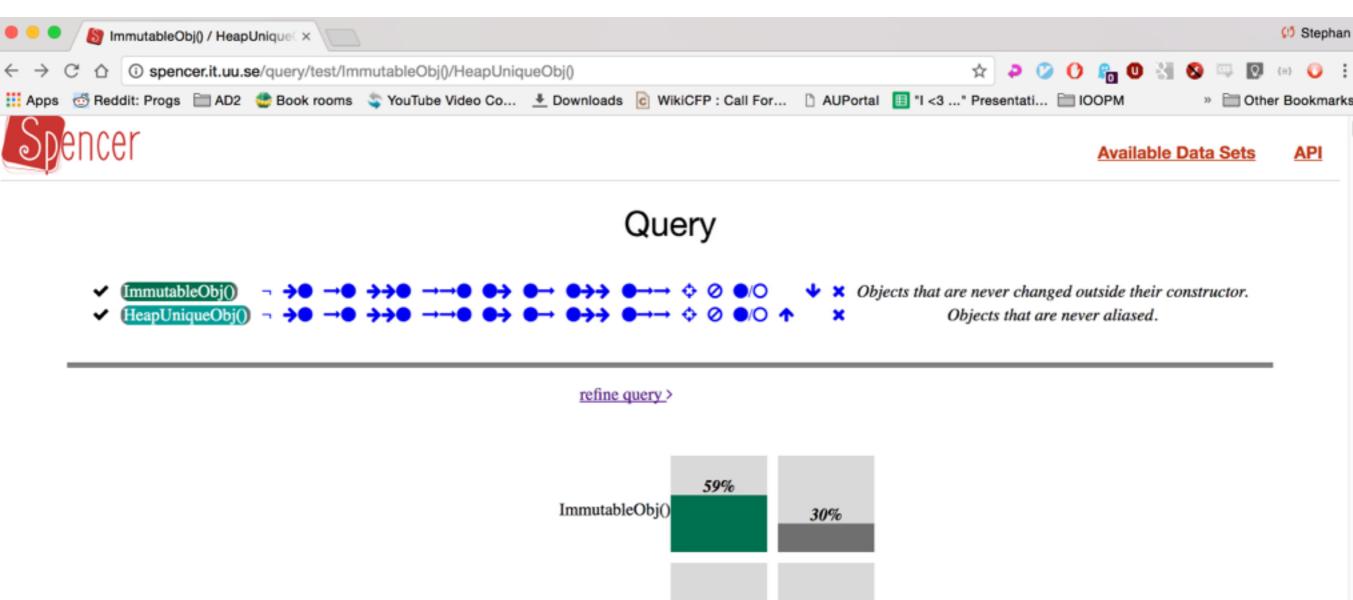
		199
Field Name	Sele	cted [%]
net.sourceforge.pmd.rules.basic.BooleanInstantiation::description	100	
net.sourceforge.pmd.rules.basic.BrokenNullCheck::properties	100	
net.sourceforge.pmd.rules.basic.BrokenNullCheck::examples	100	
net.sourceforge.pmd.rules.basic.BrokenNullCheck::description	100	
net.sourceforge.pmd.rules.basic.BooleanInstantiation::properties	100	
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sun.util.locale.provider.LocaleServiceProviderPool::providers	100	
java.io.BufferedWriter::cb	100	
sun.util.locale.provider.LocaleResources::cache	100	
sun.util.locale.provider.JRELocaleProviderAdapter::numberFormatProvider	100	
sun.util.locale.provider.JRELocaleProviderAdapter::localeResourcesMap	100	
		3



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sun.util.locale.provider.JRELocaleProviderAdapter::numberFormatProvider	100
sun.util.locale.provider.JRELocaleProviderAdapter::localeResourcesMap	100
	100

ImmutableObj() / HeapUniqueObj()



HeapUniqueObj()

ImmutableObj() HeapUniqueObj()

30%

42%

```
$ curl http://spencer-t.racing/json/select/test/HeapRefersTo(...
 .. And (HeapReferredFrom(InstanceOf(java.lang.String))..
 ..%20Not(HeapUniqueObj())))
```

```
$ curl http://spencer-t.racing/json/select/test/HeapRefersTo(...
 .. And (HeapReferredFrom(InstanceOf(java.lang.String))..
 ..%20Not(HeapUniqueObj())))
 "query":"...",
 "objects":
   [42171,42174,42259, ...]
```

