



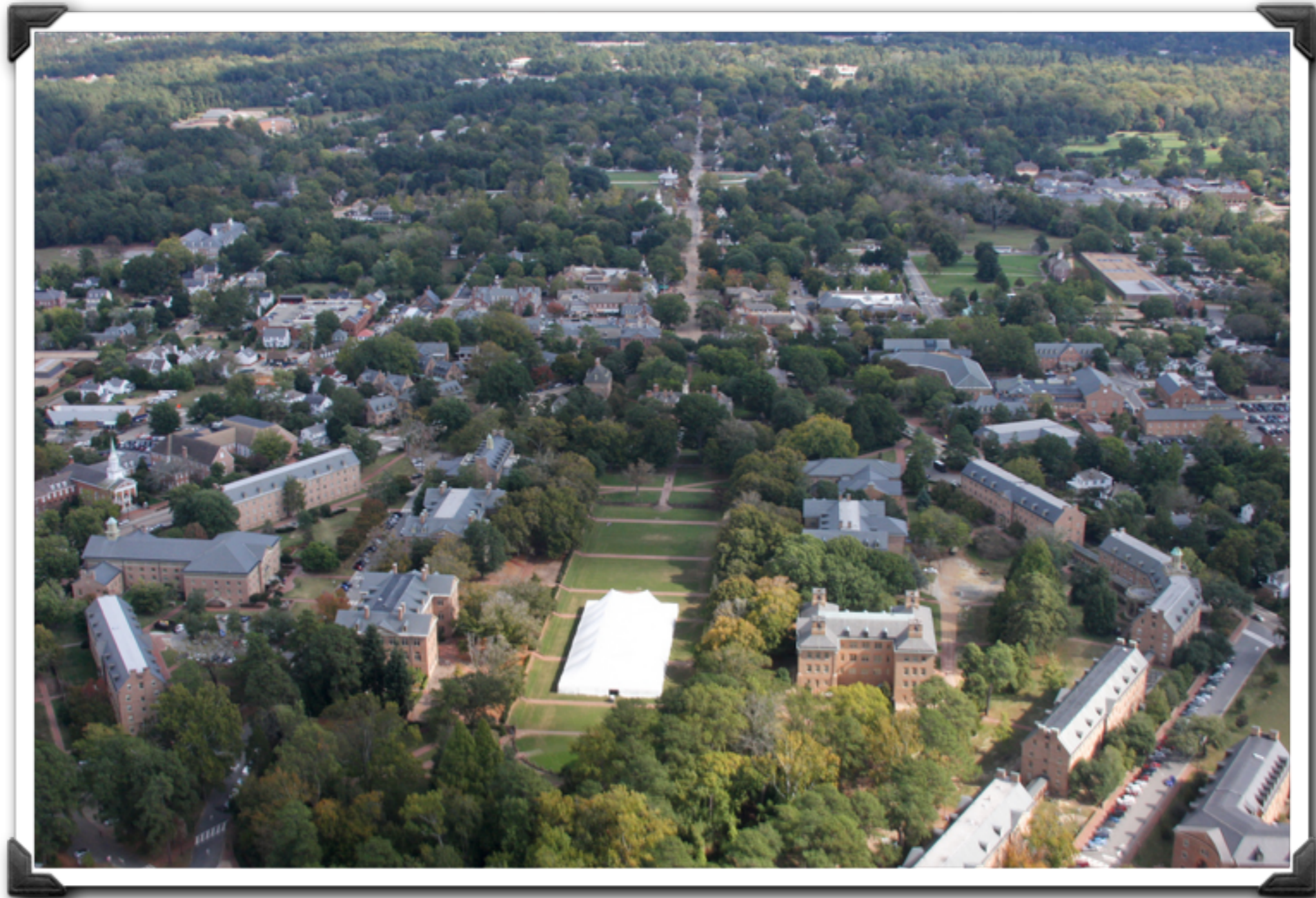
# **On the Impact of API Change- and Fault-proneness on the User Ratings of Android Apps**

**Denys Poshyvanyk**

**Software Engineering Maintenance  
and Evolution Research Unit - SEMERU**

**WILLIAM  
& MARY**

WILLIAM  
& MARY





- **Chartered on February 8, 1693, by King William III and Queen Mary II of England**
- **The second oldest college in America**
- **One of the 8 “Public Ivy”**





# Research at the SEMERU lab



**Factors impacting  
apps' success**

**Software reuse**

**Detecting similar  
Android apps**

**Energy consumption**

**Mining Android  
Software  
Repositories**

**Crowdsource-based  
requirements**

**GUI - based testing**

**Automatic generation  
of crash reports**

**Supporting evolution  
and maintenance of  
Android apps**

## API Change and Fault Proneness: A Threat to the Success of Android Apps

Mario Linares-Vásquez<sup>1</sup>, Gabriele Bavota<sup>2</sup>, Carlos Bernal-Cárdenas<sup>3</sup>  
Massimiliano Di Penta<sup>2</sup>, Rocco Oliveto<sup>4</sup>, Denys Poshyvanyk<sup>1</sup>

<sup>1</sup>The College of William and Mary, Williamsburg, VA, USA

<sup>2</sup>University of Sannio, Benevento, Italy

<sup>3</sup>Universidad Nacional de Colombia, Bogotá, Colombia

<sup>4</sup>University of Molise, Pesche (IS), Italy

mlinarev@cs.wm.edu, gbavota@unisannio.it, cebernalc@unal.edu.co,  
dipenta@unisannio.it, rocco.oliveto@unimol.it, denys@cs.wm.edu

