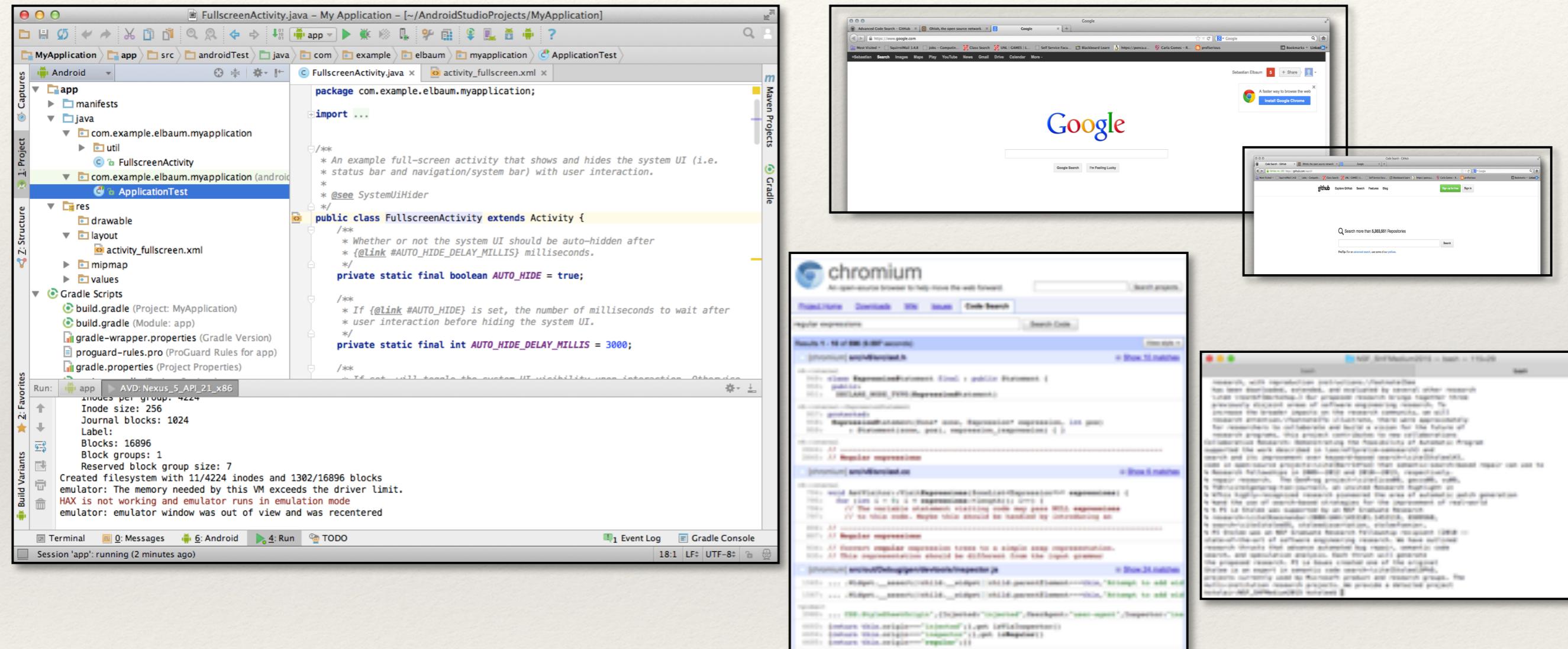

Making software development easier, one search at a time

Dr. Kathryn Stolee
Assistant Professor
North Carolina State University

May 4, 2018

Motivation: Development and Search



What makes search for code different
than search for information?

Evaluating How Developers Use General-Purpose Web-Search for Code Retrieval

Md Masudur Rahman, Jed Barson, Sydney Paul , Joshua Kayani , Federico Andrés Lois , Sebastián Fernandez Quezada , Chris Parnin, Kathryn Stolee, Baishakhi Ray

MSR 2018



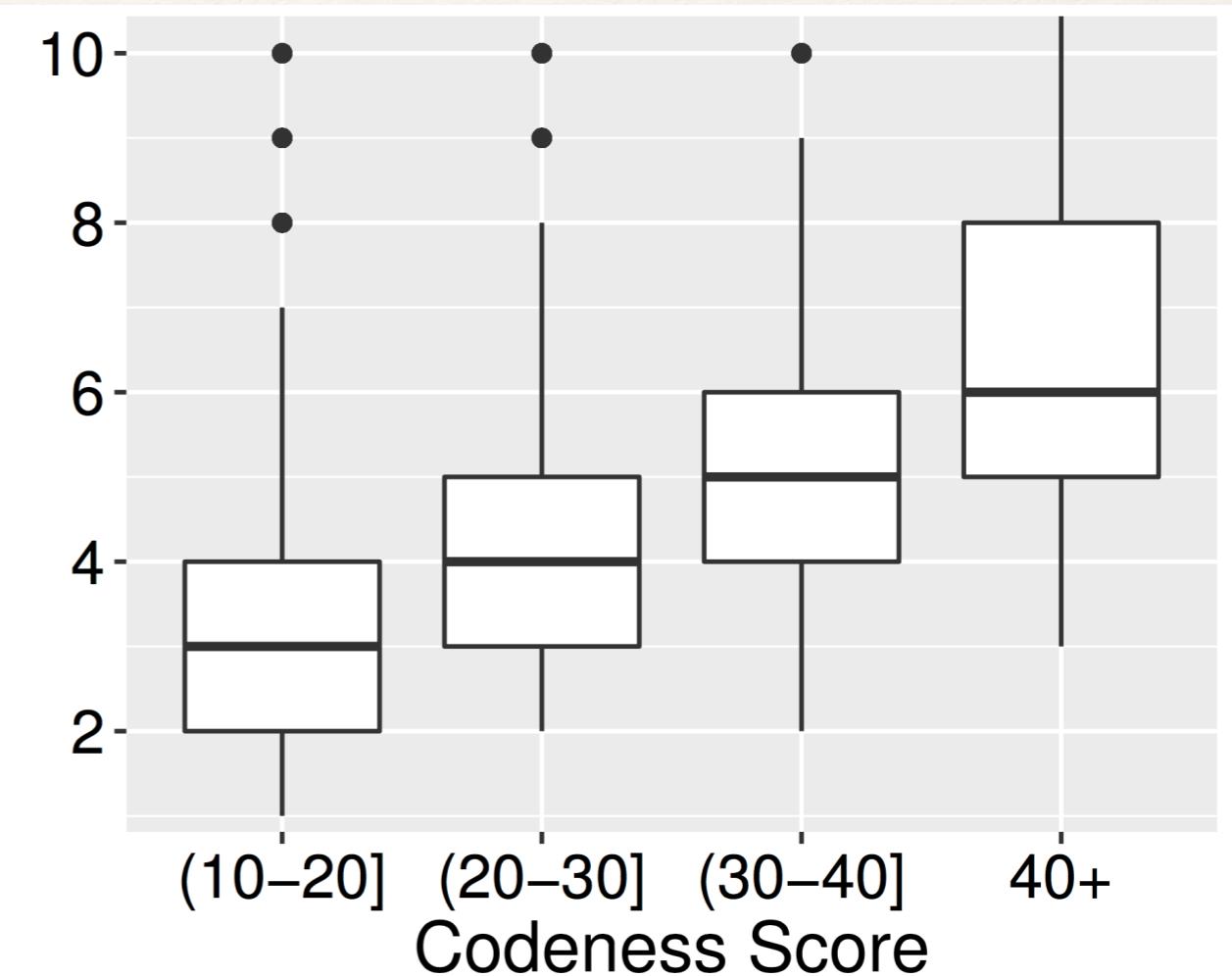
We got some data

- ❖ 14-months of search history from 310 industry programmers / technical leads
- ❖ Collected *only* while the IDE was being used (assume: this reflects activity during software development)
- ❖ 149,610 search queries