\$ curl http://spencer-t.racing/json/select/test/HeanRefersTe/ .. And (HeapReferredFrom(Inc.

meta = meta_info('ImmutableObj()') In [35]: meta.sample(10)

selected 484576 bytes

Out[35]:

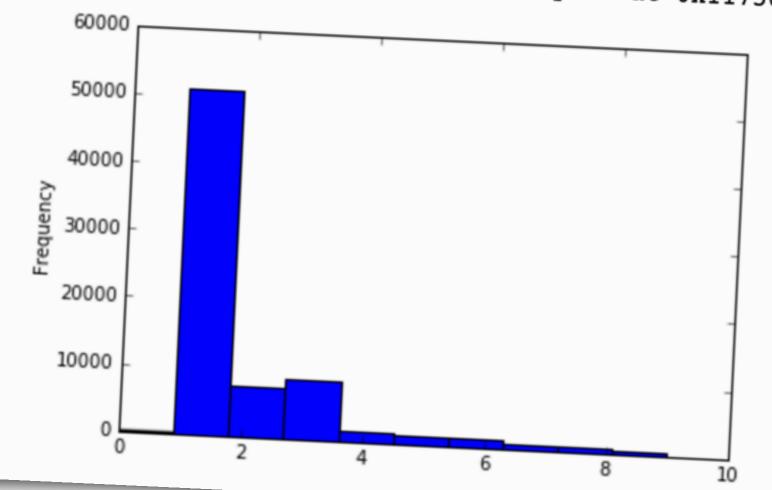
se	meta: got 10167219 bytes lastusage numCalls numFieldReads numFieldRea							numFieldWrite	
meta: got 10167219 bytes				id I	klass	lastusage	numCalls	numricianozza	0
Γ		allocationSite	firstusage	iu j		3910847	1	0	0
1	\longrightarrow		3910628	38553	[C		1	0	0
Į.			0	11435	[C	0	<u>'</u>		0
:	2501	StringBuilder.java:89	0	87599	[B	0	1	0	0
t	48147	ZipCoder.java:89	0			7320298	1	0	0
1			7320085	62982	[C		1	0	0
	31971		0	61918	[B	0	-	0	0
	31436	ZipCoder.java:89		-	ıc	12765509	1	0	0
	56210	String.java:2032	12765482	-		0	1	0	
	\vdash		0	64394	[C	-	1	0	0
	33053		1 0	112662	[C	0	+	0	0
	6088		1 -	92728	[B	0	1		1
	5118	g ZipCoder.java:89	0		- Obvie	ng 1225771	8 12	14	
		String.java:1933	1225731	94185	java.iarig.strii	.5			
	5214	String.java.							

\$ curl http://spencer-t.racing/json/select/test/HeanReforeTo/-

Number of Calls

To show a histogram of the calls, we can do this:

```
In [17]: meta['numCalls'].where(meta['numCalls'] < 10).plot(kind = 'hist', bins=10)
Out[17]: <matplotlib.axes._subplots.AxesSubplot at 0x11750bed0>
```



Number of Allocations per Allocation Site (Top 20)

```
meta['allocationSite'].value_counts()[:20].plot(kind='bar')
In [18]:
                          <matplotlib.axes._subplots.AxesSubplot at 0x11731ea50>
Out[18]:
                              16000
                              14000
                               12000
                               10000
                                 8000
                                  6000
                                  4000
                                   2000
                                                                                                                                                           StringBuffer.java:128
                                                                                                                                                     ZipCoder.java:59
                                                                                                                                               HashMap.java:1742
                                                                                                                                          Resource.java:117
                                                                                                                              String.java:2032
                                                                                                                                    StringBuffer.java:116
                                                                                                                   String.java:1933
                                                                                                                        String.java:2087
                                                                                                  StringBuilder.java:89
                                                                                                       StringBuffer.java:673
                                                                                                             ZipFile.java:393
                                                                                String.java:1969
                                                                                      StringCoding.java:79
                                                                                           StringBuffer.java:671
                                                                     ZipCoder.java:78
                                                               ZipCoder.java:89
                                                                          StringBuilder.java:407
                                                    <absent information>:-1
                                                         AbstractStringBuilder.java:137
                                              String.java:207
```

bins=10)

