



Are Code Examples on an Online Q&A Forum Reliable?

A Study of API Misuse on Stack Overflow

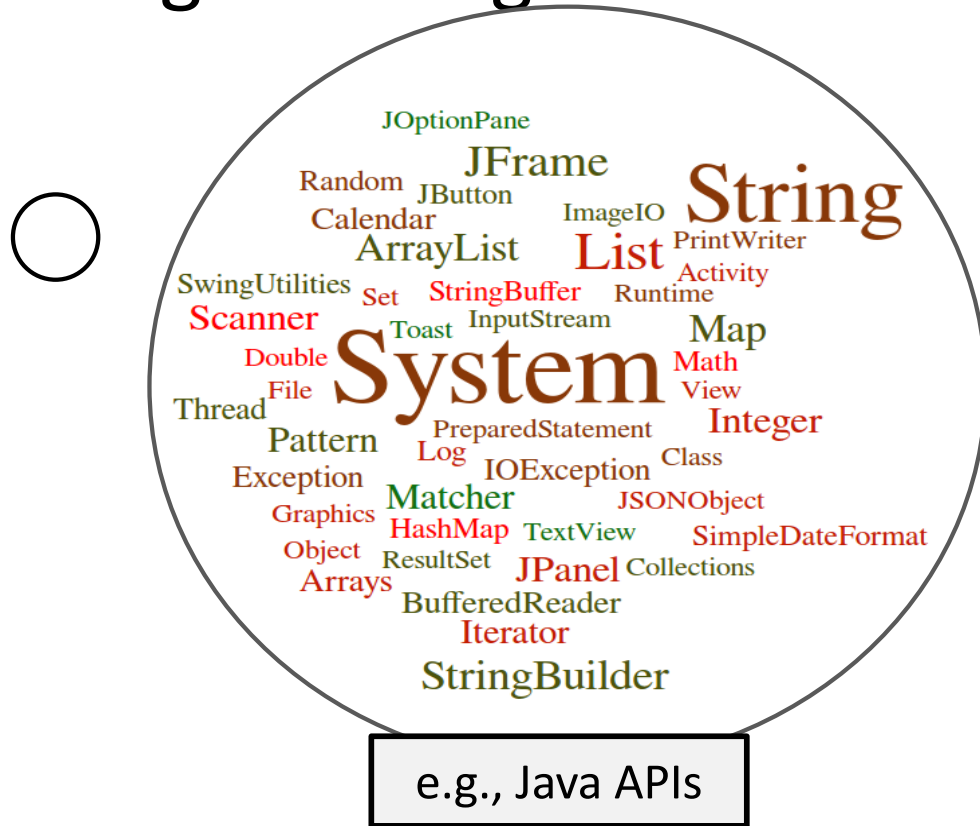
Tianyi Zhang¹, Ganesha Upadhyaya², Anastasia Reinhart³, Hridesh Rajan², Miryung Kim¹

¹University of California, Los Angeles

²Iowa State University

³George Fox University

Using APIs properly is a key challenge in Programming



e.g., Java APIs

The Status Quo of Learning APIs

Developers often search online for code examples to learn APIs
[Sadowski et al. 2016]



A collage of logos for various code hosting and Q&A platforms: Atlassian Bitbucket, stackoverflow, github, GitLab, and sourceforge. Overlaid on these logos are several snippets of Java code. One snippet shows an enum 'Blah' with values A, B, C, D and a constructor. Another shows a 'main' method with a 'try' block and a 'finally' block. A third snippet shows a 'Services' class with a 'registerDefaultProvider' method. The code snippets are presented in a layered, overlapping manner, suggesting a search or discovery process.

The Limitation of Online Code Examples

- Programmers can only inspect a handful of search results. [Brandt et al. 2009, Starke et al. 2009, Duala-Ekoko and Robillard 2012]
- Individual code examples may suffer from
 - insecure coding practices [Fischer et al. 2017]
 - unchecked obsolete usage [Zhou and Walker 2016]
 - low readability [Treude and Robillard 2017]

“How do I write data to a file using FileChannel?”

You're probably interested in a `FileChannel`. `Channel`s were designed to perform bulk IO operations to and from `Buffer`s.

2

Ex:

```
FileChannel fileOut = new FileOutputStream(file).getChannel();
fileOut.write(ByteBuffer.wrap("Whatever you want to write".getBytes()));
```

share improve this answer

answered Apr 8 '12 at 19:39



Jeffrey

35.7k ● 7 ● 60 ● 111

Actually, I want to maintain a large buffer (whose size I can mention) and periodically flush it. – [Arpssss](#) Apr 8 '12 at 19:43

@Arpssss You can maintain a `ByteBuffer` and periodically write it to the file system. You don't have to create your `ByteBuffer` inline like that. – [Jeffrey](#) Apr 8 '12 at 19:47

Thanks. Is it possible to use charbuffer of NIO ? – [Arpssss](#) Apr 8 '12 at 20:05

`FileChannel` cannot write a `CharBuffer`. You can, however, use `ByteBuffer#putChar` to put characters

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▼ Ex:

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This example forgets to close the `FileChannel` object properly.

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“How do I write data to a file using FileChannel?”

▲ Somewhat like this:

7

▼

```
short[] payload = {1,2,3,4,5,6,7,8,9,0};
ByteBuffer myByteBuffer = ByteBuffer.allocate(20);
myByteBuffer.order(ByteOrder.LITTLE_ENDIAN);

ShortBuffer myShortBuffer = myByteBuffer.asShortBuffer();
myShortBuffer.put(payload);

FileChannel out = new FileOutputStream("sample.bin").getChannel();
out.write(myByteBuffer);
out.close();
```

✓

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✓

This example forgets to handle potential exceptions such as IOException and FileNotFoundException.

Research Questions

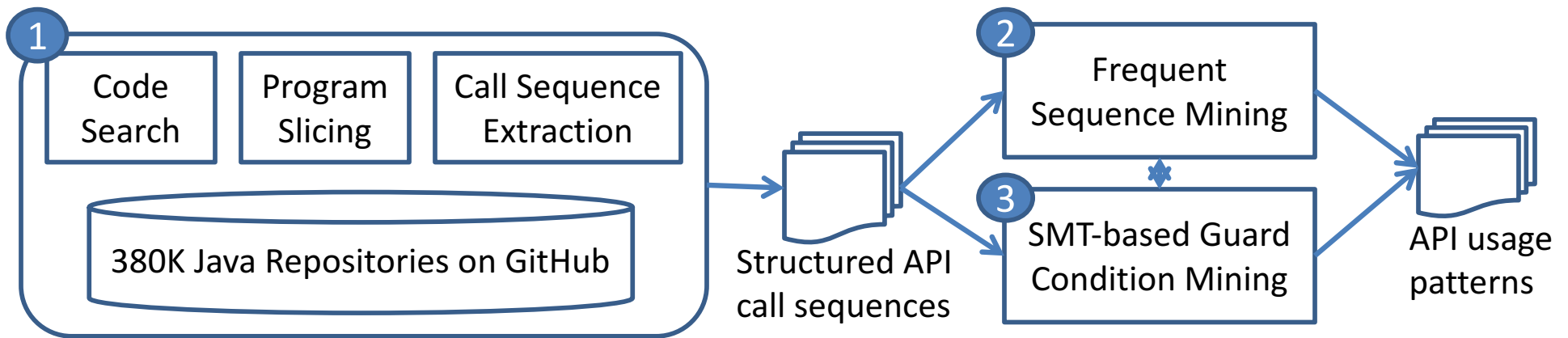
- RQ1. Is API misuse prevalent on Stack Overflow?
- RQ2. Are highly voted posts more reliable?
- RQ3. What are the characteristics of API misuse?