We classified the data

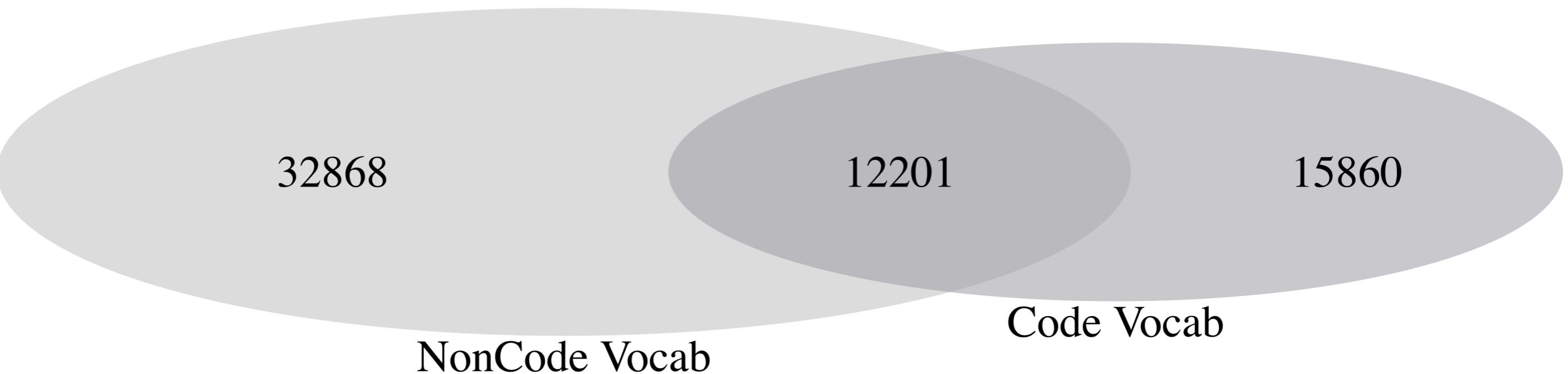
| | Query | Code score | Type | |
|---|---|------------|---------|--------|
| 1 | Javascript mp3 play time | 40.71 | Code | |
| 2 | How to perform xml serialization for parameterless constructor in c# | 67.33 | Code | 88,577 |
| 3 | Javascript get track length from metadata | 48.57 | Code | |
| 4 | May the 4th be With You* | 7.07 | Noncode | 61,033 |
| 5 | Messi curly goal | 2.58 | Noncode | |

What we found



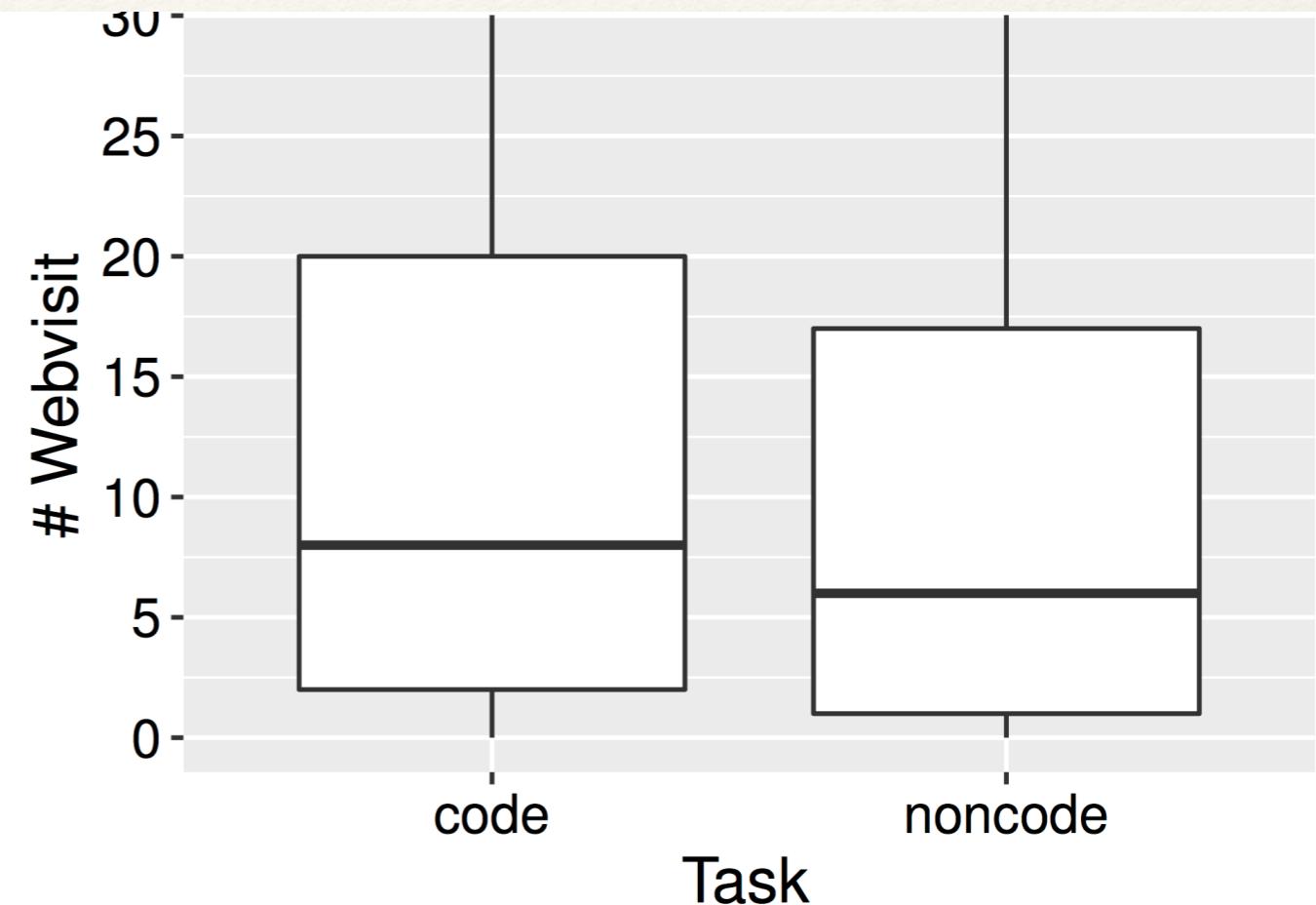
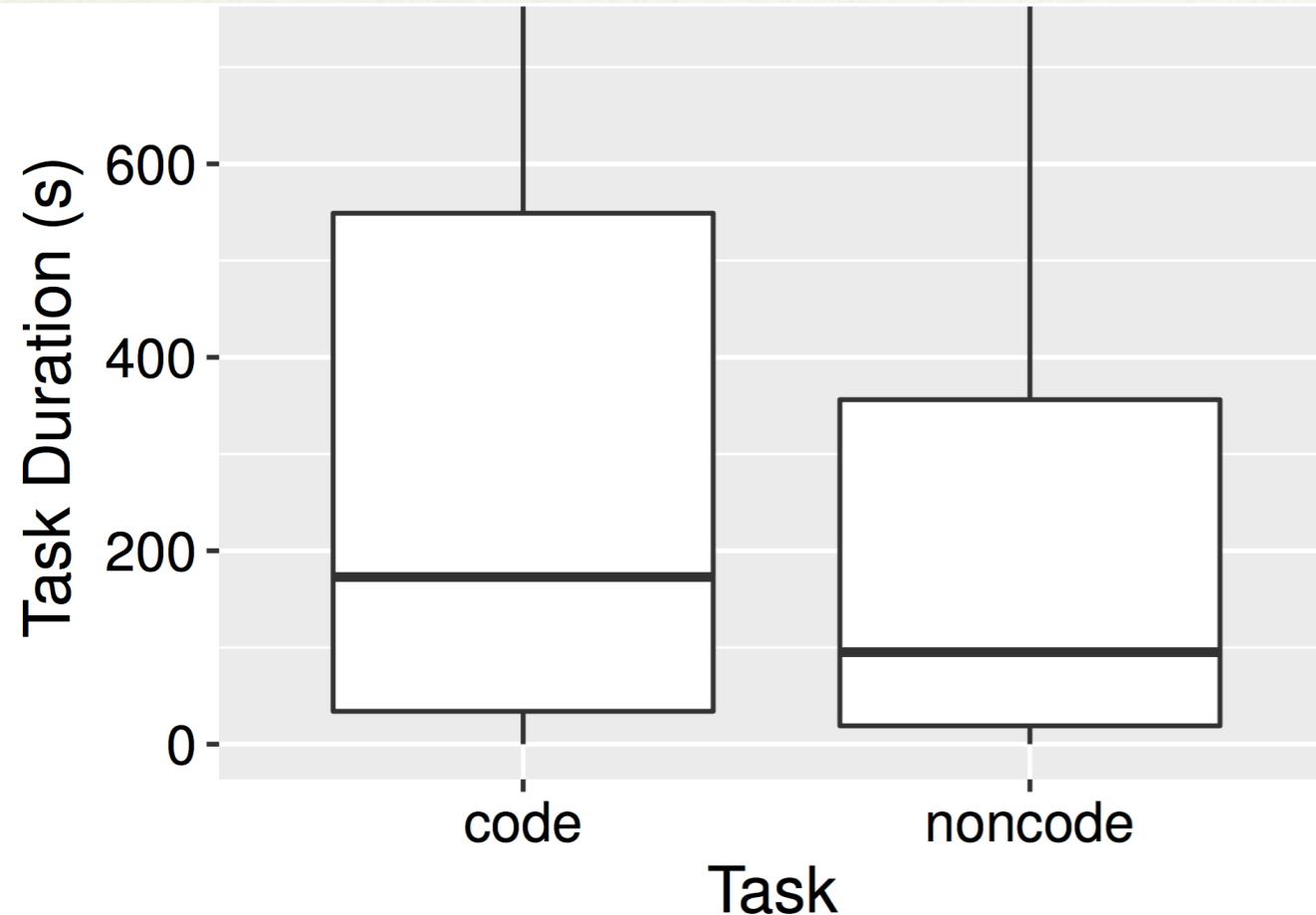
The more code-related, the longer the query.

