



# Applying Spectrum-Based Fault Localization to Android Applications

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#### Introduction

□ Testing one of the most used QA approach

- Debugging is another QA approach
  - Aiming to the localization and removal of faults
  - Manual debugging can be extremely challenging

- □ Fault localization techniques
  - Spectrum-Based Fault Localization (SBFL)

## Resources in mobile applications

- Platform configurations
  - Enabled/disabled resources
- Communication features
  - Wi-Fi, Bluetooth, etc
- □ Sensors
  - Accelerometer, Gyroscope, etc
- User-controlled options
  - Battery saver, Auto-rotate, etc



#### Goal

- Evaluate the use of SBFL in Android applications
  - Use faults seeded from mutation operators
  - Ochiai coefficient as an indicator of suspicious faulty code (Abreu et al. 2016)

- Verify the sensitivity of SBFL to resource interaction failures
  - Failures of the study of Marinho et al. 2023





# Background

### SBFL techniques

- □ Analysis of the program spectra (test coverage)
  - Statements, blocks, predicates, **methods**
- Produces a ranked list of elements in descending order of suspiciousness
- □ Ochiai is considered one of the best performance metrics
- Intuitively, the more a program element is executed by failing tests the more suspicious it is

## Example of Ochiai coefficient

Application: OSMTracker	t1	t2	t3	t4	t5	t6	t7	t8	t9	t10	Ochiai
class GPSLogger {											
(1) public void onCreate() {}	$\bullet$	ullet	ullet	$\bullet$	$\bullet$	ullet	ullet	$\bullet$	ullet	•	0.63
(2) public int onStartCommand(Intent intent, int flags, int startId) {}	ullet	ullet	ullet	$\bullet$	ullet	ullet	ullet		ullet	ullet	0.67
(3) public void onDestroy() {}	$\bullet$	$\bullet$	$\bullet$	$\bullet$	$\bullet$	ullet	ullet	ullet	ullet	•	0.63
(4) private void startTracking(long trackId) {}				$\bullet$	$\bullet$	$\bullet$			ullet	•	0.53
(5) private void stopTrackingAndSave() {}				$\bullet$	ullet	ullet			ullet	•	0.53
(6) public void onLocationChanged(Location location) {} /* FAULT */	$\bullet$		ullet	$\bullet$			ullet				1.00
(7) private Notification getNotification() {}	$\bullet$	$\bullet$	ullet	$\bullet$	$\bullet$	ullet	ullet		ullet	•	0.67
(8) private void createNotificationChannel() {}					$\bullet$	ullet					0.00
}											
Test case outcomes (pass=√, fail=X)	X	$\checkmark$	Х	Х	$\checkmark$	$\checkmark$	Х	$\checkmark$	$\checkmark$	$\checkmark$	

#### Resource interaction failures

- Applications with unexpected behaviors
  - Manifested in certain combinations of enabled/disabled resources
- □ Settings are tuples of pairs <resource, state>

Auto Rotate, !Wi-Fi, Battery\_Saver, Accelerometer, Bluetooth, Gyroscope, Camera, Light, Do\_Not\_Disturb, Magnetometer, !Location, Orientation, Mobile\_Data, Proximity

#### Previous studies on this subject

□ High number of input settings

- □ Marinho et al. (2021)
  - □ 8 resources (256 settings); 10 applications

- □ Marinho et al. (2023)
  - Sampling testing strategies (Random, One Enabled, One Disabled, Most Enabled Disabled, Pairwise)
  - □ 14 resources (> 16K settings); 20 applications





# Study Design

### **Research Questions**

RQ1: To what extent SBFL can be used for mobile applications?

RQ2: How different is the ranking coefficient for faults in resource related classes and faults in general classes?

RQ3: How sensitive is SBFL to variations in resource settings?