Outline

- Problem Statement
- **API usage mining from 380K Java Projects on GitHub**
- An Empirical Study of API Misuse on Stack Overflow

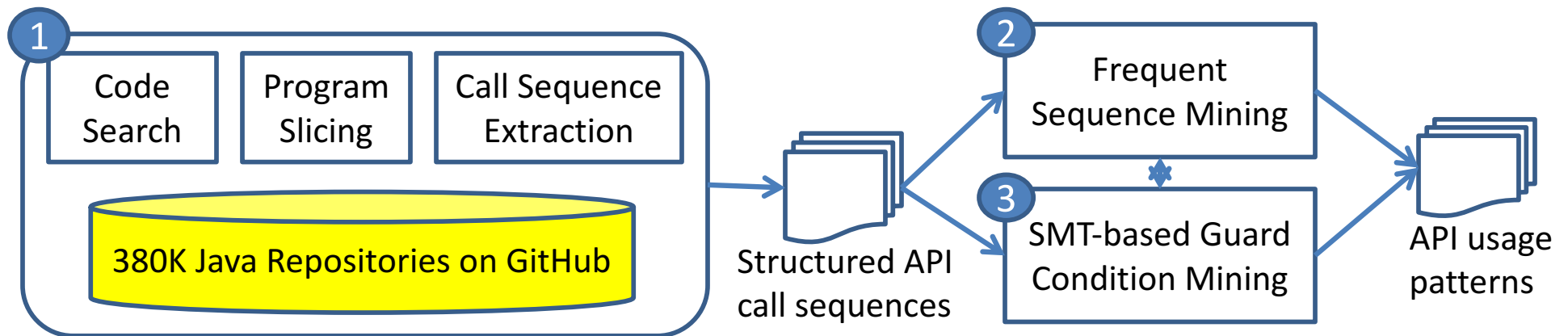
API Usage Mining from GitHub

- We contrast SO snippets with API usage patterns mined from 380K GitHub projects.



Insight 1: Mining a Large Code Corpus

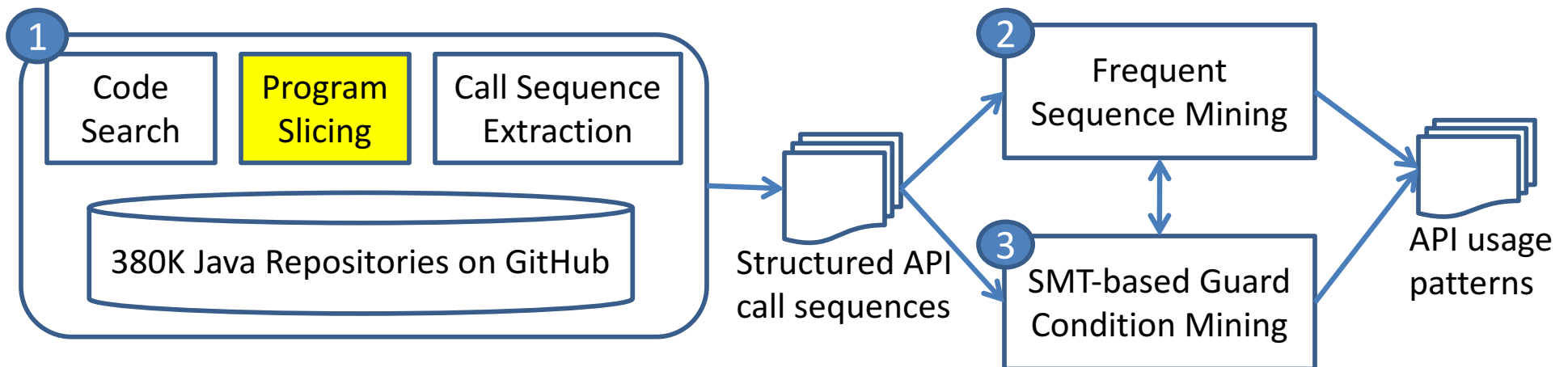
- Our code corpus includes 380K GitHub projects with at least 100 revisions and 2 contributors.



Dyer et al. Boa: A language and infrastructure for analyzing ultra-large-scale software repositories. ICSE 2013.

Insight 2: Removing Irrelevant Statements via Program Slicing

- We perform backward and forward slicing to identify data- and control-dependent statements to an API method of interest.




```

void initInterfaceProperties(String temp, File dDir) {
    if(!temp.equals("props.txt")) {
        log.error("Wrong Template.");
        return;
    }
    // load default properties
    FileInputStream in = new FileInputStream(temp);
    Properties prop = new Properties();
    prop.load(in);
    ... init properties ...
    // write to the property file
    String fPath=dDir.getAbsolutePath()+"/interface.prop";
    File file = new File(fPath);
    if(!file.exists()) {
        file.createNewFile();
    }
    FileOutputStream out = new FileOutputStream(file);
    prop.store(out, null);
    in.close();
}

```

GitHub example of
File.createNewFile

The focal  API method

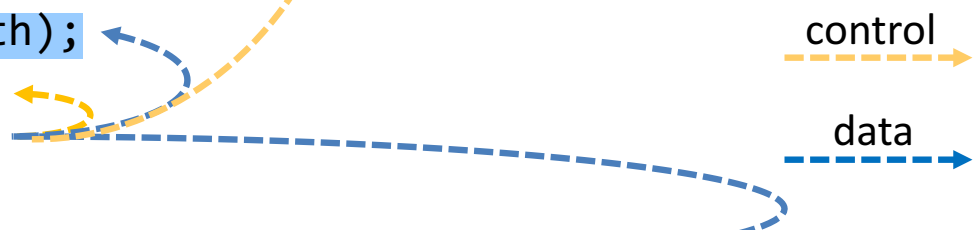
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```