What we found



The code-query vocabulary is smaller!

What we found



Code-related tasks take longer and require more website visits.

What it means

- ❖ Code search queries are *linguistically* different
- ❖ Code search queries *take more effort* for task completion

What can we do?

- ❖ Better *previews* in the search results to answer questions more quickly and require fewer clicks
- ❖ Linguistic model that *tags parts of code-speech* for query expansion and results ranking

In what contexts are developers
searching for code?

How Developers Search for Code: A Case Study (at Google)

Caitlin Sadowski, Kathryn T. Stolee, and Sebastian Elbaum

FSE 2015



Code Search at Google

 chromium
An open-source browser to help move the web forward.

[Project Home](#) [Downloads](#) [Wiki](#)

 chromium
An open-source browser to help move the web forward.

[Project Home](#) [Downloads](#) [Wiki](#) [Issues](#) [Code Search](#)

Search code
`regular expressions`
Search via [regular expressions](#)

Search Options
Language: Any language
File Path:
Class:
Function:
Symbol:
Case Sensitive: No
Exact: No

Results 1 - 10 of 596 (0.597 seconds) View style ▾

★ [chromium] [src/v8/src/ast.h](#) [+ Show 10 matches](#)

```
v8::internal
 949: class ExpressionStatement final : public Statement {
 950:   public:
 951:     DECLARE_NODE_TYPE(ExpressionStatement)

v8::internal::ExpressionStatement
 957: protected:
 958:   ExpressionStatement(Zone* zone, Expression* expression, int pos)
 959:     : Statement(zone, pos), expression_(expression) { }
```

v8::internal
 2844: // -----
 2845: // Regular expressions

★ [chromium] [src/v8/src/ast.cc](#) [+ Show 6 matches](#)

```
v8::internal
 794: void AstVisitor::VisitExpressions(ZoneList<Expression*>* expressions) {
 795:   for (int i = 0; i < expressions->length(); i++) {
 796:     // The variable statement visiting code may pass NULL expressions
 797:     // to this code. Maybe this should be handled by introducing an
```

14

806: //

Study Design

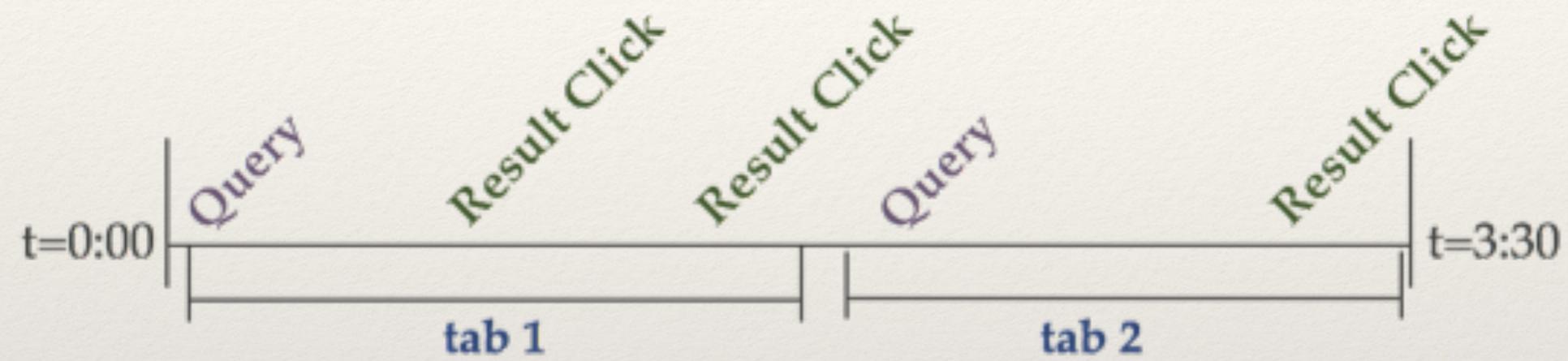
Logging + Survey

| rawTime | DayHourMin | isFileRe | isSugge | isSearch | isQuery | isDirect | isAnnot | isImplicit | session_id | click_type | hashed_quer | hashed_query | hashedUserName |
|-------------|--------------|----------|---------|----------|---------|----------|---------|------------|------------|------------|-------------|---------------|---|
| 1.38635E+15 | 340:09:49:05 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:05 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | browser_sta | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | browser_sta | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:06 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:52 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:52 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | browser_sta | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | browser_sta | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:53 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:58 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:58 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:58 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:58 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:58 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:58 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:09:49:58 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:02:27 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | browser_sta | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:02:27 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 65803f90b5:65803f90b5:371dc3b88b60a06713354b |
| 1.38635E+15 | 340:10:02:27 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | browser_sta | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:02:27 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 65803f90b5:65803f90b5:371dc3b88b60a06713354b |
| 1.38635E+15 | 340:10:02:30 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | search_done | NULL |
| 1.38635E+15 | 340:10:02:30 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | search_done | NULL |
| 1.38635E+15 | 340:10:02:35 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 65803f90b5:65803f90b5:41c70400c32f9fa8840747ae9dc4fea |
| 1.38635E+15 | 340:10:02:38 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 65803f90b5:65803f90b5:41c70400c32f9fa8840747ae9dc4fea |
| 1.38635E+15 | 340:10:02:44 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | search_done | NULL |
| 1.38635E+15 | 340:10:02:44 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | search_done | NULL |
| 1.38635E+15 | 340:10:03:00 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:00 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:01 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | rc | NULL |
| 1.38635E+15 | 340:10:03:01 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | rc | NULL |
| 1.38635E+15 | 340:10:03:01 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:01 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:03 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:03 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:03 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:03 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:04 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:04 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | 63e226b4d4795d518ab341b0824ec29 |
| 1.38635E+15 | 340:10:03:04 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | NULL |
| 1.38635E+15 | 340:10:03:04 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | source_visibl | NULL |
| 1.38635E+15 | 340:10:03:04 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | NULL |
| 1.38635E+15 | 340:10:03:04 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | file_reques | NULL |
| 1.38635E+15 | 340:10:08:25 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | file:3911d45:a5a6880dc83ef6ce89bd78d3683a901 |
| 1.38635E+15 | 340:10:08:25 | 0 | 0 | 1 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | NULL | file:3911d45:a5a6880dc83ef6ce89bd78d3683a901 |
| 1.38635E+15 | 340:10:08:25 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 1.38635E+12 | browser_sta | NULL |
| 1.3863 | | | | | | | | | | | | | |

Study Context

- ❖ 27 developers
 - ❖ 5 female, 22 male
 - ❖ Avg. 9.75 years development (3.4 at Google)
- ❖ 2 weeks of data collection

RQ4: What does a typical search session entail?