Backup Slides

Dynamic Analysis

Static Analysis

false positives ("upper bound")

false negatives ("lower bound")

often-used code weighed stronger

all code weighed equally

easily deals with runtime code generation, dynamic code loading

easily can produce sound claims

"Safety"

unique

stack bound

heap-unique

deeply
immutable
shallow
immutable
safe

at most one variable/field refers to object at a time

no field ever refers to the object

at most one field refers to object at a time

shallow immutable + can only reach (via fields) other shallow immutable objects

object never changed outside of constructor

at least one of the above

Dynamic Analysis

Static Analysis



"What proportion of objects are safe?"

Dynamic Analysis

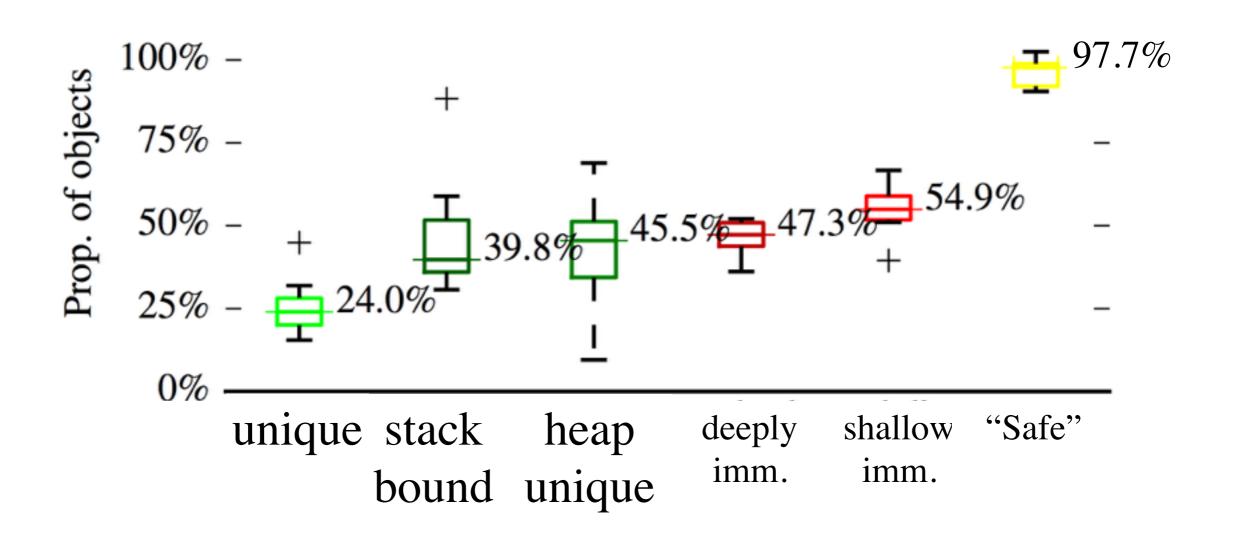
Static Analysis



"What proportion of classes only produce safe instances?"

"What proportion of fields only contain safe instances?"

Per Object Analysis



Out of all classes with more than 10 instances, how many classes...

Out of all classes with more than 10 instances, how many classes...

1) ... have ONLY instances that fulfil a safety property?

Out of all classes with more than 10 instances, how many classes...

1) ... have ONLY instances that fulfil a safety property?

2) ... have NO instances that fulfil a safety property?

Spencer DSL — Compiling to SQL—

SELECT id FROM objects WHERE klass = 'java.lang.String'



InstanceOf(java.lang.String)

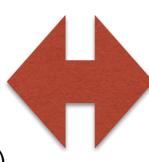
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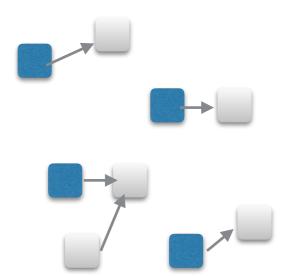


InstanceOf(java.lang.String)

HeapReferredFrom(InstanceOf(java.lang.String))