Data dependency up to **one** hop, i.e., direct dependency

The focal API method



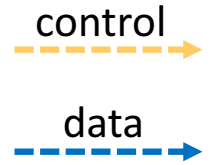

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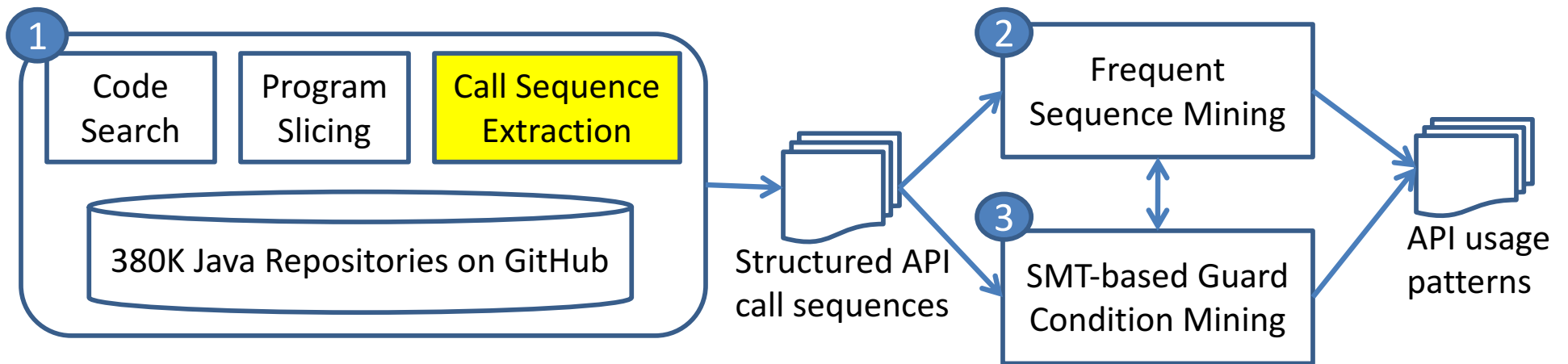
Data dependency up to two hops

The focal
API method



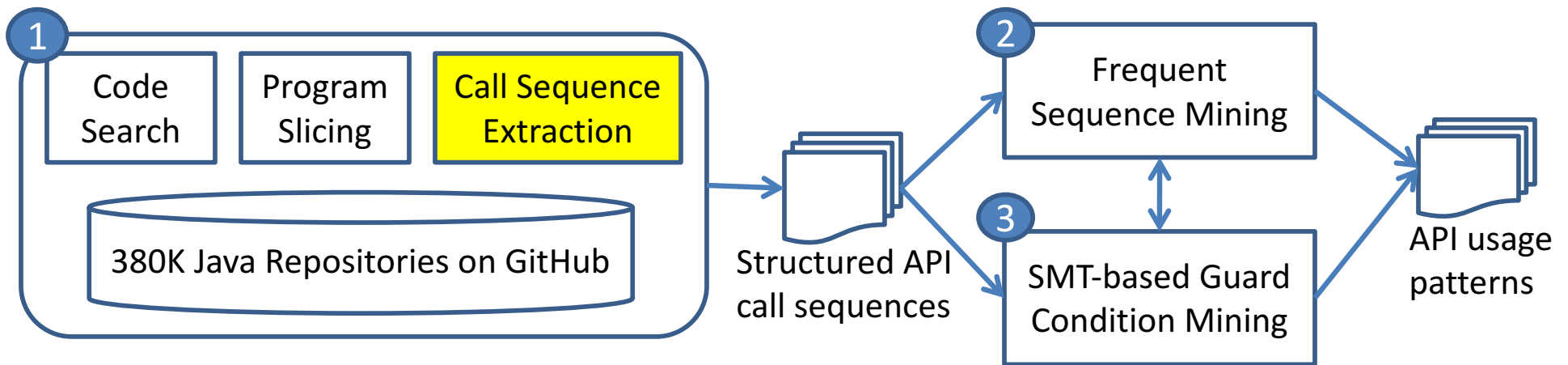
Insight 3: Capture Semantics Info in API Usage

- It is important to capture the temporal ordering, enclosing control structures, and appropriate guard conditions of API calls.