**~12 sessions / day = 42 minutes
per day searching!**

Why do programmers search?

Analyzed the free-text survey responses

| Category - “example question” | Percent |
|---|---------|
| Example Code Needed - “How to write a hash function?” | 33.5% |
| Exploring or Reading Code - “What does this script do?” | 26% |
| Code Localization - “Where a class is instantiated?” | 16% |
| Determine Impact - “Why is this failing?” | 16% |
| Metadata - “Who last touched some code?” | 8.5% |

High-Level Results

- ❖ Code search tools are becoming entrenched
- ❖ Developers are searching more, reformulating often
- ❖ Search patterns vary greatly among contexts

Search Context

Discovering a library for a task

What is the side effect of a proposed change?

Very familiar with code I am searching for

Search Pattern

Search+

73%

Search+
Click+

75%

Search
Click

28%

Open Question => Next Steps

- ❖ How do we know a search is successful?
=> Query developers directly?
- ❖ How do these results generalize to other devs?
=> Replicate with another company, students, etc.

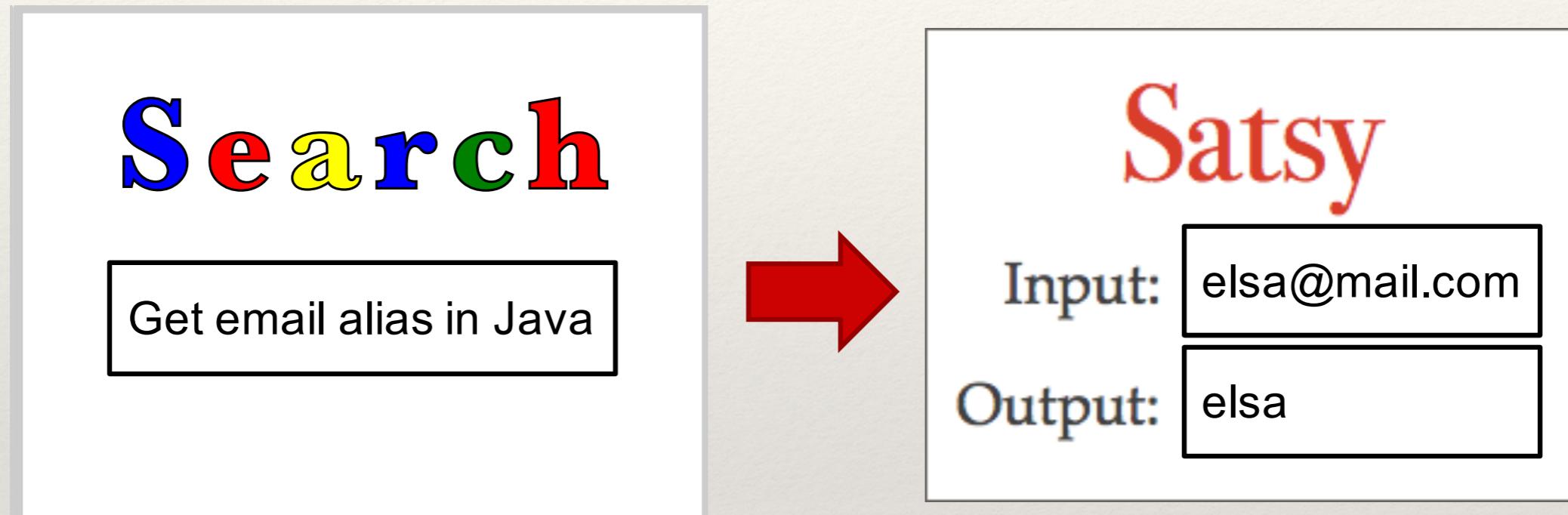
Are keywords expressive enough to
describe code-related concepts?

Solving the Search for Source Code

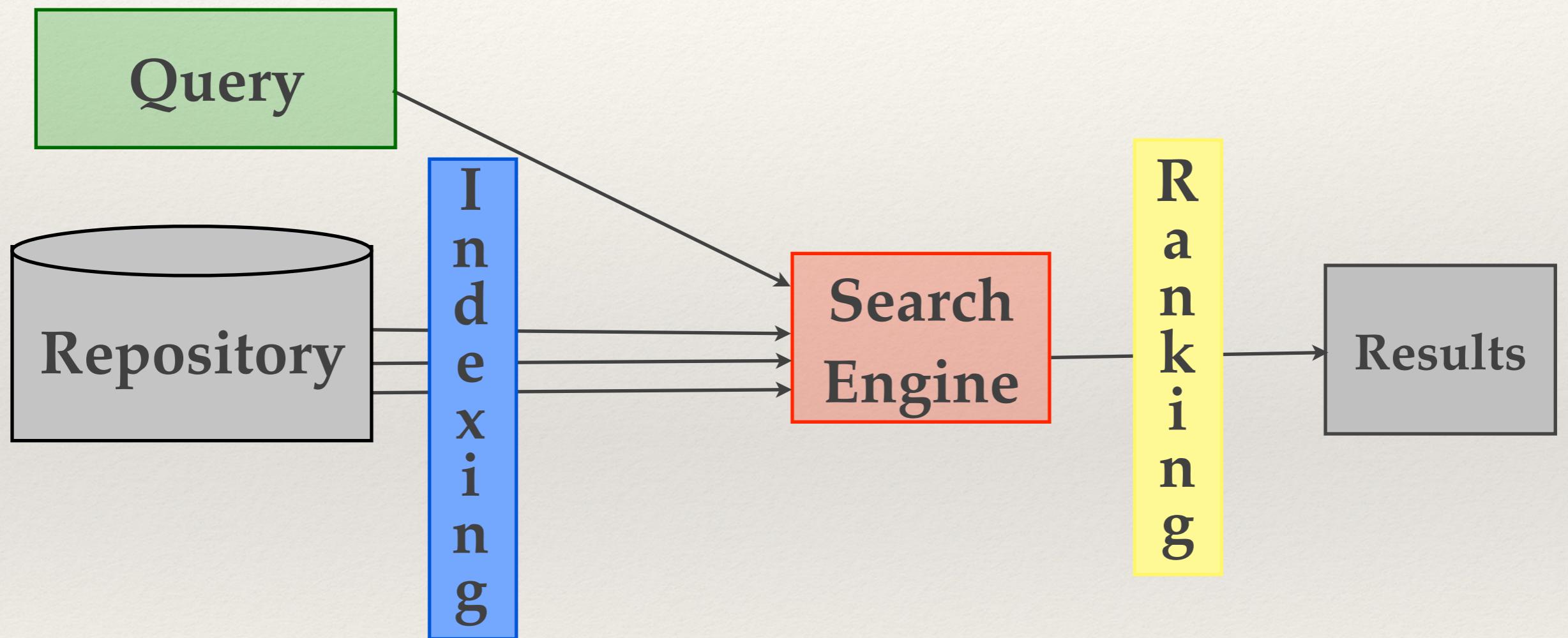
Kathryn T. Stolee, Sebastian Elbaum, and Daniel Dobos
TOSEM 2014