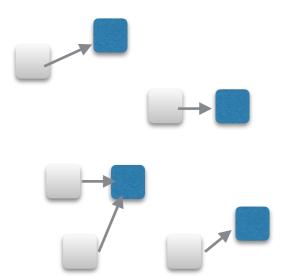
```
SELECT callee AS id
FROM refs
WHERE kind = 'field'
AND caller IN (
   SELECT id FROM objects WHERE klass = 'java.lang.String'
)
```



HeapReferredFrom(InstanceOf(java.lang.String))



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SELECT callee AS id
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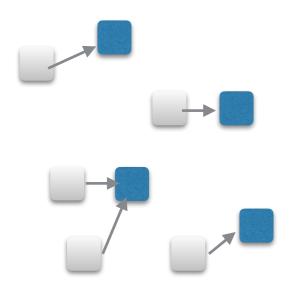


```
And(
HeapReferredFrom(
InstanceOf(java.lang.String))
?)
```



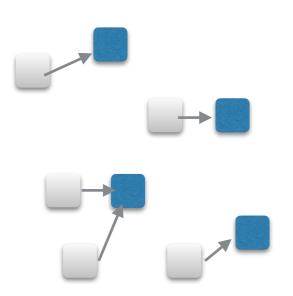
```
SELECT callee AS id
FROM refs
WHERE kind = 'field'
AND caller IN (
SELECT id FROM objects WHERE klass = 'java.lang.String'
)
) INTERSECT (
```

?



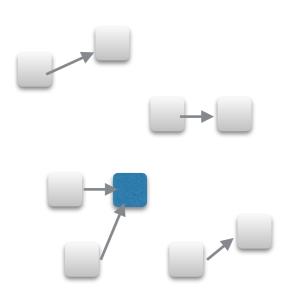
)

And(
HeapReferredFrom(
InstanceOf(java.lang.String))
Not(HeapUniqueObj()))



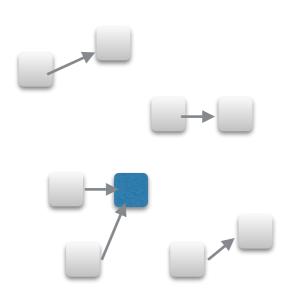
```
SELECT callee AS id
  FROM refs
 WHERE kind = 'field'
        caller IN (
   SELECT id FROM objects WHERE klass = 'java.lang.String'
) INTERSECT (
  SELECT id FROM objects WHERE id > 4
  EXCEPT
   (SELECT callee AS id FROM
    (SELECT callee, time, SUM(delta) OVER(PARTITION BY callee ORDER BY time) AS sum_at_time
     FROM (
        (SELECT
           callee, refstart AS time, 1 AS delta
        FROM refs
        WHERE callee > 4 AND kind = 'field') UNION ALL (SELECT
           callee, refend AS time, -1 AS delta
        FROM refs
        WHERE callee > 4 AND kind = 'field')
     ) AS steps) AS integrated_steps
    GROUP BY callee
    HAVING MAX(sum_at_time) = 1)
```

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HeapReferredFrom(
InstanceOf(java.lang.String))
Not(HeapUniqueObj()))



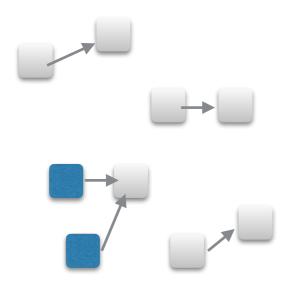
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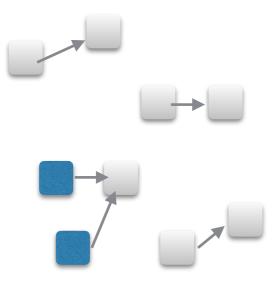
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```

and caching of subexpressions

heap unique

xy%

Classes with NO heap-unique instances

Classes with ONLY heap-unique instances

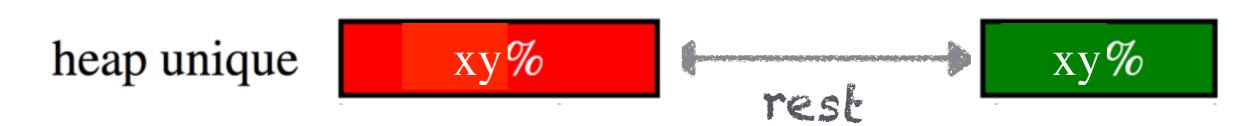
heap unique

xy%

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Classes with NO heap-unique instances