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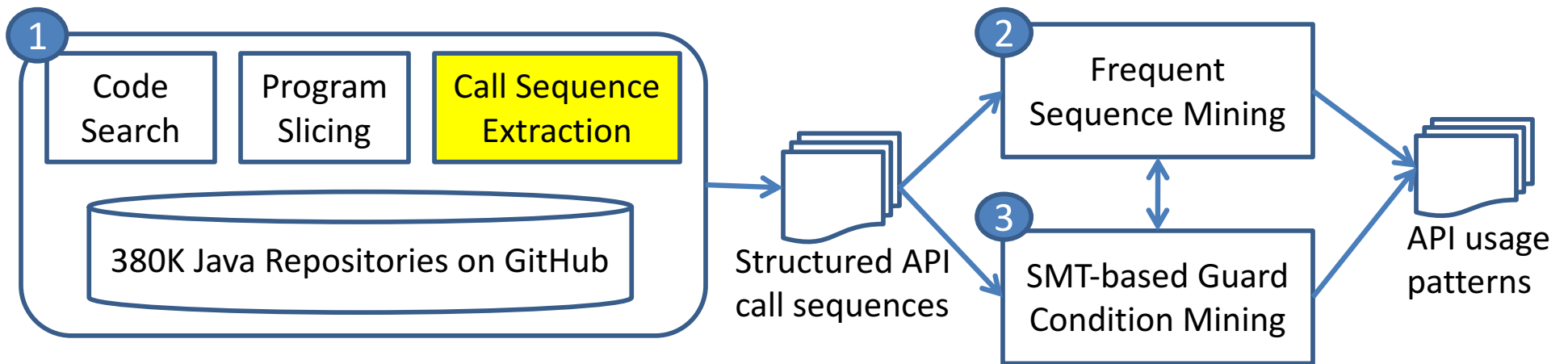
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new File (String); try {; new FileInputStream(File)@arg0.exists(); } catch (IOException) {; }
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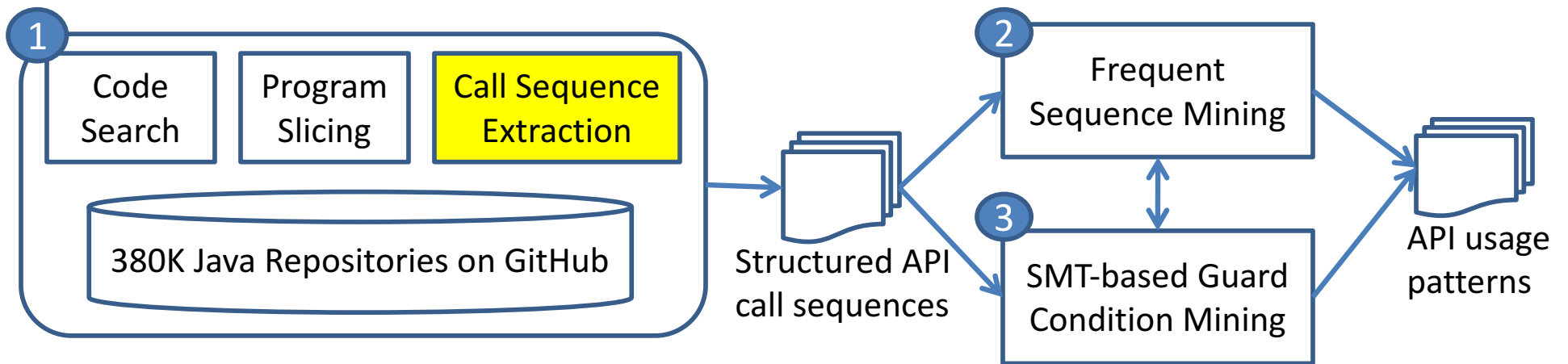
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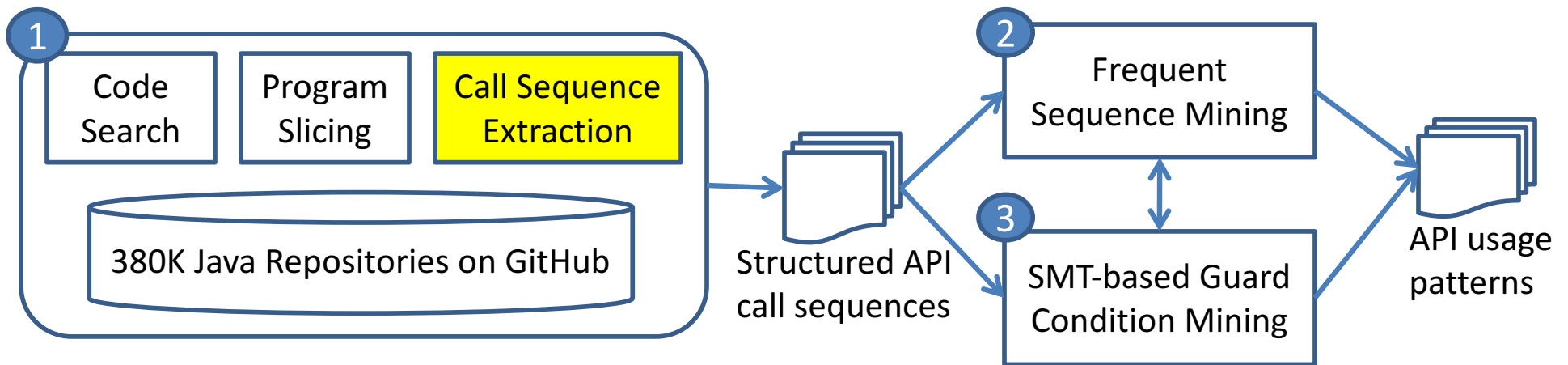
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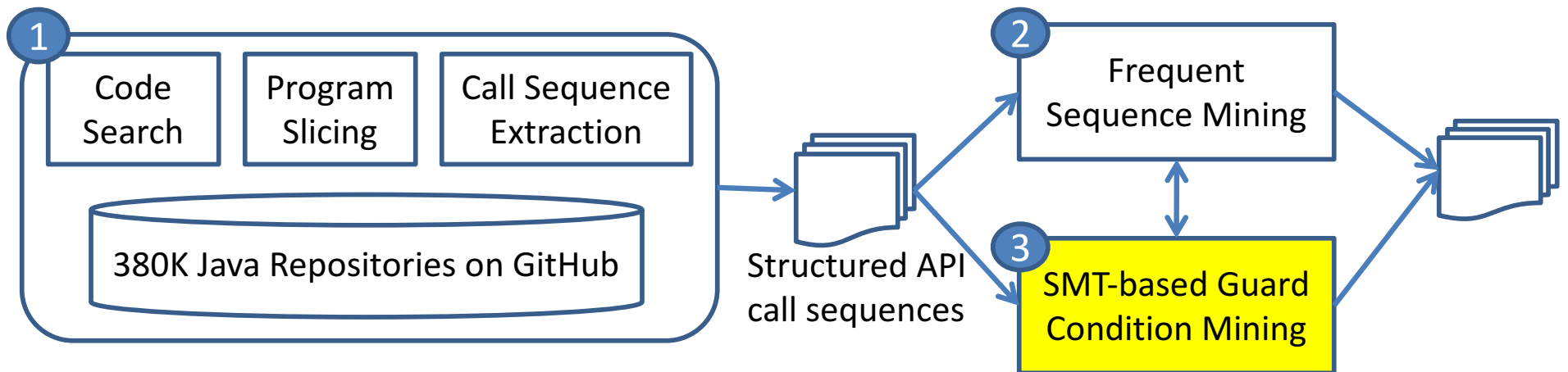
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Insight 4: Variations in Guard Conditions

- Guard conditions are canonicalized and grouped based on logical equivalence.

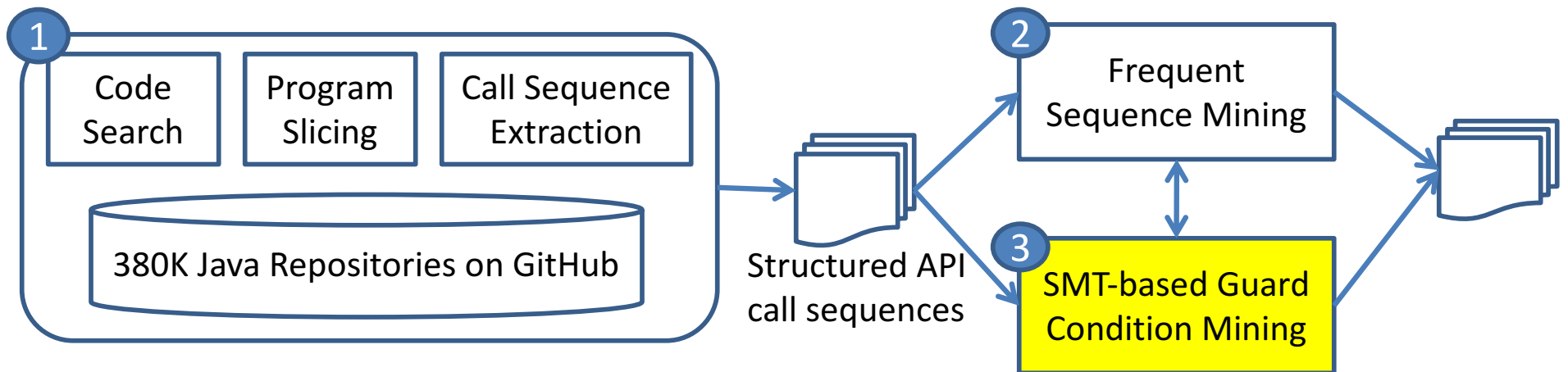


Two equivalent guard conditions for `String.substring`:

`arg0 >= 0 && arg0 <= rcv.length()` \Leftrightarrow `arg0 > -1 && arg0 < rcv.length() + 1`

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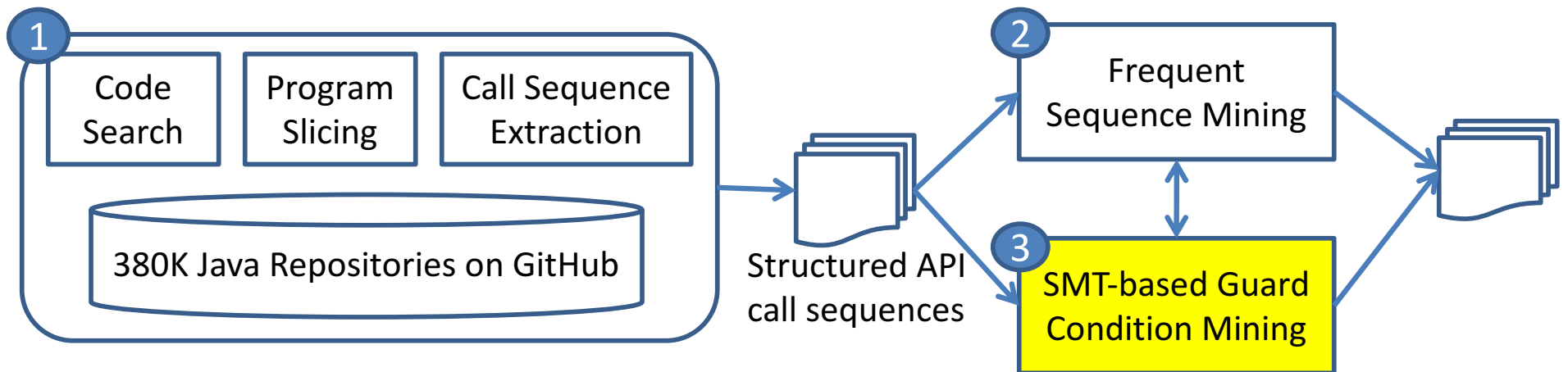


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Two equivalent guard conditions for `String.substring`:

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Insight 4: Variations in Guard Conditions

- We use Z3 to prove the logic equivalence of guard conditions.

```
if (start>=0 && start<=s.length()) {  
    s.substring(start);  
}
```

→ p : arg0>=0 && arg0<=rcv.length()

```
if (i>-1 && i<log.length()+1) {  
    log.substring(i);  
}
```

→ q : arg0>-1 && arg0<rcv.length()+1

- $p \Leftrightarrow q$ is valid iff. $\neg((\neg p \vee q) \wedge (p \vee \neg q))$ is UNSAT.

Outline

- Problem Statement
- API usage mining from 380K Java Projects on GitHub
- An Empirical Study of API Misuse on Stack Overflow

Data Set: API Usage Patterns

- We learn 245 API usage patterns of 100 Java API methods.
- We manually inspect these patterns.
- 180 patterns can be confirmed by online documentation.

API method	Pattern
ArrayList.list	loop {; get(int)@arg0<rcv.size(); }
Scanner.nextLine	loop {; nextLine()@rcv.hasNextLine(); }
SQLiteDatabase.query	query(...)@true; close()@true
TypedArray.getString	getString(int)@true; recycle()@true
FileChannel.write	try {; write(ByteBuffer)@true; }; catch(IOException) {; }

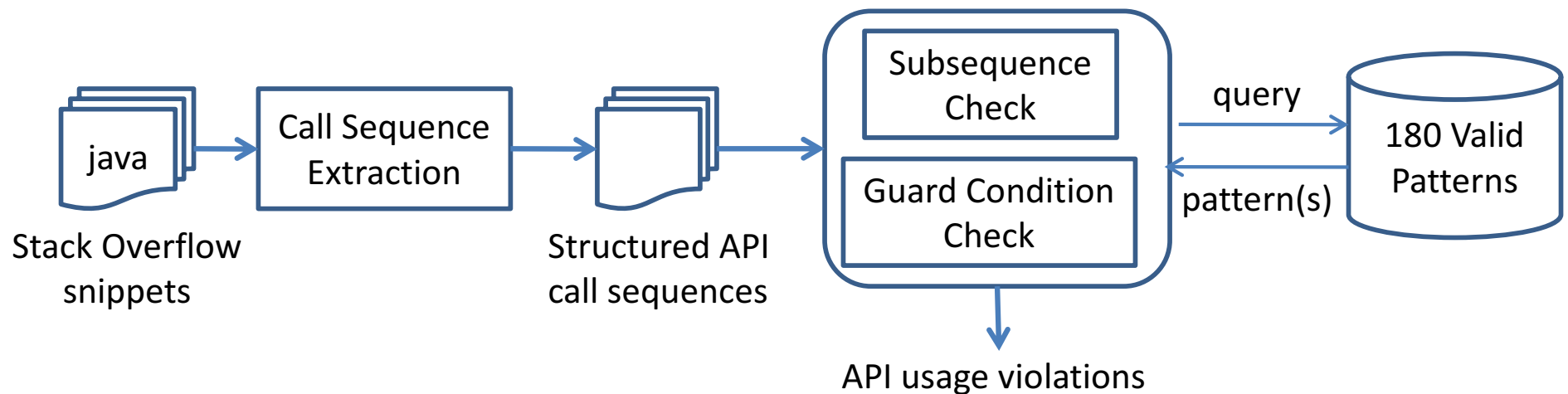
Data Set: SO Posts

- We extract code snippets in the markdown `<code>` from the SO posts with the Java tag.
- We parse and analyze these snippets using a partial program parsing and type resolution technique, JavaBaker.
- We find 217,818 SO posts with code snippets that use the 100 Java API methods in our study scope.

Siddharth Subramanian, Laura Inozemtseva, and Reid Holmes. Live API Documentation. ICSE 2014.

