

Analyzing and Supporting Adaptations of Online Code Examples

Tianyi Zhang,¹ Di Yang,² Crista Lopes,² Miryung Kim¹

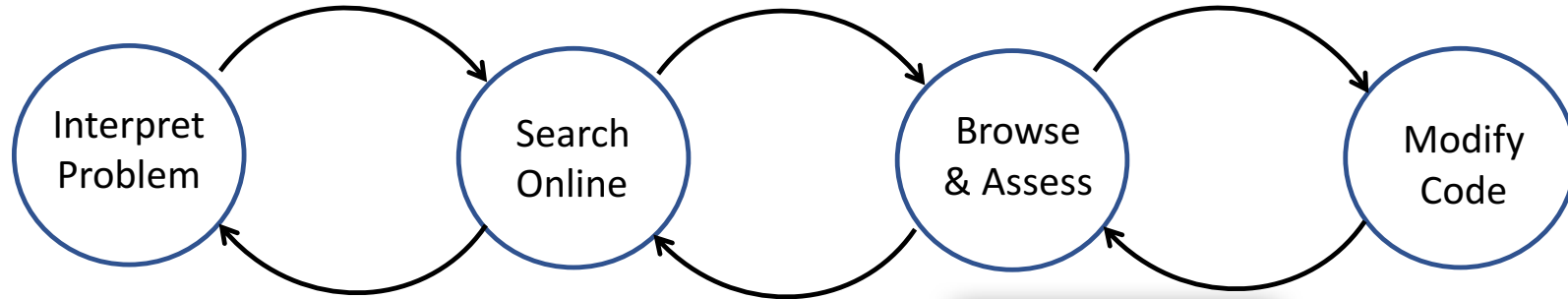
¹University of California, Los Angeles

²University of California, Irvine

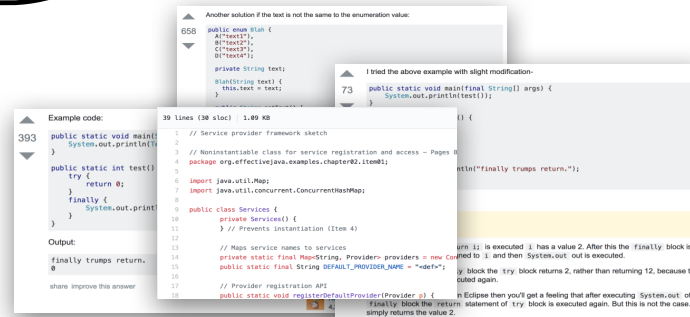
Dataset and Tool: <https://github.com/tianyi-zhang/ExampleStack-ICSE-Artifact>

* Both the first author and the second author contributed significantly.

Modern Programming Workflow

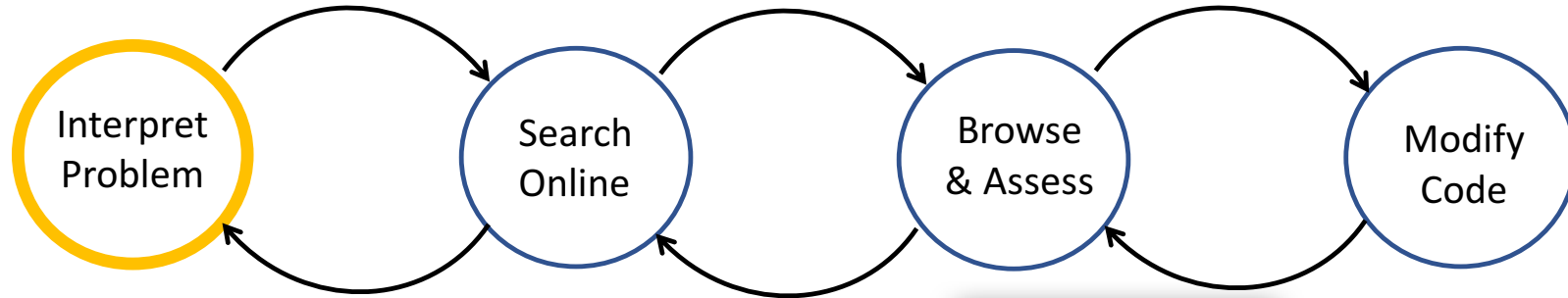


“how to connect to MySQL in Java?”

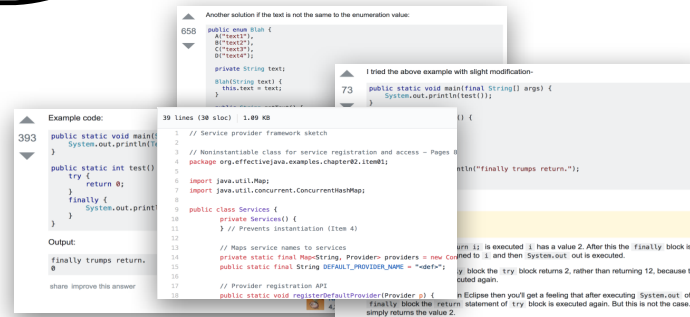


Brandt *et al.* Two studies of opportunistic programming: interleaving web foraging, learning, and writing code. 2009.₂