## Steps of the study



## 1. Application selection

Application	Description	Category	LOC	Test LOC	Test cases	Coverage (%)	<b>Execution</b> Time
AnkiDroid [3]	A flashcard-based study aid	Education	158,607	2,770	164	17	~15h00m
Ground [17]	A map-first data	Productivity	19,906	525	4	17	~3h40m
OpenScale [32]	A weight and body metrics tracker	Health, Fitness	27,781	1,451	14	33	~1h45m
OwnTracks [33]	A location tracker	Travel, Local	14,499	889	27	51	~4h15m
PocketHub [37]	An application for managing GitHub repositories	Productivity	29,001	1,663	107	13	~8h15m
Radio-Droid [39]	A radio streaming application	Music, Audio	22,815	1,735	23	28	$\sim$ 2h50m
Threema [44]	An instant message application	Communication	238,045	1,931	54	2	~8h10m
WordPress [53]	A content management application	Productivity	347,897	3,674	115	19	~1d3h
					508		~71h

#### 2. Mutants generation

- Mutants generation using the tool presented in the study of Diniz et al. (2021)
  - Four mutant operators (AOR, ROR, LCR, SBR)

- Resource-related classes identified analyzing the imported packages
  - Study of Oliveira et al. (2022)

#### Generated mutants

Application	Resource-Related Classes	General Classes
AnkiDroid	10	10
Ground	5	15
OpenScale	10	10
OwnTracks	10	10
PocketHub	10	10
Radio-Droid	10	10
Threema	0	20
WordPress	10	10

#### 3. Test suite extension

- □ Same strategy of Marinho et al. (2023)
  - OwnTracks, PocketHub, Threema
- Instrumented code aiming to control 14 common resources

Auto rotate	Wi-Fi			
Battery saver	Accelerometer			
Buetooth	Gyroscope			
Camera	Light			
Do not disturb	Magnetometer			
Location Orientation				
Mobile data	Proximity			
Software Engineering Lab (LabSoft)				

#### 4. Test execution

- Test suites executed in a real device with code coverage enabled
  - Each test need to be executed separately

Experimental effort ranging from 1h45m
(OpenScale) to 1d3h (WordPress)

#### 5. Coefficient calculation

Test reports (test results and test coverage)
were parsed to get needed information

Ochiai calculated at the method-level





## Results

## RQ1 – Use of SBFL for mobile apps

Application	DM	MS	Ranking of Mutants				
			Rank <= 10	<b>Rank &gt; 10</b>	Total		
Threema	18	0.90	18(100%)	0(0%)	18(100%)		
PocketHub	9	0.45	9(100%)	0(0%)	9(100%)		
OpenScale	7	0.35	7(100%)	0(0%)	7(100%)		
Ground	1	0.05	1(100%)	0(0%)	1(100%)		
Radio-Droid	4	0.20	2(50%)	1(25%)	3(75%)		
AnkiDroid	20	1.00	6(30%)	4(20%)	10(50%)		
WordPress	12	0.60	4(34%)	1(8%)	5(42%)		
OwnTracks	8	0.40	3(37%)	0(0%)	3(37%)		

\* DM = Dead mutants

\* MS = Mutation score

# RQ2 – Ochiai for two groups of classes

Coefficients of Group1 (Resource-related classes) and Group2 (General classes)



#### Normality test



#### Nonparametric test

- □ Mann-Whitney U test
  - H0: Groups 1 and 2 are from the same population
  - H1: Groups 1 and 2 are not from the same population

- $\Box$  5% confidence interval (p-value = 0.99)
  - Does not allow the rejection of the null hypothesis
  - There is no evidence of a difference between the groups

RQ3 – Sensitivity to variations in resources settings

- □ Three applications with failures in three executions
  - Settings associated to this kind of failure
  - Same failure set

Application	Settings id	Difference of the rank
OwnTracks	$S_A, S_B, S_C$	$S_{A}-S_{C}$ (70%), $S_{B}-S_{C}$ (70%), $S_{A}-S_{B}$ (0%)
PocketHub	$S_A, S_B, S_C$	$S_{A}-S_{B}$ (0%), $S_{A}-S_{C}$ (0%), $S_{B}-S_{C}$ (0%)
Threema	$S_A, S_B, S_C$	$S_{A}-S_{B}$ (98%), $S_{A}-S_{C}$ (28%), $S_{B}-S_{C}$ (28%)





## Conclusion

#### Conclusion

- SBFL was able to rank more than 75% of fault code in 5 out of 8 applications
- For the same failure (mutant), ranking depends on the combination of enabled resources
- □ Future studies





## Questions?