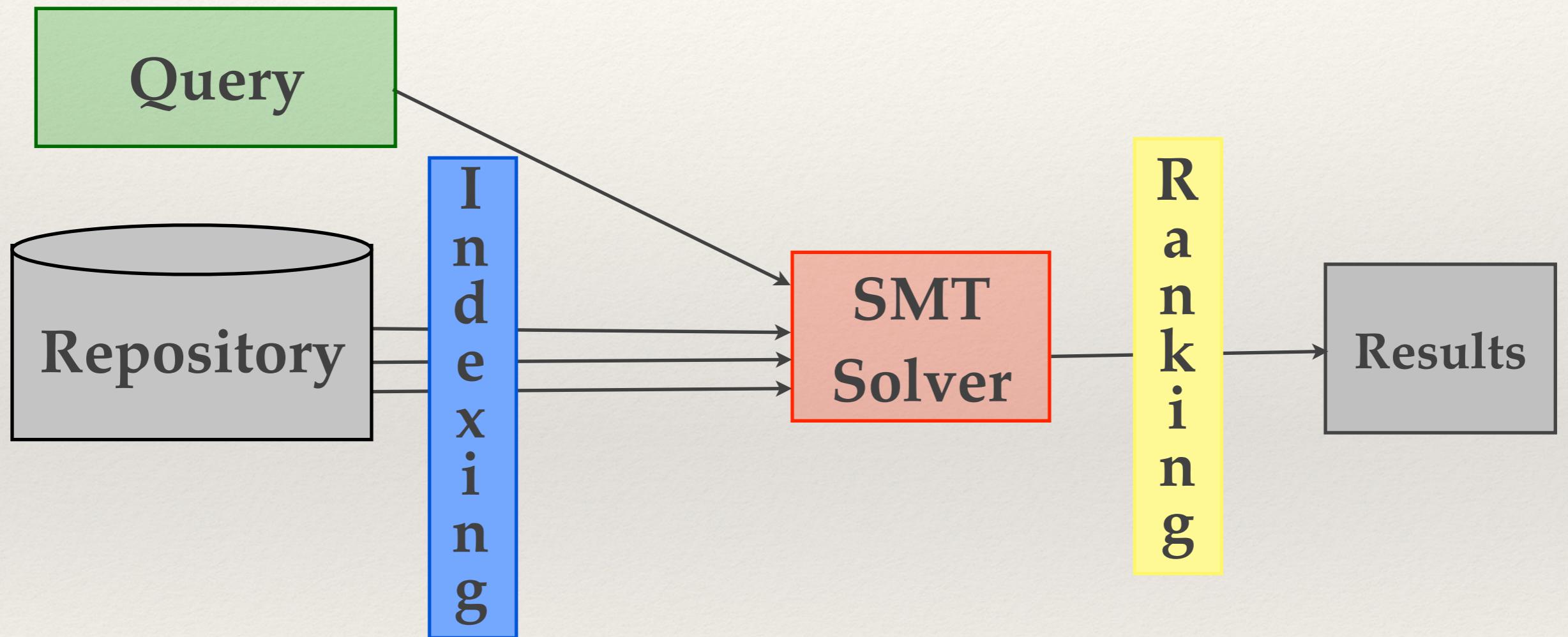
Search by Example



How Does Search Work?



How Does Search Work?



SMT Solvers

Satisfiability Modulo Theory solvers determine if a logical formula is satisfiable

| Facts | Assertions |
|-------------|----------------------------|
| $a \geq 0$ | (assert ($\geq a 0$)) |
| $b = 2$ | (assert ($= b 2$)) |
| $c = 2$ | (assert ($= c 2$)) |
| $c = a * b$ | (assert ($= (* a b) c$)) |

Result: **sat** $a \mapsto 1$

SMT Solvers

Satisfiability Modulo Theory solvers determine if a logical formula is satisfiable

| Facts | Assertions |
|-------------|--------------------------------------|
| $a \geq 0$ | (assert ($\geq a 0$)) |
| $b = ?$ | (assert ($= b ?$)) |
| $c = 2$ | (assert ($= c 2$)) |
| $c = a * b$ | (assert ($= (* a b) c$)) |

Result:

sat $a \mapsto \text{True} \wedge b \mapsto \text{True}$

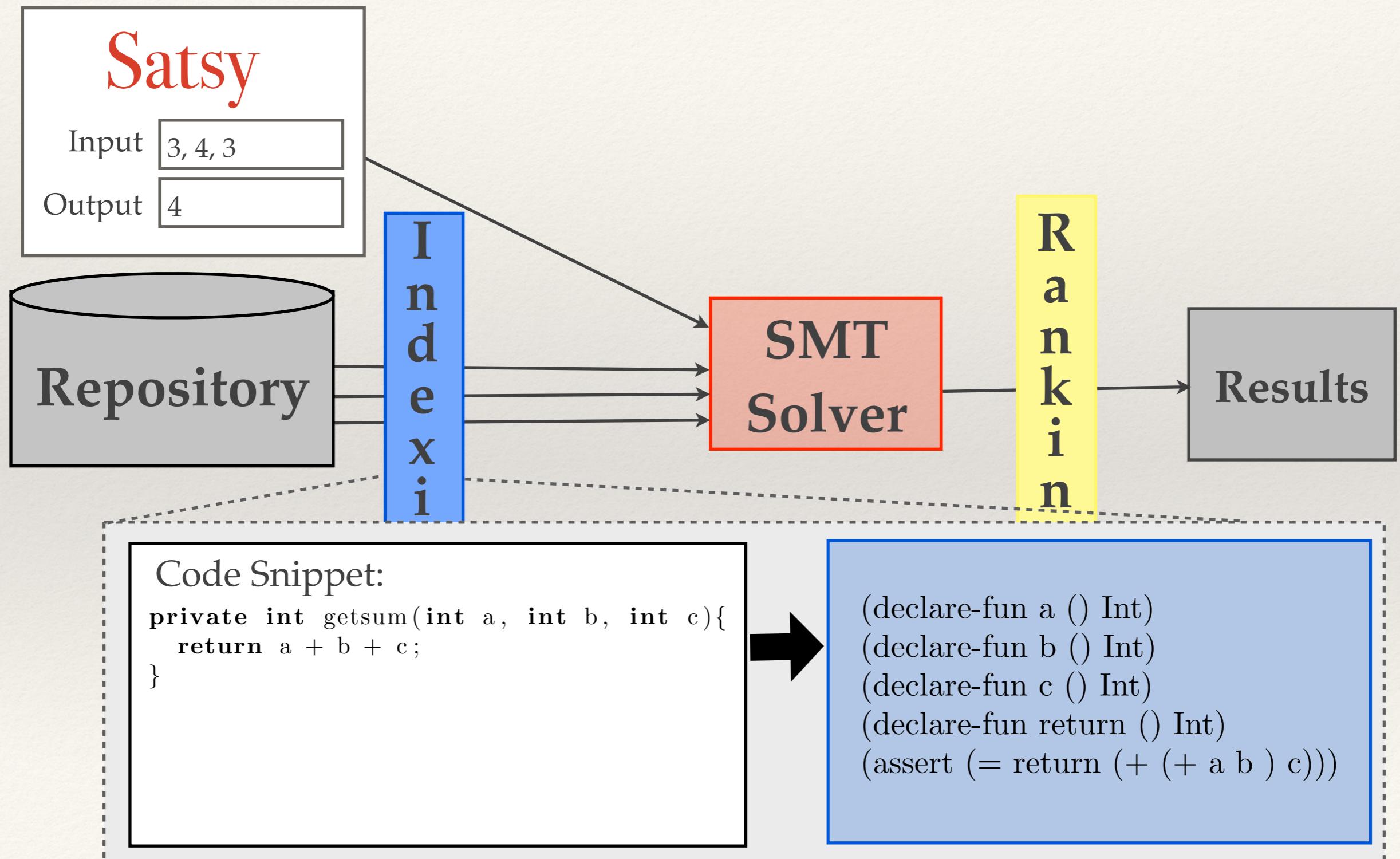
SMT Solvers

Satisfiability Modulo Theory solvers determine if a logical formula is satisfiable

| Facts | Assertions |
|-------------|------------------------|
| $a = 0$ | (assert (= a 0)) |
| $b = ?$ | (assert (= b ?)) |
| $c = 2$ | (assert (= c 2)) |
| $c = a * b$ | (assert (= (* a b) c)) |