Modern Programming Workflow

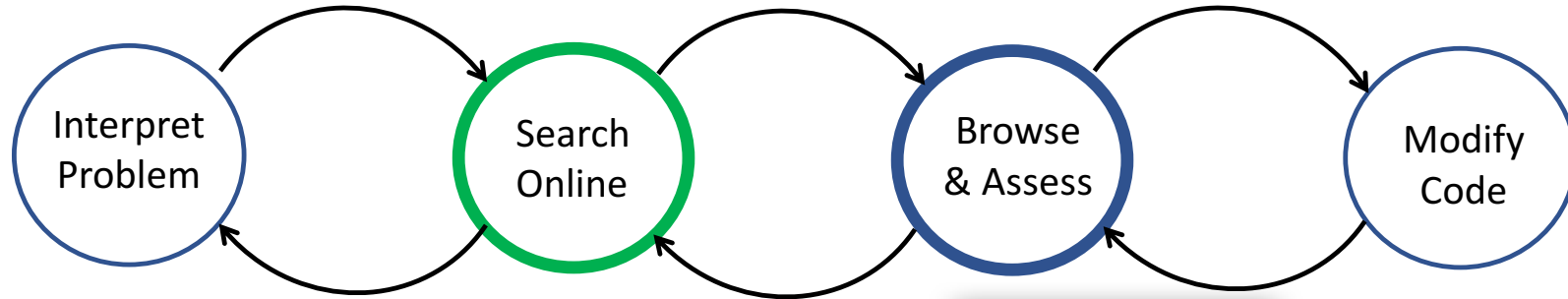


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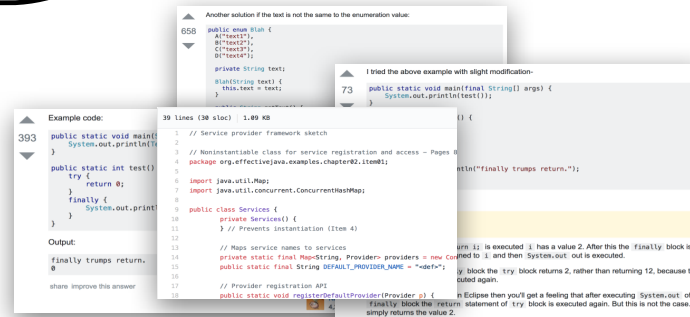


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Modern Programming Workflow

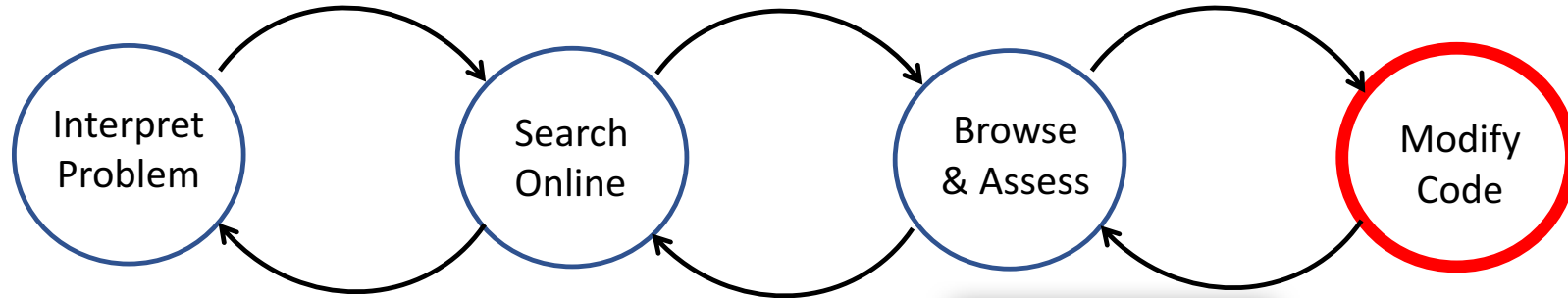


“how to connect to MySQL in Java?”



Brandt *et al.* Two studies of opportunistic programming: interleaving web foraging, learning, and writing code. 2009.

Modern Programming Workflow



“how to connect to MySQL in Java?”



```
Example code:
393 public static void main()
    System.out.println("
public static int test()
    try {
        return 0;
    } finally {
        System.out.print
    }
}

Output:
finally trumps return.
0
share improve this answer

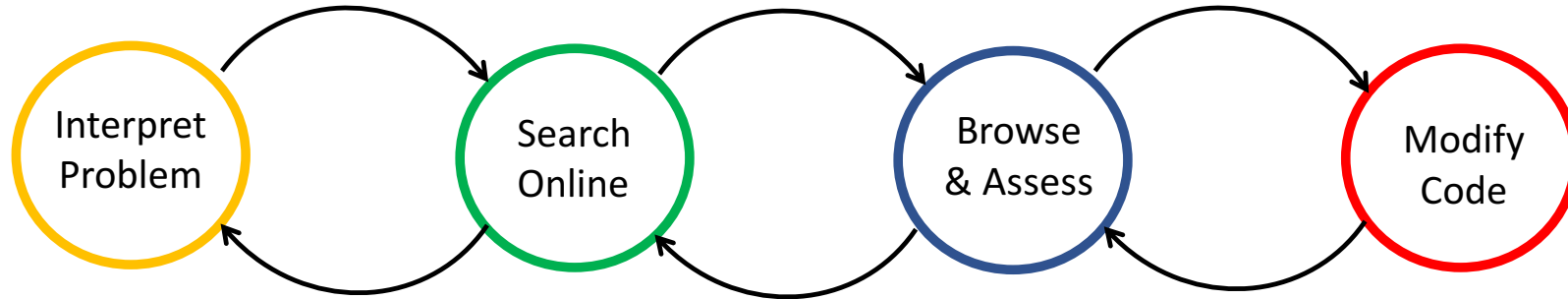
Another solution if the text is not the same to the enumeration value:
658 public enum Blah {
    A("text?");
    C("text?");
    D("text?");
    private String text;
    Blah(String text) {
        this.text = text;
    }
}

I tried the above example with slight modification:
73 public static void main(String[] args) {
    System.out.println(text());
}

// Service provider framework sketch
1 // Noninstantiable class for service registration and access - Pages 8
2 package org.effectivejava.examples.chapter02.item01;
3 import java.util.Map;
4 import java.util.concurrent.ConcurrentHashMap;
5 public class Services {
6     private Services() {
7         // Prevents instantiation (Item 4)
8     }
9     // Maps service names to services
10    private static final Map<String, Provider> providers = new
11    public static final String DEFAULT_PROVIDER_NAME = "default";
12    // Provider registration API
13    public static void registerDefaultProvider(Provider p) {
14        // Finally block the return statement of 'try' block is executed again. But this is not the case. It
15        simply returns the value 2.
16    }
17 }
```

Brandt *et al.* Two studies of opportunistic programming: interleaving web foraging, learning, and writing code. 2009₅

Modern Programming Workflow



Test cases [CodeGenie]
I/O types [ParseWeb, Hunter]
I/O examples [Stolee et al., 2014, FlashFill]
Multimodal [Reiss, 2009]
...

StrathCona [Homles and Murphy, 2005]
Sourcerer [Bajracharya et al., 2006]
Exemplar [McMillan et al., 2012]
FaCoy [Kim et al., 2018]
...