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Classes with NO heap-unique instances

heap unique





heap unique

xy%

xy%

Hypothesis: could annotate class with "heap-shared" keyword

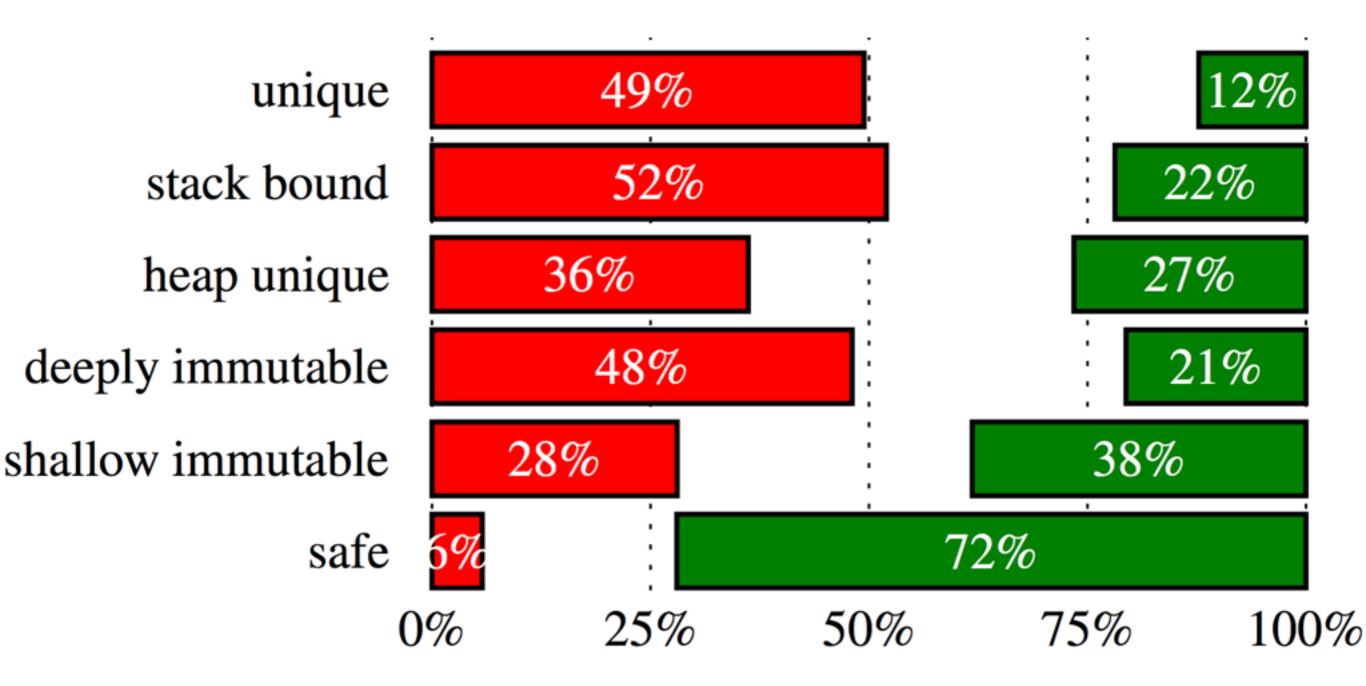
Hypothesis: could annotate class with "heap-unique" keyword