Method of API Misuse Detection

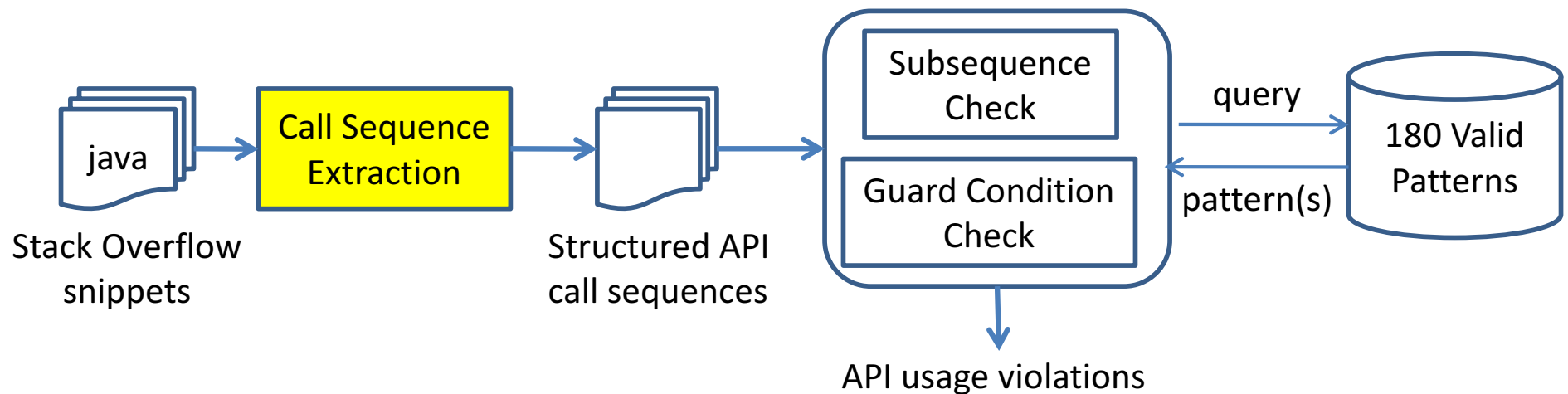
- We examine 220K SO posts with 180 confirmed patterns.



Dataset: <http://web.cs.ucla.edu/~tianyi.zhang/examplecheck.html>

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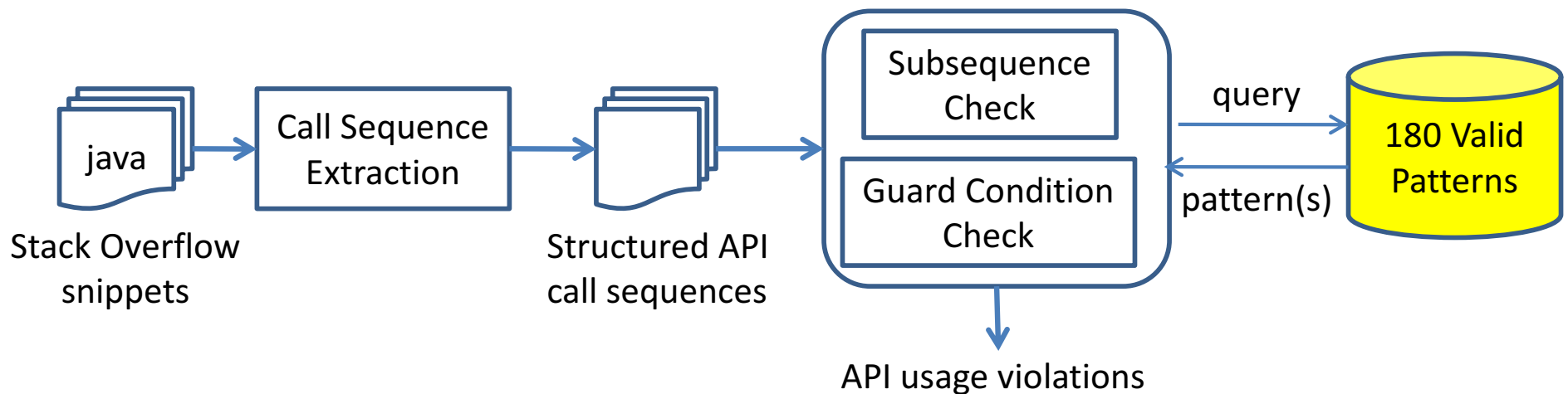
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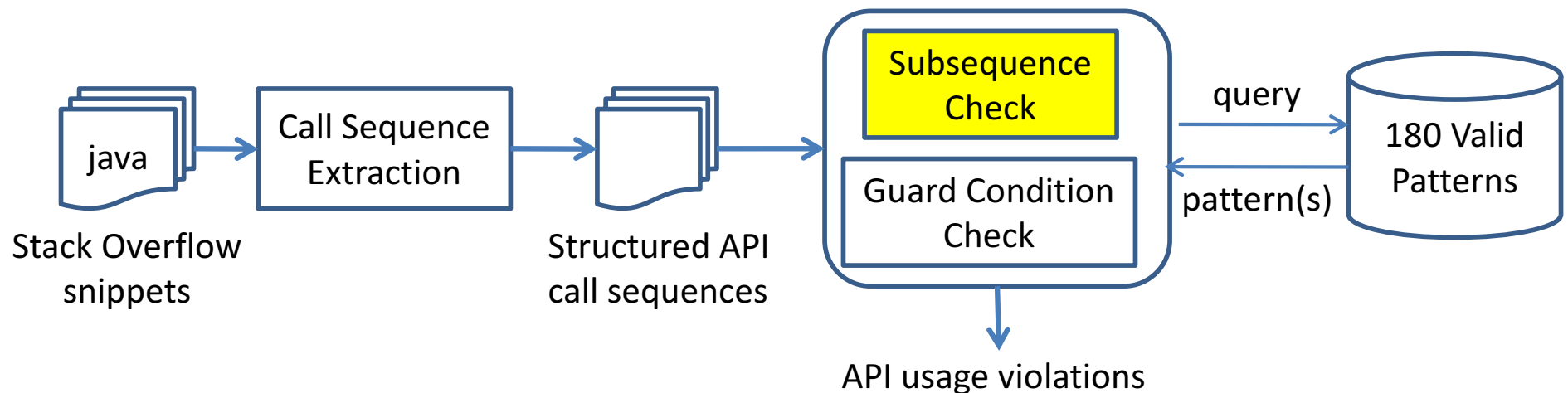
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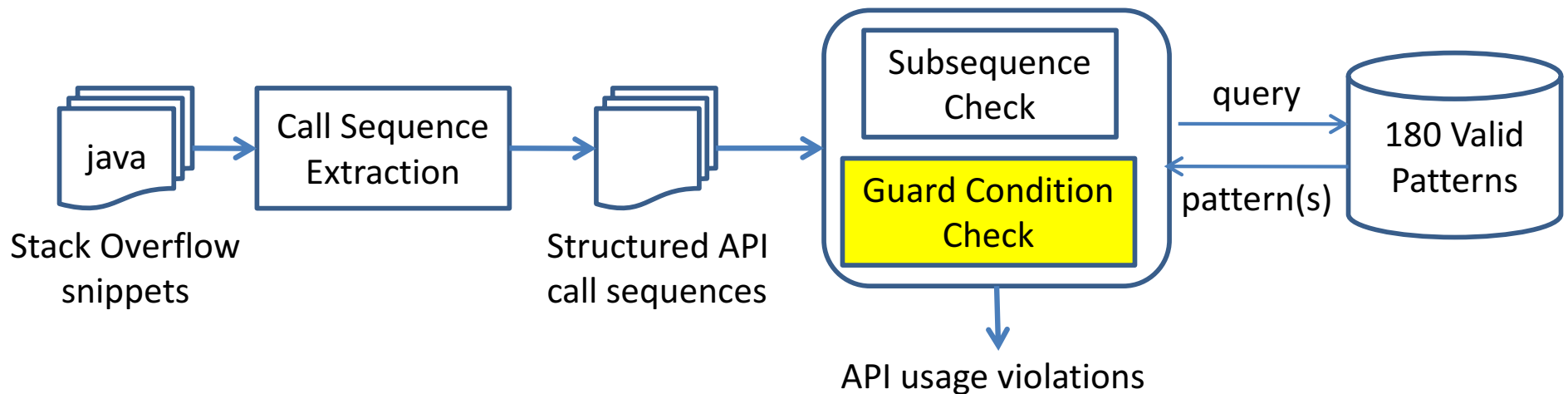
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RQ1. Is API Misuse Prevalent on Stack Overflow?