Prompter [Ponzanelli et al., 2014]
AnswerBot [Xu et al., 2017]
Deprecation Watchter [Zhou et al., 2017]
ExampleCheck [Zhang et al., 2018]
Examplore [Glassman et al., 2018]
...



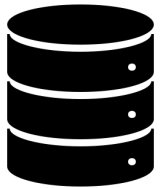
What we have known so far ...

- Online Code Reuse Behavior
 - Copy and paste with adaptations [Wu *et al.*, 2018]
 - Seldom attribute to the sources of online code [Baltes and Diehl, 2018]
- Code Adaptation & Integration Support
 - Rename variables and port relevant program statements [SnipMatch, Jigsaw]

What we don't know yet...

- RQ1. What kinds of adaptations do developers make in practice?
- RQ2. Are these adaptations done repetitively?
- RQ3. How can we provide effective tool support?

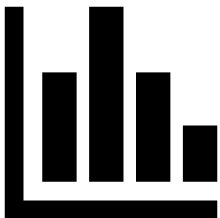
Outline



1. A Comprehensive Dataset



2. Qualitative Analysis

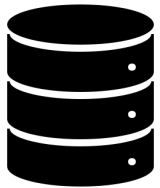


3. Quantitative Analysis



4. Tool Design & User Study

Outline



1. A Comprehensive Dataset



2. Qualitative Analysis



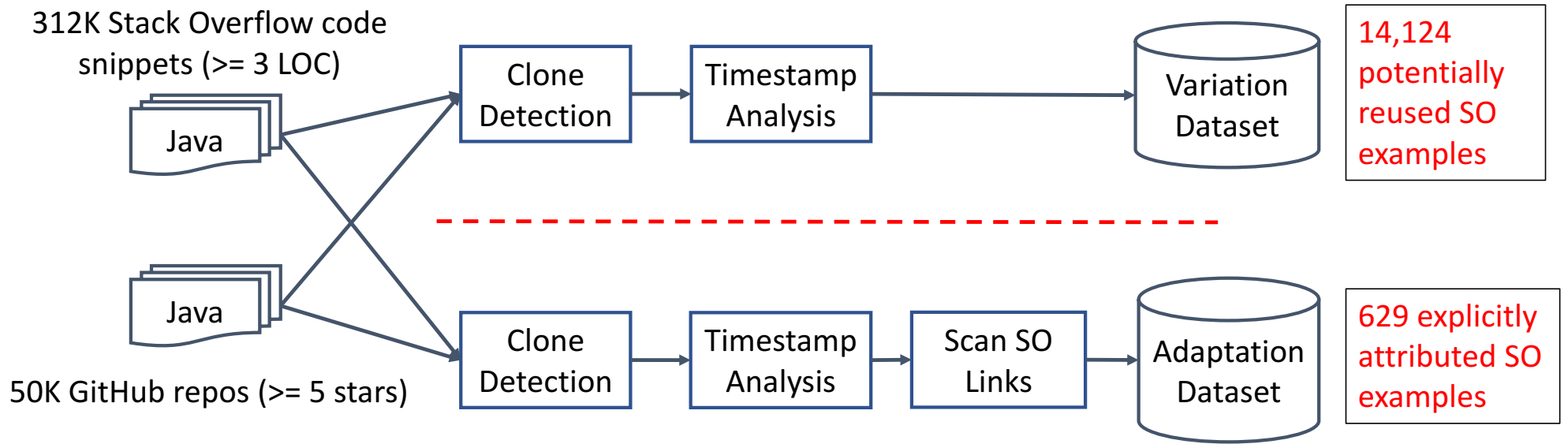
3. Quantitative Analysis



4. Tool Design & User Study

Identify Reused Stack Overflow Examples

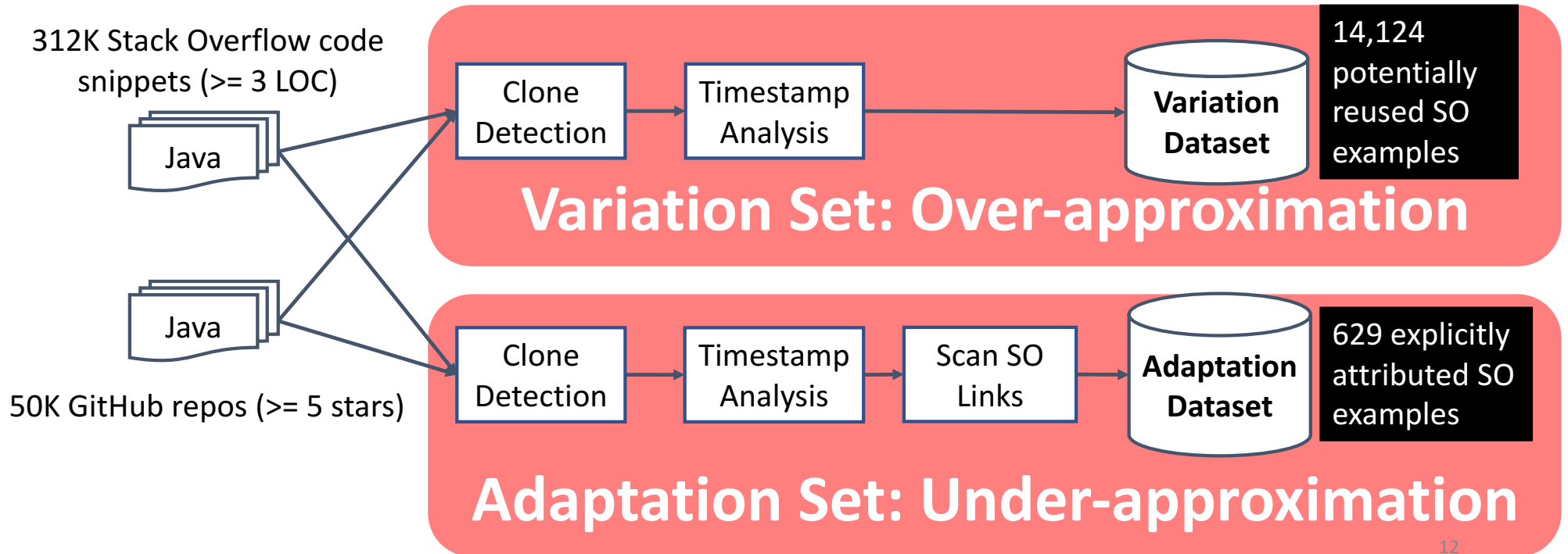
- **Challenge:** the lack of attribution [Baltes and Diehl, 2018]