Result: **unsat**

Search by Example



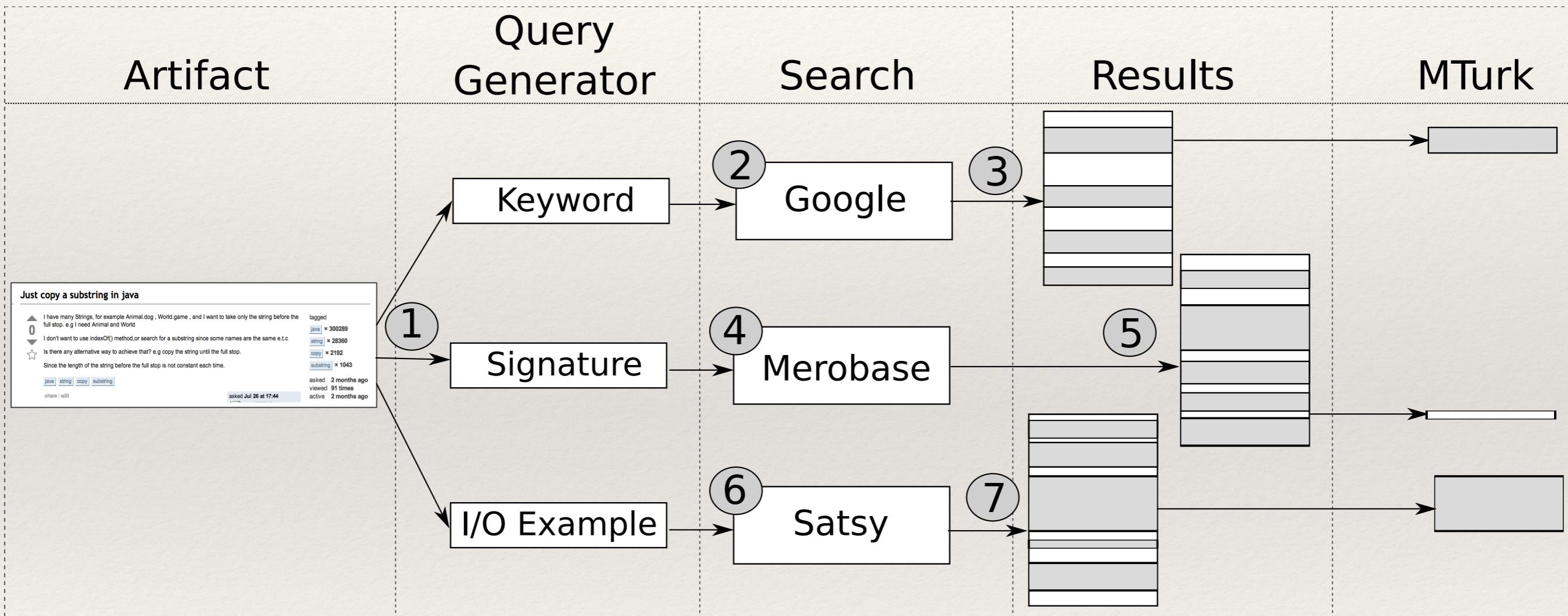
$\langle \text{statements} \rangle ::= (\langle \text{statement} \rangle)^*$
 $\langle \text{statement} \rangle ::= \langle \text{variableDeclaration} \rangle \mid \langle \text{assignment} \rangle \mid \langle \text{ifStatement} \rangle \mid \langle \text{return} \rangle$
 $\langle \text{variableDeclaration} \rangle ::= \langle \text{type} \rangle \langle \text{ident} \rangle ;$
 $\langle \text{ifStatement} \rangle ::= \text{'if'} \text{ '(\text{expr})'} \text{ '\{'} \langle \text{statements} \rangle \text{ '\}'}$
 $\quad (\text{'else'} \text{ '\{'} \langle \text{expr} \rangle \text{ '\}'})^*$
 $\quad (\text{'else'} \text{ '\{'} \langle \text{statements} \rangle \text{ '\}'})?$
 $\langle \text{assignment} \rangle ::= \langle \text{type} \rangle? \langle \text{ident} \rangle \text{ '=' } \langle \text{expr} \rangle ;$
 $\langle \text{return} \rangle ::= \text{'return'} \langle \text{expr} \rangle ;$
 $\langle \text{expr} \rangle ::= \langle \text{logicalOrExpr} \rangle$
 $\langle \text{logicalOrExpr} \rangle ::= \langle \text{logicalAndExpr} \rangle (\text{'||'} \langle \text{logicalAndExpr} \rangle)^*$
 $\langle \text{logicalAndExpr} \rangle ::= \langle \text{equalityExpr} \rangle (\text{'&&'} \langle \text{equalityExpr} \rangle)?$
 $\langle \text{equalityExpr} \rangle ::= \langle \text{relationalExpr} \rangle ((\text{'!='} \mid \text{'=='}) \langle \text{relationalExpr} \rangle)?$
 $\langle \text{relationalExpr} \rangle ::= \langle \text{addExpr} \rangle ((\text{'<'} \mid \text{'<='} \mid \text{'>'} \mid \text{'>='}) \langle \text{addExpr} \rangle)?$
 $\langle \text{addExpr} \rangle ::= \langle \text{multExpr} \rangle ((\text{'+'} \mid \text{'-'})) \langle \text{multExpr} \rangle)?$
 $\langle \text{multExpr} \rangle ::= \langle \text{primaryExpr} \rangle ((\text{'*'} \mid \text{'/'} \mid \text{'%'})) \langle \text{primaryExpr} \rangle)?$
 $\langle \text{primaryExpr} \rangle ::= \langle \text{invokeExpr} \rangle \mid \langle \text{stringLiteral} \rangle \mid \langle \text{charLit} \rangle \mid \langle \text{integer} \rangle \mid \langle \text{booleanLit} \rangle$
 $\quad \mid \text{'('} \langle \text{expr} \rangle \text{ ')'} \mid \langle \text{ident} \rangle$
 $\langle \text{invokeExpr} \rangle ::= (\langle \text{ident} \rangle \mid \langle \text{stringLiteral} \rangle) (\text{(.)} \langle \text{noarg} \rangle \text{ '(\text{'})'})$
 $\quad \mid (\langle \text{onearg} \rangle \text{ '(\text{expr})'})$
 $\quad \mid (\langle \text{twoarg} \rangle \text{ '(\text{expr})'}, \langle \text{expr} \rangle)? \text{ '(\text{'})'}) +$
 $\langle \text{noarg} \rangle ::= \text{'length'} \mid \text{'toLowerCase'} \mid \text{'toUpperCase'} \mid \text{'trim'}$
 $\langle \text{onearg} \rangle ::= \text{'charAt'} \mid \text{'concat'} \mid \text{'contains'} \mid \text{'endsWith'} \mid \text{'equals'} \mid \text{'equalsIgnoreCase'}$
 $\quad \mid \text{'indexOf'} \mid \text{'lastIndexOf'} \mid \text{'startsWith'} \mid \text{'substring'}$
 $\langle \text{twoarg} \rangle ::= \text{'indexOf'} \mid \text{'lastIndexOf'} \mid \text{'replace'}$
 $\langle \text{type} \rangle ::= \text{'char'} \mid \text{'String'} \mid \text{'int'} \mid \text{'boolean'}$
 $\langle \text{booleanLit} \rangle ::= \text{'true'} \mid \text{'false'}$
 $\langle \text{integer} \rangle ::= (\text{'0'} \mid (\text{'1'} \dots \text{'9'})) (\text{'0'} \dots \text{'9'})^*);$

Language Support

Evaluation

How do **semantic** search results compare to those found using **Google** and those found with the code-specific search engine, **Merobase**, *from the perspective of a programmer?*

Setup



Results



Semantic search returns more relevant results than Merobase and results at least as relevant as Google

Open Questions

- ❖ How can we extend the encoding? (e.g., C language, regular expressions, objects)
- ❖ How can we measure code similarity to enable efficient search?