- 31% of SO posts contain API usage violations.
- Two authors independently inspected 400 SO posts with reported API usage violations.
- 289 posts (72%) can negatively impact on production code.

```
public ArrayList get_user_by_id(String id) {
    ArrayList listUserInfo = new ArrayList();
    SQLiteDatabase db = this.getReadableDatabase();
    Cursor cursor = db.query(...);
    if (cursor != null) {
        while (cursor.moveToNext()) {
            UserInfo userInfo = new UserInfo();
            userInfo.setAppId(cursor.getString(cursor.getColumnIndex(
COLUMN_APP_ID)));
            // HERE YOU CAN MULTIPLE RECORD AND ADD TO LIST 11
            listUserInfo.add(userInfo);
        }
    }
    return listUserInfo;
}
```




A code example of getting data from SQLite database in Android [Post ID 31531250]

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A Cursor object is created but never released.

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A code example of getting data from SQLite database in Android [Post ID 31531250]

RQ1. Is API Misuse Prevalent on Stack Overflow?

- Many SO snippets use hardcoded input for illustration.
- They may crash with real-world input data.

```
String text = "<img src=\"mysrc\" width=\"128\" height=\"92\"  
border=\"0\" alt=\"alt\" /><p><strong>";  
text = text.substring(text.indexOf("src=\""));  
text = text.substring("src=\"".length());  
text = text.substring(0, text.indexOf("\""));  
System.out.println(text);
```

A code example of extracting the src field from a html string [Post ID 12742734]

RQ1. Is API Misuse Prevalent on Stack Overflow?

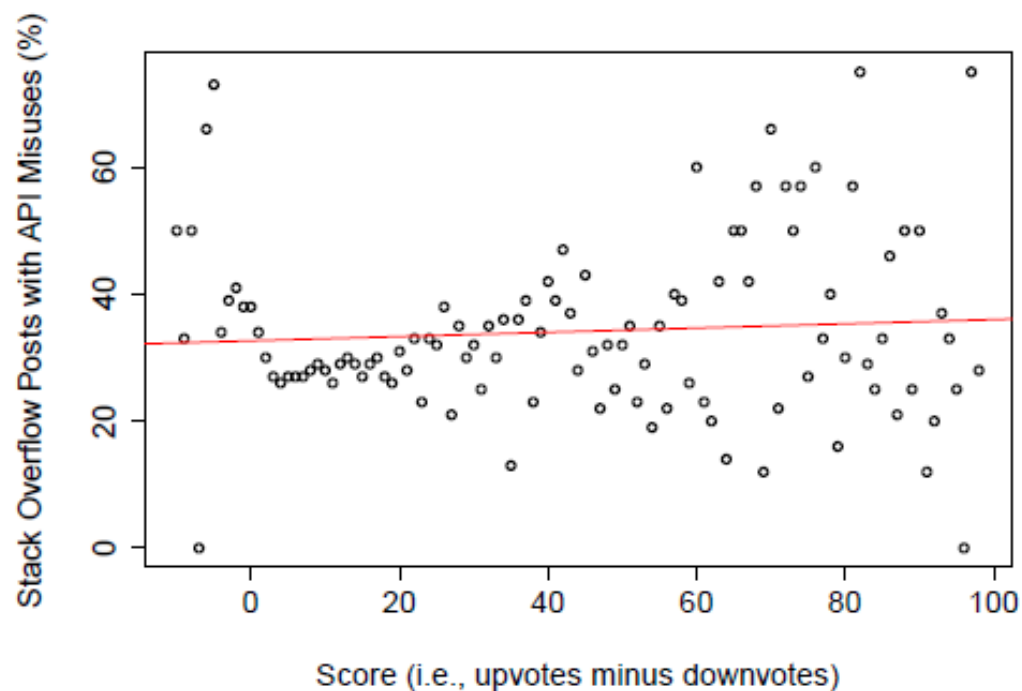
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A code example of extracting the src field from a html string [Post ID 12742734]

RQ2. Are highly voted posts more reliable?

- Highly-voted posts are not necessarily more reliable in terms of correct API usage.



RQ3. What are characteristics of API misuse?

- API misuse is caused by three main reasons---*missing control structures, missing or incorrect order of API calls, and incorrect guard conditions.*

```
Cursor emails = db.query(Email.CONTENT_URI,...);  
while (emails.moveToNext()) {  
    String email = emails.getString(..);  
}  
emails.close();
```

Missing finally block [Post ID 31427468]

RQ3. What are characteristics of API misuse?

- API misuse is caused by three main reasons---***missing control structures***, *missing or incorrect order of API calls*, and *incorrect guard conditions*.

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Cursor emails = db.query(Email.CONTENT_URI,...);  
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Missing finally block [Post ID 31427468]

RQ3. What are characteristics of API misuse?

- API misuse is caused by three main reasons---*missing control structures*, ***missing or incorrect order of API calls***, and *incorrect guard conditions*.

```
ByteBuffer bb = ByteBuffer.allocate(4);  
bb.put(newArgb);  
int i = bb.getInt();
```

Missing an API call, `bb.flip()` [Post ID 12100651]

RQ3. What are characteristics of API misuse?