Sajnani et al. SourcererCC: Scaling Code Clone Detection to Big Code. 2016

Identify Reused Stack Overflow Examples

- **Challenge:** the lack of attribution [Baltes and Diehl, 2018]



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Qualitative Analysis

- Randomly sample 200 pairs of clones from each dataset
- Manually inspect their differences using GumTree [Falleri *et al.*, 2014]
- Label program changes with short descriptions and group similar ones.

so-37273871-0-1.java

```
public class foo {
public String getJSONFromAssets() {
    String json = null;
    try {
        InputStream inputData = getAssets().open("locations.json");
        int size = inputData.available();
        byte[] buffer = new byte[size];
        inputData.read(buffer);
        inputData.close();
        json = new String(buffer, "UTF-8");
    } catch (IOException ex) {
        ex.printStackTrace();
        return null;
    }
    return json;
}
```

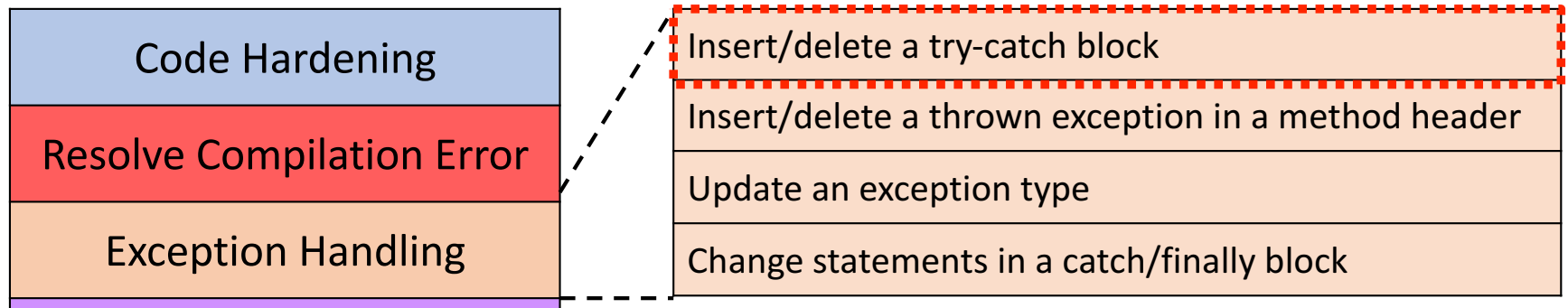
carved-gh-0-1-517-531.java

```
public class foo{
    public String loadJSONFromAsset(String jsonFileName) {
        String json = null;
        try {
            InputStream is = getAssets().open(jsonFileName);
            int size = is.available();
            byte[] buffer = new byte[size];
            is.read(buffer);
            is.close();
            json = new String(buffer, "UTF-8");
        } catch (IOException ex) {
            ex.printStackTrace();
            return null;
        }
        return json;
    }
}
```

24 Frequent Adaptation Types in 6 Categories

Code Hardening
Resolve Compilation Error
Exception Handling
Logic Customization
Refactoring
Miscellaneous

24 Frequent Adaptation Types in 6 Categories



so-15409446-1-2.java

```
public class foo {
    public static void addLibraryPath(String pathToAdd) throws Exception {
        final Field usrPathsField = ClassLoader.class.getDeclaredField("usr_paths");
        usrPathsField.setAccessible(true);

        //add the new path
        final String[] newPaths = Arrays.copyOf(paths, paths.length + 1);
        newPaths[newPaths.length-1] = pathToAdd;
        usrPathsField.set(null, newPaths);
    }
}
```

carved-gh-3-1-131-153.java

```
public class foo{
    private static void addLibraryPath(String pathToAdd) {
        try {
            final Field usrPathsField = ClassLoader.class.getDeclaredField(
                "usr_paths");
            usrPathsField.setAccessible(true);

            // add the new path
            final String[] newPaths = Arrays.copyOf(paths, paths.length + 1);
            newPaths[newPaths.length - 1] = pathToAdd;
            usrPathsField.set(null, newPaths);
        } catch (NoSuchFieldException | SecurityException | IllegalArgumentException e) {
            throw new RuntimeException(e);
        }
    }
}
```

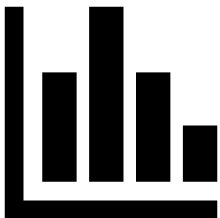

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Automated Rule-based Classification

- Codify each adaptation type as a logic rule
 - e.g., $\text{Insert}(t_1, t_2, i) \wedge \text{NodeType}(t_1, \text{TryStatement}) \Rightarrow \text{Insert_Try_Catch_Block}$
- 98% precision and 96% recall on another 100 clone pairs

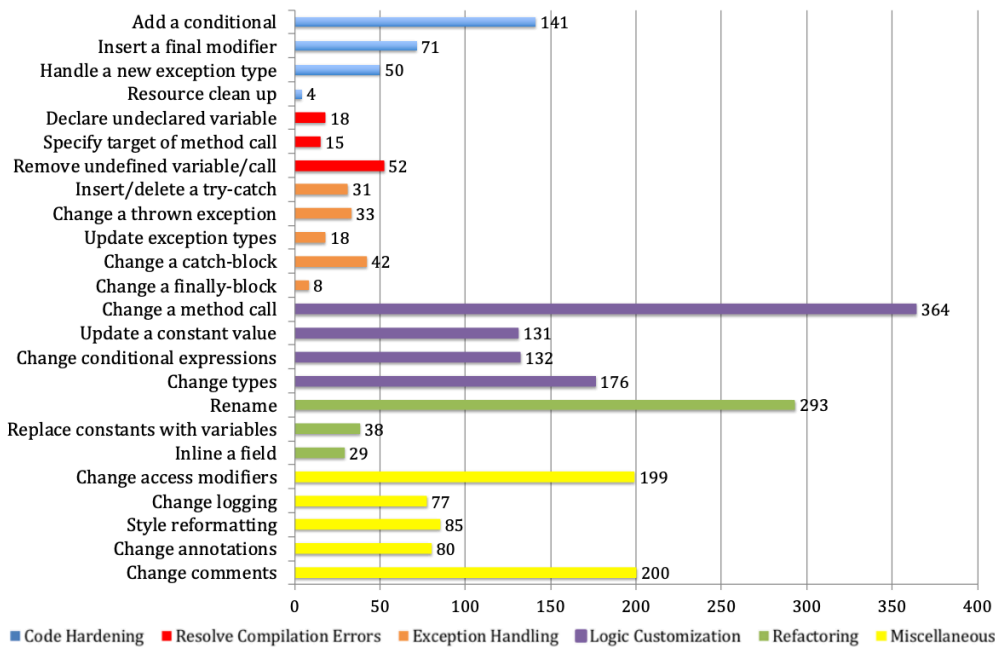
so-15409446-1-2.java

```
public class foo {  
    public static void addLibraryPath(String pathToAdd) throws Exception {  
        final Field usrPathsField = ClassLoader.class.getDeclaredField("usr_paths");  
        usrPathsField.setAccessible(true);  
  
        //add the new path  
        final String[] newPaths = Arrays.copyOf(paths, paths.length + 1);  
        newPaths[newPaths.length-1] = pathToAdd;  
        usrPathsField.set(null, newPaths);  
    }  
}
```