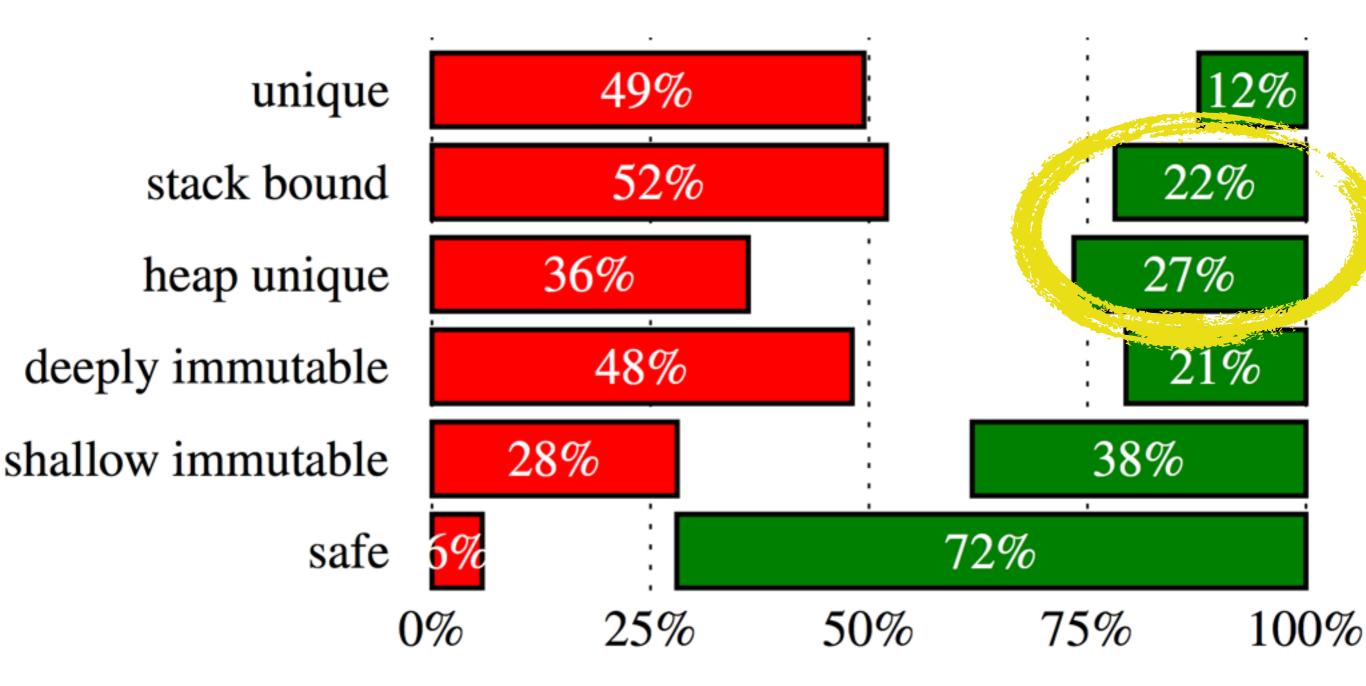
heap unique

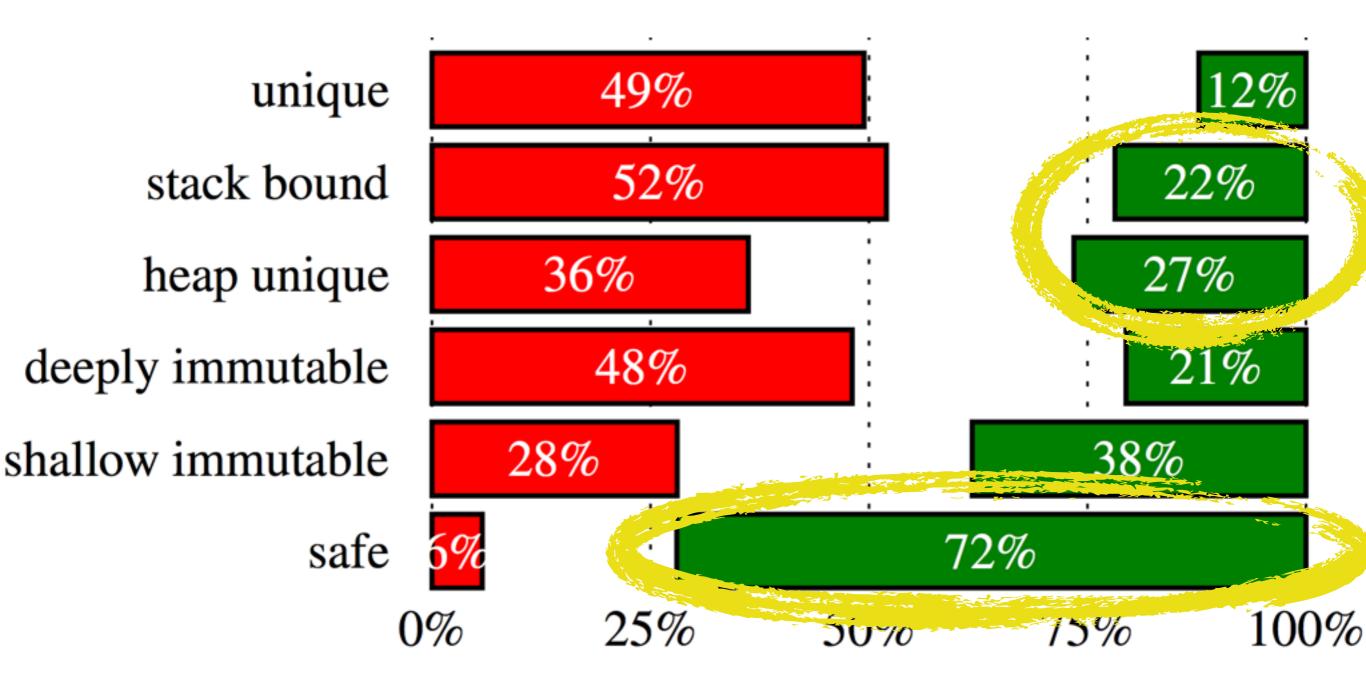
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xy%