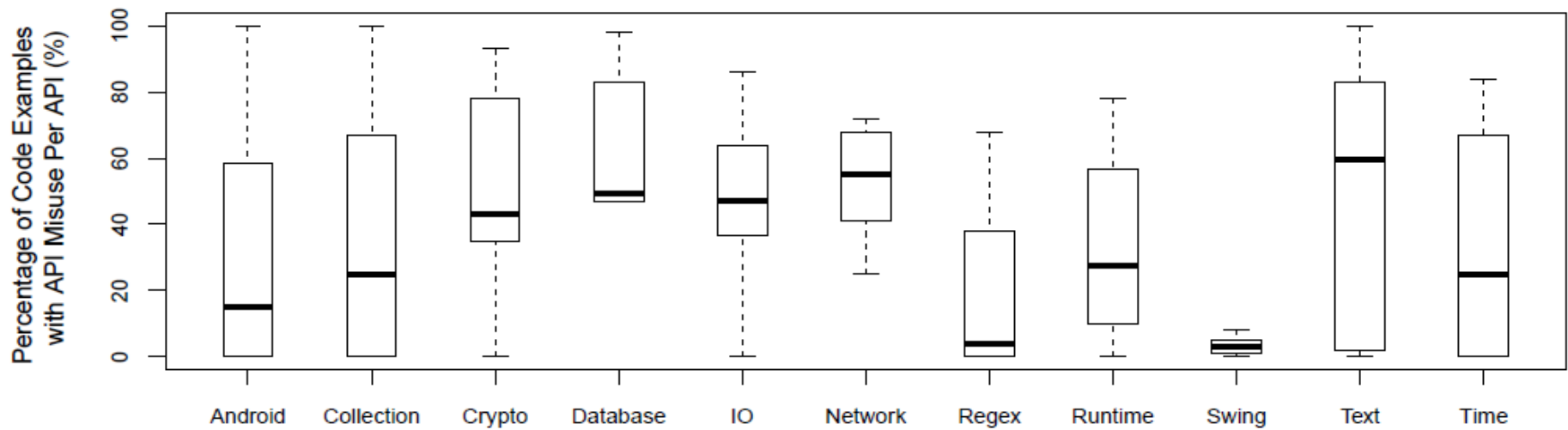
- API misuse is caused by three main reasons---*missing control structures, missing or incorrect order of API calls, and **incorrect guard conditions.***

```
TreeMap map = new TreeMap();  
//OR SortedMap map = new  
//TreeMap();  
map.firstKey();
```

Incorrect guard condition, `!map.isEmpty()` [Post ID 21983867]

RQ3. What are characteristics of API misuse?

- Network, database, IO, crypto, string manipulation APIs are more likely to be misused.



ExampleCheck: Checking API Misuse in Stack Overflow using Patterns Mined from GitHub

The screenshot shows a Stack Overflow post with a code snippet and a Chrome extension pop-up window. The code snippet is as follows:

```
JsonObject rootobj = root.getAsJsonObject();  
JsonElement match_number = rootobj.get("match  
JsonObject alliances = rootobj.getAsJsonObjec  
JsonElement blue = alliances.getAsJsonObject  
JsonElement red = alliances.getAsJsonObject  
  
System.out.println(match_number.getAsString
```

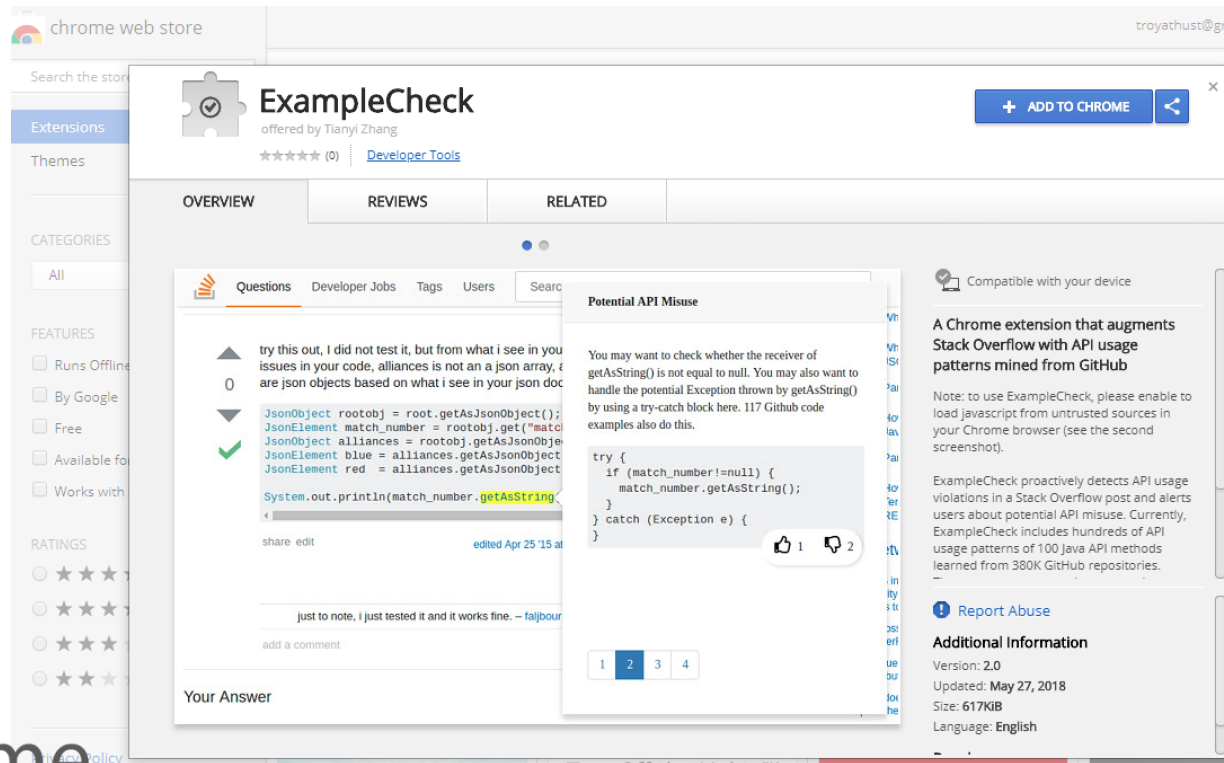
The pop-up window contains the following information:

- ① Pop-up window
- Potential API Misuse
- ② API misuse description: You may want to check whether the receiver of `getAsString` is not null. 119 Github code examples also do this.
- ③ Fix suggestion:

```
if (match_number!=null) {  
    match_number.getAsString();  
}
```
- See this in a GitHub example:
- ④ Supporting GitHub examples: Example 1, Example 2, Example 3
- ⑤ Pagination for multiple misuses: 1, 2, 3, 4
- ⑥ Like or dislike this reported misuse: 22 likes, 1 dislike



ExampleCheck: Checking API Misuse in Stack Overflow using Patterns Mined from GitHub



<https://chrome.google.com/webstore/detail/examplecheck/amliempbckaiklimcpopomlnklkieo>

Example: Visualizing API Usage Examples at Scale [CHI 2018]

- Example visualizes API usage features in hundreds of code examples along with their statistical distribution in histograms.



Tool: <http://example.cs.ucla.edu:3000/>

Our Contributions

- An API usage mining technique that extracts patterns from over 380K GitHub projects
- A large-scale empirical study of API misuse in 220K SO posts
- A Chrome extension that augments Stack Overflow with API usage patterns mined from GitHub