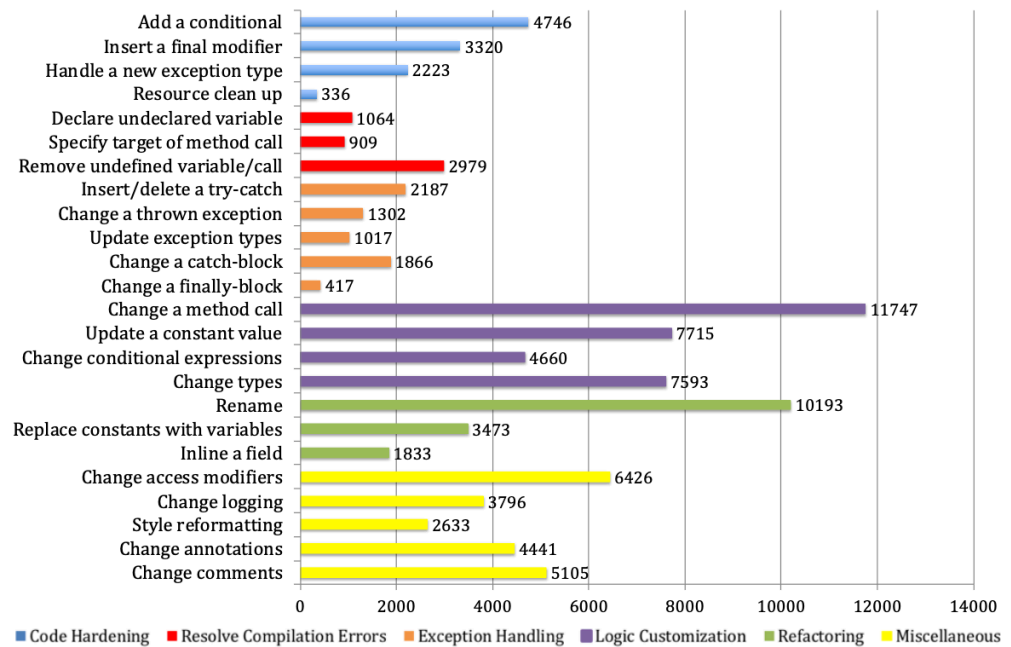
carved-gh-3-1-131-153.java

```
public class foo{  
    private static void addLibraryPath(String pathToAdd) {  
        try {  
            final Field usrPathsField = ClassLoader.class.getDeclaredField(  
                "usr_paths");  
            usrPathsField.setAccessible(true);  
  
            // add the new path  
            final String[] newPaths = Arrays.copyOf(paths, paths.length + 1);  
            newPaths[newPaths.length - 1] = pathToAdd;  
            usrPathsField.set(null, newPaths);  
        } catch (NoSuchFieldException | SecurityException | IllegalArgumentException |  
            IllegalAccessException e) {  
            throw new RuntimeException(e);  
        }  
    }  
}
```