How can semantic search be used?

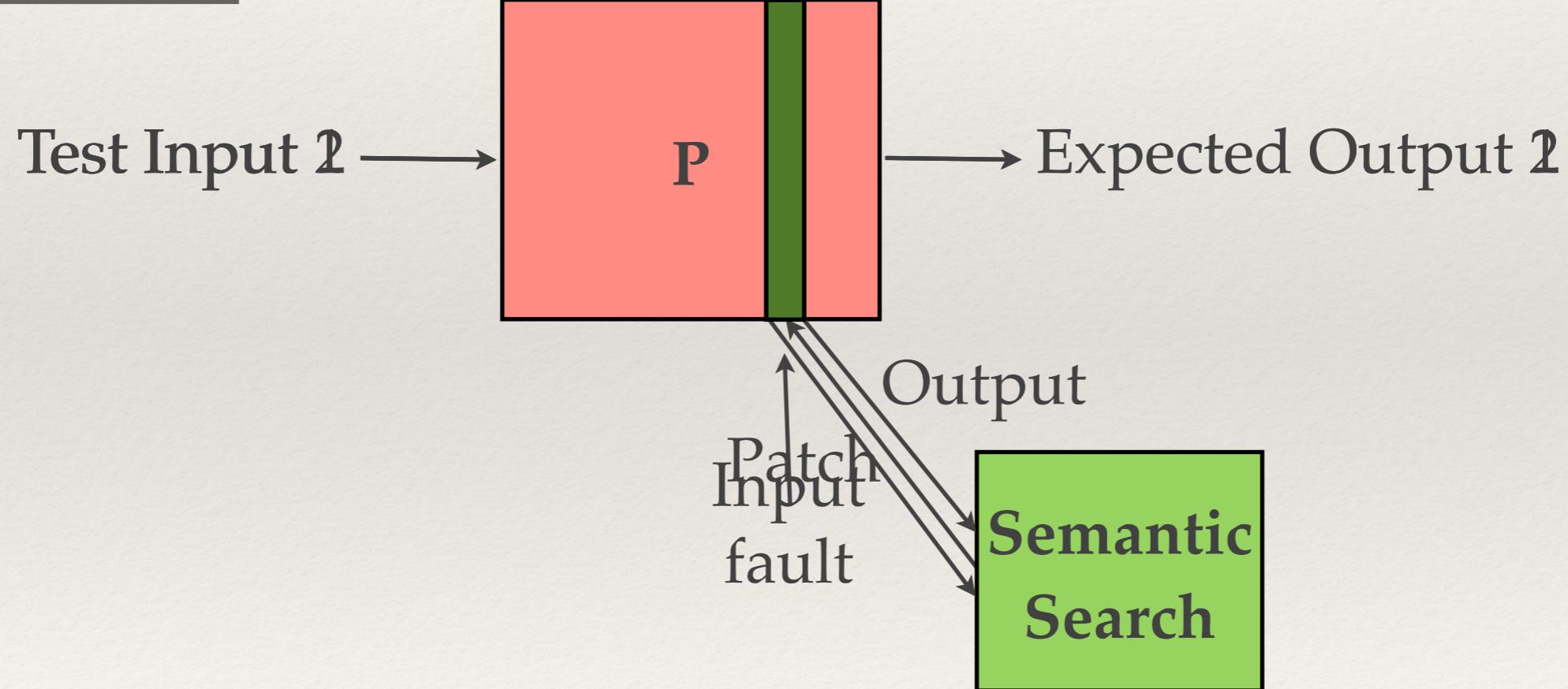
Semantic-Search Driven Automated Program Repair

Yalin Ke, Kathryn T. Stolee, Claire Le Goues and Yuriy Brun
ASE 2015



Semantic Code Search + Automated Program Repair

| Test Suite |
|---------------|
| Test Case 1 ✓ |
| Test Case 2 ✗ |



Example

```
1 int main() {
2     int a,b,c,median=0;
3     printf("Please enter 3 numbers separated by spaces >");
4     scanf("%d%d%d", &a, &b, &c);
5     if ((a<=b && a>=c) || (a>=b && a<=c))
6         median = a;
7     else if ((b<=a && b>=c) || (b>=a && b<=c))
8         median = b;
9     else if ((c<=b && a>=c) || (c>=b && a<=c)) Fault!
10        median = c;
11     printf("%d is med\n", median);
12     return 0;
13 }
```

Example

```
1 int main() {
2     int a,b,c,median=0;
3     printf("Please enter 3 numbers separated by spaces >");
4     scanf("%d%d%d", &a, &b, &c);
5     if ((a<=b && a>=c) || (a>=b && a<=c))
6         median = a;
7     else if ((b<=a && b>=c) || (b>=a && b<=c))
8         median = b;
9     else if ((c<=b && a>=c) || (c>=b && a<=c))
10        median = c;
11    printf("%d is med\n", median);
12    return 0;
13 }
```

Fault Region

Example

| Input | Expected | Actual | Result |
|-------|------------|------------|--------|
| 0 2 3 | "2 is med" | "2 is med" | ✓ |
| 0 2 1 | "1 is med" | "0 is med" | ✗ |
| 8 2 6 | "6 is med" | "0 is med" | ✗ |

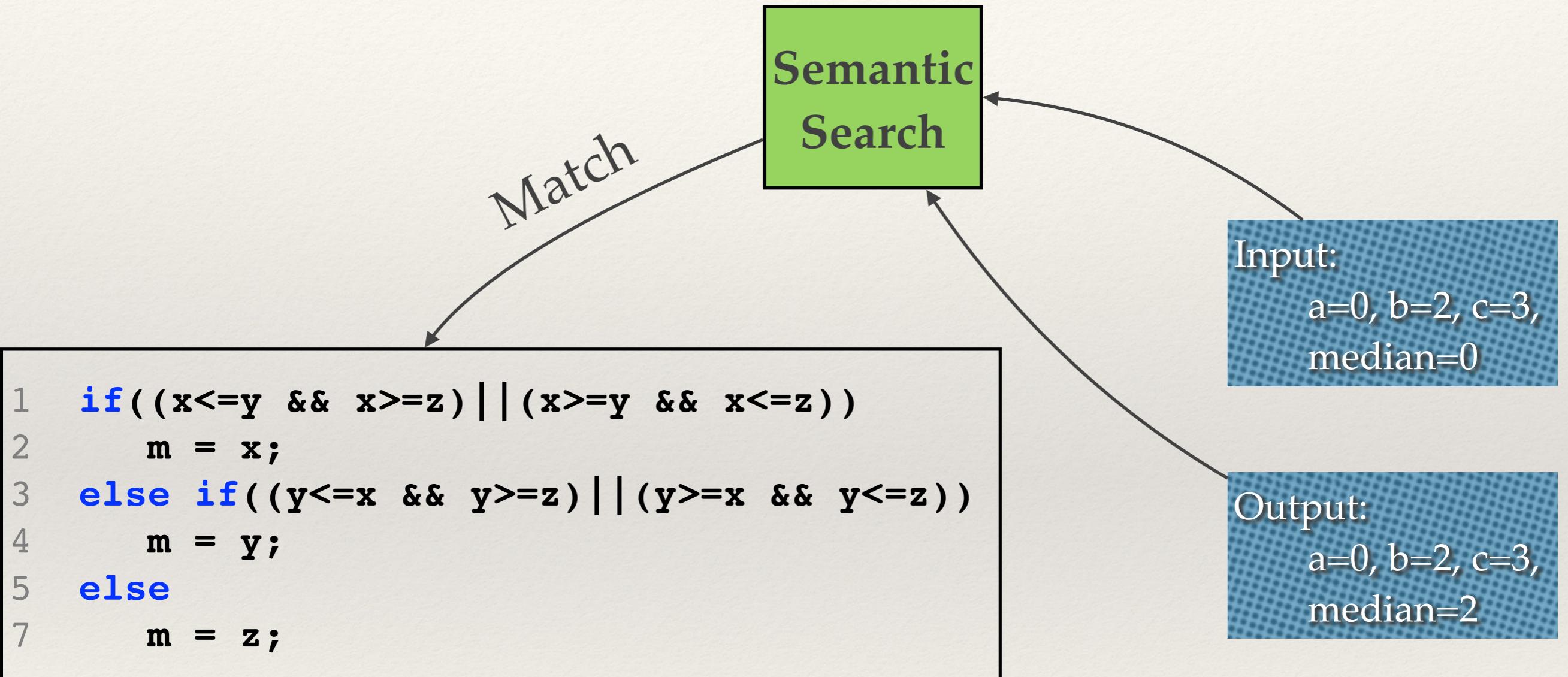
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10        median = c;
11     printf("%d is med\n", median);
12     return 0;
13 }
```

Input:
 a=0, b=2, c=3,
 median=0

Output:
 a=0, b=2, c=3,
 median=2

Example



Example

| Input | Expected | Actual | Result |
|-------|------------|------------|--------|
| 0 2 3 | "2 is med" | "2 is med" | ✓ |
| 0 2 1 | "1 is med" | "0 is med" | ✗ |
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```
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Example

| | Input | Expected | Actual | Result |
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```

Full Repair!

Example

| | Input | Expected | Actual | Result |
|--|-------|------------|------------|--------|
| | 0 2 3 | "2 is med" | "2 is med" | ✓ |
| | 0 2 1 | "1 is med" | "0 is med" | ✓ |
| | 8 2 6 | "6 is med" | "0 is med" | X |