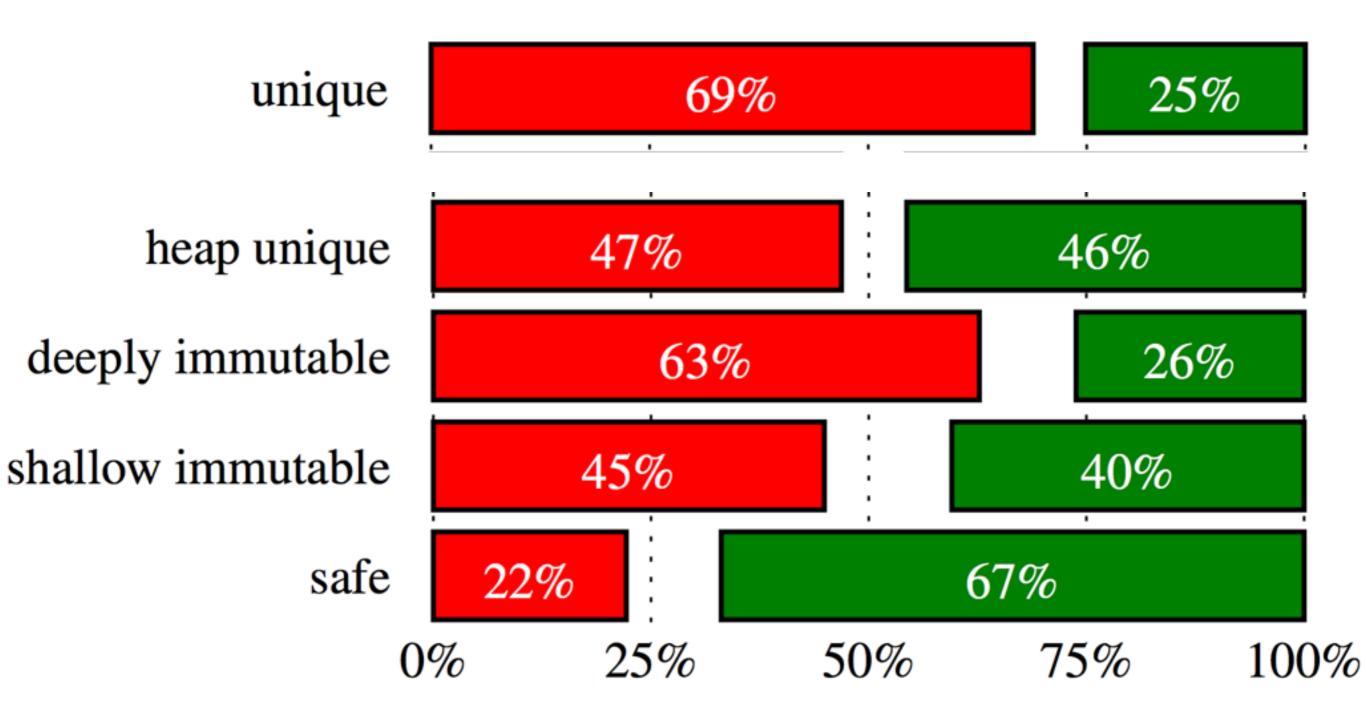
Hypothesis: could annotate class with "heap-shared" keyword







Per Field Analysis



Per Field Analysis