Distribution of Common Adaptation Types

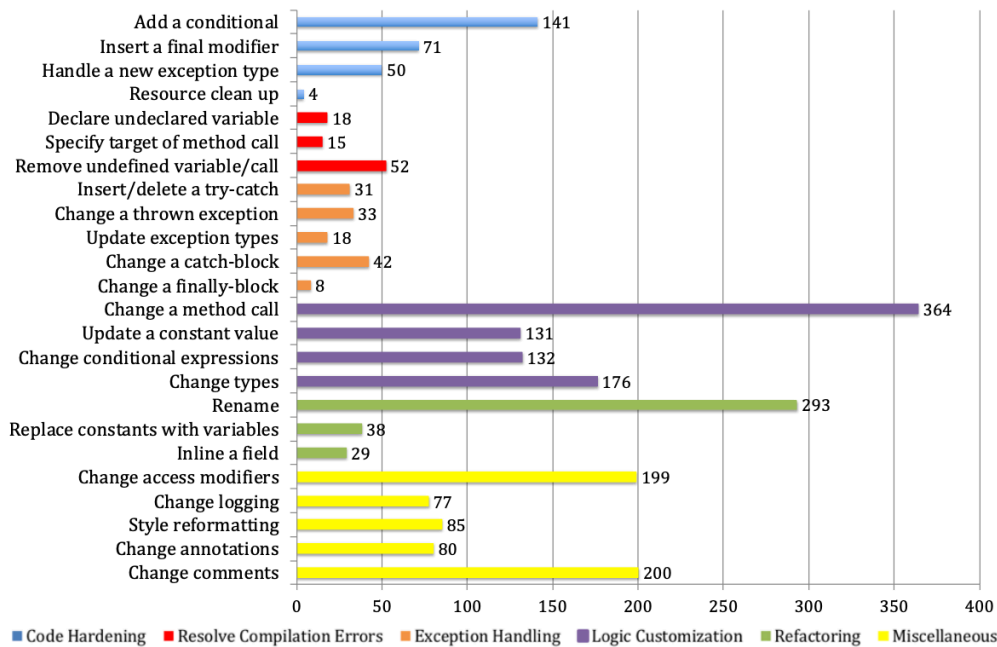


(a) Adaptations: 629 explicitly attributed SO examples

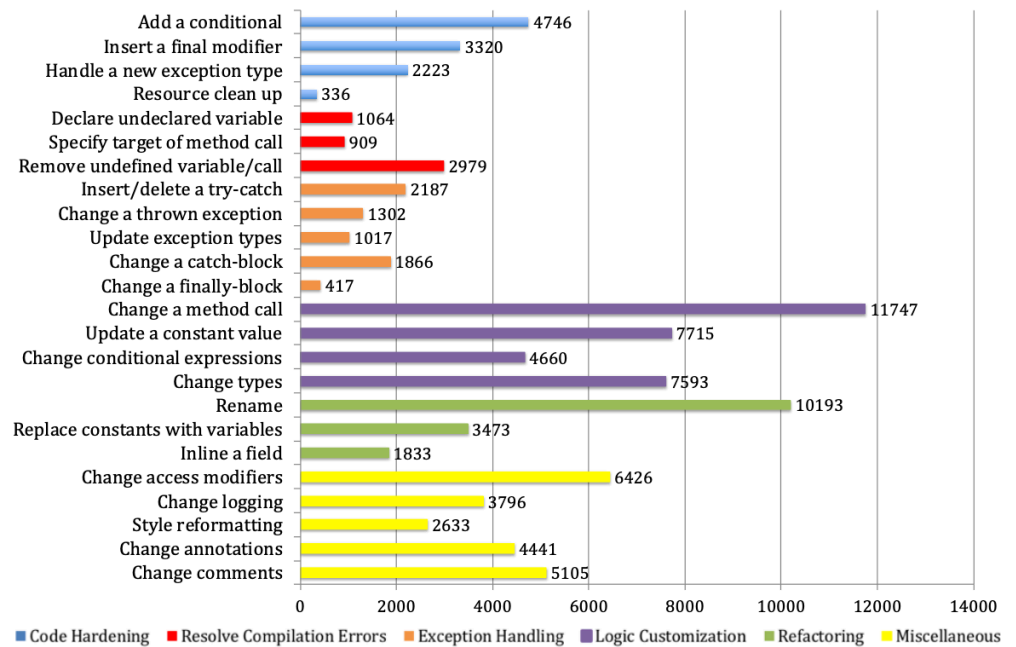


(b) Variations: 14,124 potentially reused SO examples

Finding 1. Variation patterns resemble adaptation patterns

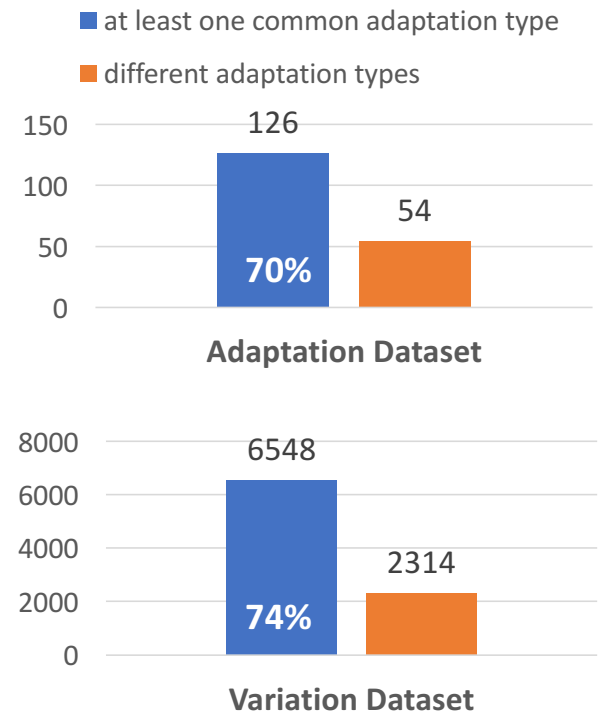
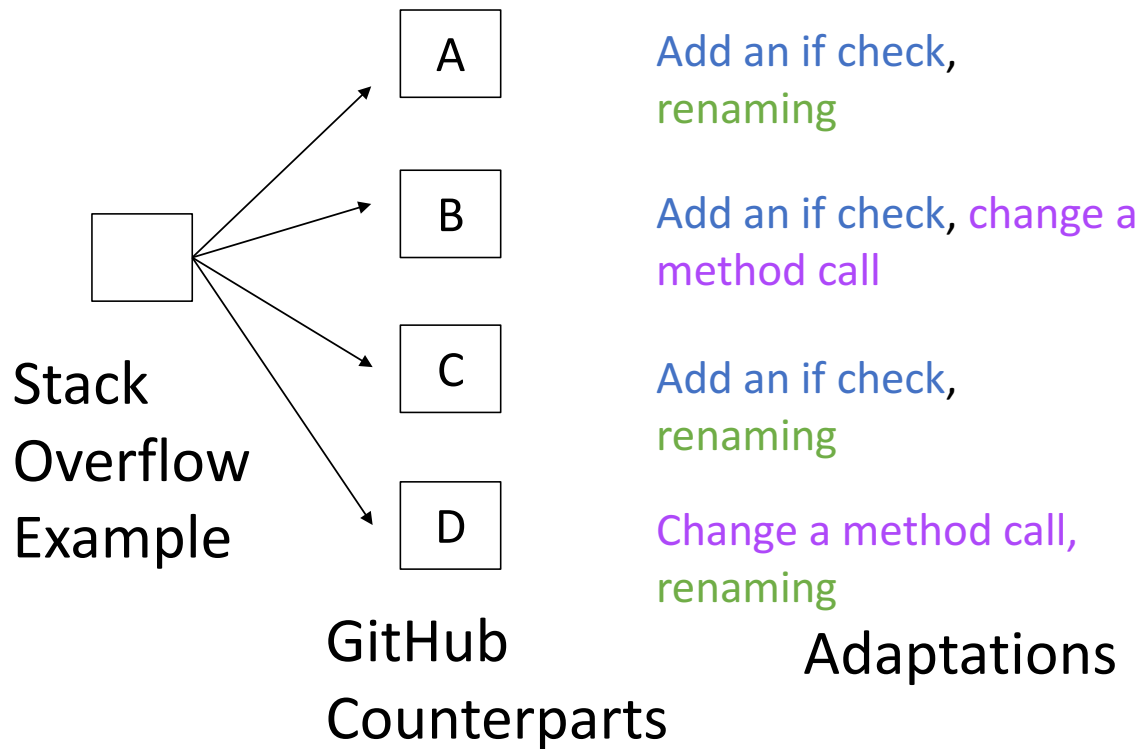


(a) Adaptations: 629 explicitly attributed SO examples



(b) Variations: 14,124 potentially reused SO examples

Finding 2. Different GitHub clones of the same example share common adaptation types.