```
1 int main() {  
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11     printf("%d is med\n", median);  
12     return 0;  
13 }
```

Partial Repair

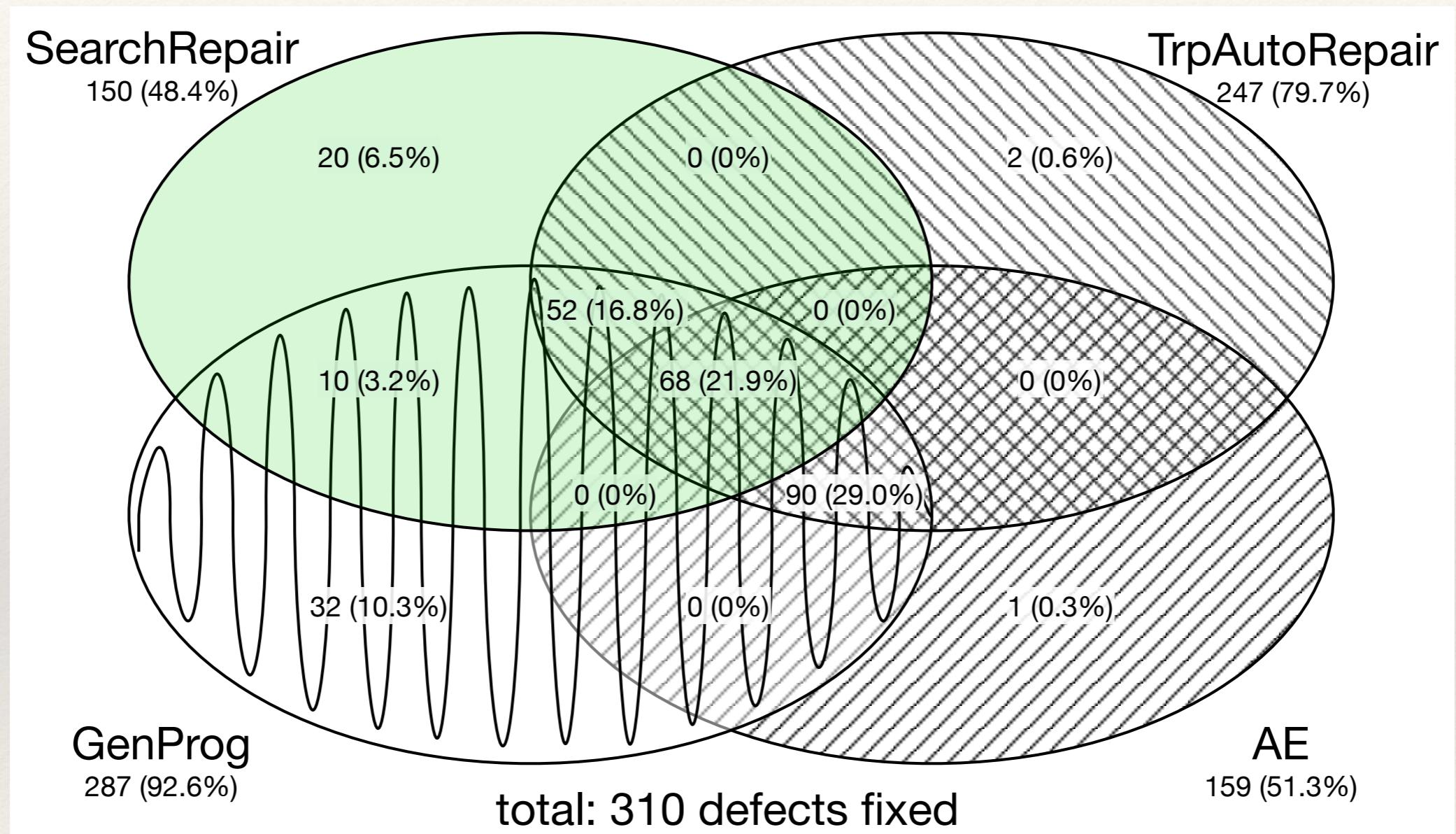
Evaluation

- ❖ 778 total versions for six small C programs
- ❖ Compared to state-of-the-art program repair tools:
GenProg, TrpAutoRepair and AE

IntroClass Data Set

| Program | Defects | Tests | Description |
|-----------|---------|-------|--------------------------|
| checksum | 29 | 6 | check sum of a string |
| digits | 91 | 6 | digits of a number |
| grade | 226 | 9 | grade from score |
| median | 168 | 7 | median of three numbers |
| smallest | 155 | 8 | smallest of four numbers |
| syllables | 109 | 6 | count vowels in string |
| Total | 778 | 42 | |

Defects Fixed



Hypothesis:
using human-written code to construct patches and
performing repair at a higher granularity level
leads to better patches.

Independent Test Suite

- ❖ Generated from KLEE run over oracle programs for branch coverage
- ❖ Measures how well patches adhere to an unwritten specification — repair quality

SearchRepair

GenProg

TrpAutoRepair

AE

97.2%

68.7%

72.1%

64.2%

Take-Home Message

- ❖ SearchRepair can repair faults not repairable by state-of-the-art *generate-and-validate* repair techniques
- ❖ Patches are less prone to overfitting

Open Questions

- ❖ What is the best level of granularity for the patches?
- ❖ Can this scale to larger / complex programs?
- ❖ Can we lose precision in the matching and still find useful patches?

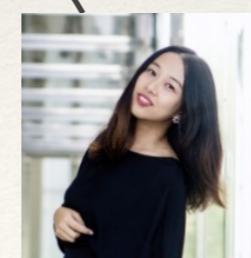
Making software development easier, one search at a time

- ❖ We've explored:
 - ❖ Linguistic properties of code searches
 - ❖ Contexts of code searches
 - ❖ An example-based approach to code search
 - ❖ Code-search-enabled program repair
- ❖ And there's still a lot more to be done!

Acknowledgements

- ❖ **Funding:**
 - ❖ [2018-2023] NSF CAREER #1749936: On the Foundations of Semantic Code Search
 - ❖ [2016-2020] NSF SHF Medium #1645136: Collaborative Research: Semi and Fully Automated Program Repair and Synthesis via Semantic Code Search
 - ❖ [2014-2016] NSF SHF EAGER #1446932: Collaborative Research: Demonstrating the Feasibility of Automatic Program Repair Guided by Semantic Code Search.

Acknowledgements



Questions?

(P.S. come to grad school at NCSU!)