Implications and Hypothesis Development

- **Implications**

- Variations in similar code resemble real adaptations made by developers
- Different GitHub developers make similar adaptations independently

- **Hypothesis:** Displaying variations in similar GitHub code can inspire more careful reasoning when adapting code

Outline



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4. Tool Design & User Study

“How to calculate the distance between two coordinates?”



Based on [another question on stackoverflow](#), I got this code.. This calculates the result in meters, not in miles :)

```
public static float distFrom(float lat1, float lng1, float lat2, float lng2) {  
    double earthRadius = 6371000; //meters  
    double dLat = Math.toRadians(lat2-lat1);  
    double dLng = Math.toRadians(lng2-lng1);  
    double a = Math.sin(dLat/2) * Math.sin(dLat/2) +  
               Math.cos(Math.toRadians(lat1)) * Math.cos(Math.toRadians(lat2)) *  
               Math.sin(dLng/2) * Math.sin(dLng/2);  
    double c = 2 * Math.atan2(Math.sqrt(a), Math.sqrt(1-a));  
    float dist = (float) (earthRadius * c);  
  
    return dist;  
}
```

share improve this answer

edited May 23 '17 at 12:10



Community ♦

1 • 1

answered May 8 '09 at 2:11



Espen Herseth
Halvorsen

3,962 • 7 • 29 • 38

“How to calculate the distance between two coordinates?”

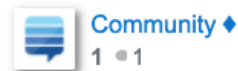
Based on [another question on stackoverflow](#), I got this code.. This calcul in miles :)

```
public static float distFrom(float lat1, float lng1, float
double earthRadius = 6371000; //meters
double dLat = Math.toRadians(lat2-lat1);
double dLng = Math.toRadians(lng2-lng1);
double a = Math.sin(dLat/2) * Math.sin(dLat/2) +
    Math.cos(Math.toRadians(lat1)) * Math.cos(Mat
    Math.sin(dLng/2) * Math.sin(dLng/2);
double c = 2 * Math.atan2(Math.sqrt(a), Math.sqrt(1-a));
float dist = (float) (earthRadius * c);

return dist;
}
```

share improve this answer

edited May 23 '17 at 12:10



```
public static float distFrom(double lat1, double lng1, double lat2, double lng2) {
double earthRadius = 3958.75;
double dLat = Math.toRadians(lat2 - lat1);
double dLng = Math.toRadians(lng2 - lng1);
double a = Math.sin(dLat / 2) * Math.sin(dLat / 2) + Math.cos(Math.toRadians
double c = 2 * Math.atan2(Math.sqrt(a), Math.sqrt(1 - a));
double dist = earthRadius * c;

int meterConversion = 1609;

return new Double(dist * meterConversion).floatValue();
}
```

```
public static int distFrom(float lat1, float lng1, float lat2, float lng2) {
double earthRadius = 6371; //kilometers
double dLat = Math.toRadians(lat2-lat1);
double dLng = Math.toRadians(lng2-lng1);
double a = Math.sin(dLat/2) * Math.sin(dLat/2) +
    Math.cos(Math.toRadians(lat1)) * Math.cos(Math.toRadians(lat2)) *
    Math.sin(dLng/2) * Math.sin(dLng/2);
double c = 2 * Math.atan2(Math.sqrt(a), Math.sqrt(1-a));

return Math.abs((int) (earthRadius * c));
}
```



chrome

wiki/Haversine_formula - dotjoe May 8 '09 at 1:55

ormula -- movable-type.co.uk/scripts/latlong-vincenty.html -- if you care about the Earth not quite being a sphere - mob Nov 10 '09 at 23:22

1 refer to this blog xebie.xebie.in/2010/10/28/working-with-geolocations - Robin Nov 1 '10 at 10:28

show 5 more comments

Answers

active oldest votes

Based on another question on stackoverflow, I got this code.. This calculates the result in meters, not in miles :)

177



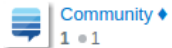
```
public static float distFrom(float lat1, float lng1, float lat2, float lng2) {
    double earthRadius = 6371000; //meters
    double dLat = Math.toRadians(lat2-lat1);
    double dLng = Math.toRadians(lng2-lng1);
    double a = Math.sin(dLat/2) * Math.sin(dLat/2) +
        Math.cos(Math.toRadians(lat1)) * Math.cos(Math.toRadians(lat2)) *
        Math.sin(dLng/2) * Math.sin(dLng/2);
    double c = 2 * Math.atan2(Math.sqrt(a), Math.sqrt(1-a));
    float dist = (float) (earthRadius * c);

    return dist;
}
```

share improve this answer

edited May 23 '17 at 12:10

answered May 8 '09 at 2:11



Espen Herseth Halvorsen 3,962 7 29 38

17 Why convert to Float and then back to float? - Steve Kuo May 8 '09 at 4:05

3 return (float) (dist * meterConversion) - mob Nov 10 '09 at 23:18

6 The earth radius is 3958.75 in miles not kilometers. So your code above returns miles. - swinefeaster Nov 12 '11 at 8:55

5 @swinefeaster: There's meterConversion constant in the second to last line which turns miles into meters. - Keith Ivin Nov 21 '11 at 2:30

Welcome to ExampleStack!

Code Template

Undo Selection Copy

```
public static double distFrom(double lat1, double lng1, double lat2,
    double lng2) {
    double earthRadius = 6371000; //meters
    double dLat = Math.toRadians(lat2-lat1);
    double dLng = Math.toRadians(lng2-lng1);
    double a = Math.sin(dLat/2) * Math.sin(dLat/2) +
        Math.cos(Math.toRadians(lat1)) * Math.cos(Math.toRadians(lat2)) *
        Math.sin(dLng/2) * Math.sin(dLng/2);
    double c = 2 * Math.atan2(Math.sqrt(a), Math.sqrt(1-a));
    double dist = (float) (earthRadius * c);

    return dist;
}
```

Adaptation Categories: Code Hardening Resolve Compilation Error Exception Handling Logic Customization Refactoring Miscellaneous

2 Similar GitHub Examples

GitHub link watch: 0 star: 0 fork: 0

```
public static float distFrom(double lat1, double lng1, double lat2, double lng2) {
    double earthRadius = 3958.75;
    double dLat = Math.toRadians(lat2 - lat1);
    double dLng = Math.toRadians(lng2 - lng1);
    double a = Math.sin(dLat / 2) * Math.sin(dLat / 2) + Math.cos(Math.toRadians(lat1)) * Math.cos(Math.toRadians(lat2)) * Math.sin(dLng / 2) * Math.sin(dLng / 2);
    double c = 2 * Math.atan2(Math.sqrt(a), Math.sqrt(1 - a));
    double dist = earthRadius * c;

    int meterConversion = 1609;

    return new Double(dist * meterConversion).floatValue();
}
```

26

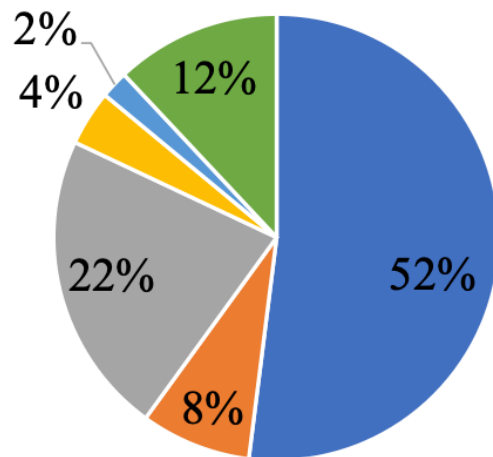
Within-Subjects User Study

- Sixteen students from UCLA Computer Science
- Two code reuse tasks
 - Control: view a code example and search online
 - Experiment: view similar code in GitHub using ExampleStack

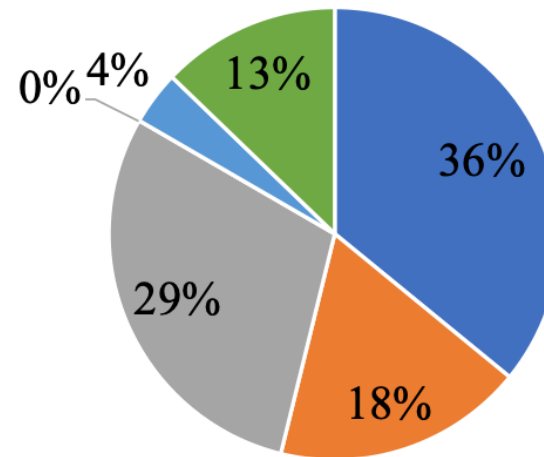
	Task Description	LOC	GitHub Clone#
Task I	compute the distance between two coordinates on earth	12	2
Task II	get the relative path of a given file and a root folder	74	2
Task III	encode an array of bytes to a hexadecimal string	12	17
Task IV	add animation to an Android view	29	4

Finding 1. Viewing variations in similar GitHub code inspires new adaptations that are otherwise overlooked.

■ refactoring ■ hardening ■ logic ■ exception handling ■ resolve compile error ■ misc



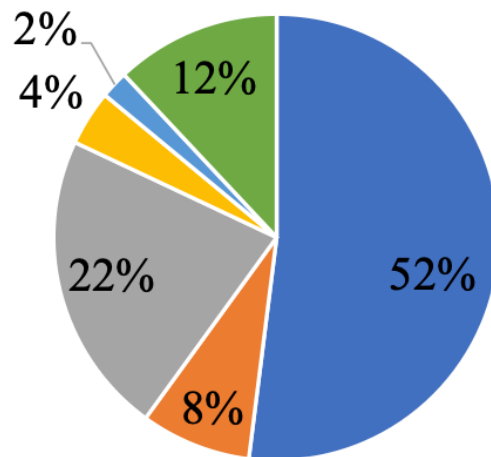
Without ExampleStack



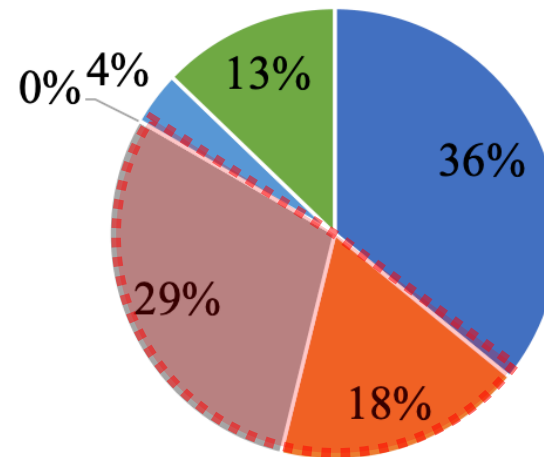
With ExampleStack

Finding 1. Viewing variations in similar GitHub code inspires new adaptations that are otherwise overlooked.

■ refactoring ■ hardening ■ logic ■ exception handling ■ resolve compile error ■ misc



Without ExampleStack



With ExampleStack

Finding 2. Seeing similar code is more useful than overwhelming.

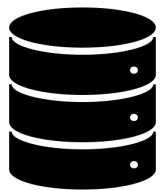
P5: “It **highlights the best practices followed by the community** and **prioritizes the changes** that I should make first”

P6: “Super nice, it seems like **the fast path to reach consensus** on a particular operation”

P9: “[It is] reassuring to know that the same code is used in production systems and to **know the common pitfalls**”

P14: “I would have completely **forgotten about the null check without seeing it in a couple of [GitHub] examples**”

Contributions



1. Make available a large-scale dataset of reused code between SO and GitHub.



2. Rigorously codify common adaptation patterns and create a taxonomy



3. Quantify the frequencies of common adaptations



4. Build a prototype and conduct a user study

Dataset and Tool: <https://github.com/tianyi-zhang/ExampleStack-ICSE-Artifact>