FSE 2013

## An Exploratory Analysis of Mobile Development Issues using Stack Overflow

Mario Linares-Vásquez, Bogdan Dit, Denys Poshyvanyk

Computer Science Department

The College of William and Mary

Williamsburg, VA, USA

{mlinarev, bdit, denys}@cs.wm.edu

MISR 2013

## How Do API Changes Trigger Stack Overflow Discussions? A Study on the Android SDK

Mario Linares-Vásquez<sup>1</sup>, Gabriele Bavota<sup>2</sup>, Massimiliano Di Penta<sup>2</sup>, Rocco Oliveto<sup>2</sup>,  
Denys Poshyvanyk<sup>1</sup>

<sup>1</sup>The College of William and Mary, Williamsburg, VA, USA      <sup>2</sup>University of Sannio, Benevento, Italy  
<sup>3</sup>University of Molise, Pesche (IS), Italy  
mlinarev@cs.wm.edu, gbavota@unisannio.it, dipenta@unisannio.it,  
rocco.oliveto@unimol.it, denys@cs.wm.edu

ICPC 2014

## Revisiting Android Reuse Studies in the Context of Code Obfuscation and Library Usages

Mario Linares-Vásquez<sup>1</sup>, Andrew Holtzhauer<sup>1</sup>, Carlos Bernal-Cárdenas<sup>2</sup>, Denys Poshyvanyk<sup>1</sup>

<sup>1</sup>The College of William and Mary, Williamsburg, VA, USA  
<sup>2</sup>Universidad Nacional de Colombia, Bogotá, Colombia  
mlinarev@cs.wm.edu, asholtzhauer@cs.wm.edu, cebernalc@unal.edu.co, denys@cs.wm.edu

MSR 2014



## Mining Energy-Greedy API Usage Patterns in Android Apps: An Empirical Study

Mario Linares-Vásquez<sup>1</sup>, Gabriele Bavota<sup>2</sup>, Carlos Bernal-Cárdenas<sup>3</sup>  
Rocco Oliveto<sup>4</sup>, Massimiliano Di Penta<sup>2</sup>, Denys Poshyvanyk<sup>1</sup>

<sup>1</sup>The College of William and Mary, Williamsburg, VA, USA      <sup>2</sup>University of Sannio, Benevento, Italy  
<sup>3</sup>Universidad Nacional de Colombia, Bogotá, Colombia      <sup>4</sup>University of Molise, Pesche (IS), Italy  
mlinarev@cs.wm.edu, gbavota@unisannio.it, cebernalc@unal.edu.co,  
rocco.oliveto@unimol.it, dipenta@unisannio.it, denys@cs.wm.edu

MSR 2014

## On the Impact of API Change- and Fault-Proneness on the User Ratings of Android Apps

Gabriele Bavota, Mario Linares-Vásquez, Carlos Bernal-Cárdenas,  
Massimiliano Di Penta, Rocco Oliveto, Denys Poshyvanyk

TSE 2015  
minor revision

# The App Economy



# **Android Markets**

**1.3 Million+ apps (Google Play)**

**Several unofficial and fake markets**

**Thousands of open source apps (GitHub, Google Code, etc)**

# Tremendous success ...

2012: average monthly revenue of  
over **\$4,800** (iOs), **\$3,700**  
(BlackBerry), **\$3,300** (Android)

2013: global app economy was  
worth **\$68 billion** and projected  
to **\$143 billion** (2016)

2014: around **50 billion**  
downloads (Google Play)



**Revenue models**

**Tremendous  
SUCCESS ...**



**Customer loyalty**

**Low cost of  
handsets**

**Apps are built using  
APIs... and....**

**THERE ARE SOME  
ISSUES RELATED  
TO APIS**

**Breaking changes**

**Instability**

**Bugs**

**Backward compatibility**

# Among 1513 bug reports:

# 562 API usability issues

## Useful, but usable? Factors Affecting the Usability of APIs

Minhaz F. Zibran

Farjana Z. Eishita

Chanchal K. Roy

Department of Computer Science, University of Saskatchewan, Saskatoon, SK, Canada S7N 5C9  
Email: {minhaz.zibran, farjana.eishita, chanchal.roy}@usask.ca

Abstract—Software development today has been largely de-  
pendent on the use of API libraries, frameworks, and reusable  
code. However, API usability issues often increase the  
development time and lower code quality. In  
this paper, we present a different bug

to take into account the API usability issues. Therefore, API  
designers and developers need a good understanding on API  
usability and apply it in the design and development phases,  
so that they can minimize the maintenance difficulties caused  
by the usability issues associated with such APIs.  
There are many different API usability attributes observed  
by researchers and practitioners, though no one  
has provided a comprehensive list of 22



# Among 1513 bug reports:

# 175 API

# correctness

## Useful, but usable? Factors Affecting the Usability of APIs

Minhaz F. Zibran

Farjana Z. Eishita

Chanchal K. Roy

Department of Computer Science, University of Saskatchewan, Saskatoon, SK, Canada S7N 5C9  
Email: {minhaz.zibran, farjana.eishita, chanchal.roy}@usask.ca

Abstract—Software development today has been largely de-  
the use of API libraries, frameworks, and reusable  
API usability issues often increase the  
and lower code quality. In  
different bug

to take into account the API usability issues. Therefore, API  
designers and developers need a good understanding on API  
usability and apply it in the design and development phases,  
so that they can minimize the maintenance difficulties caused  
by the usability issues associated with such APIs.  
There are many different API usability attributes observed  
by researchers and practitioners, though no one  
[18], until Zibran [21], the  
comprehensive list of 22

**17 releases in 4 years  
(2008-2012)**

**3,269**

**classes**

**192262**

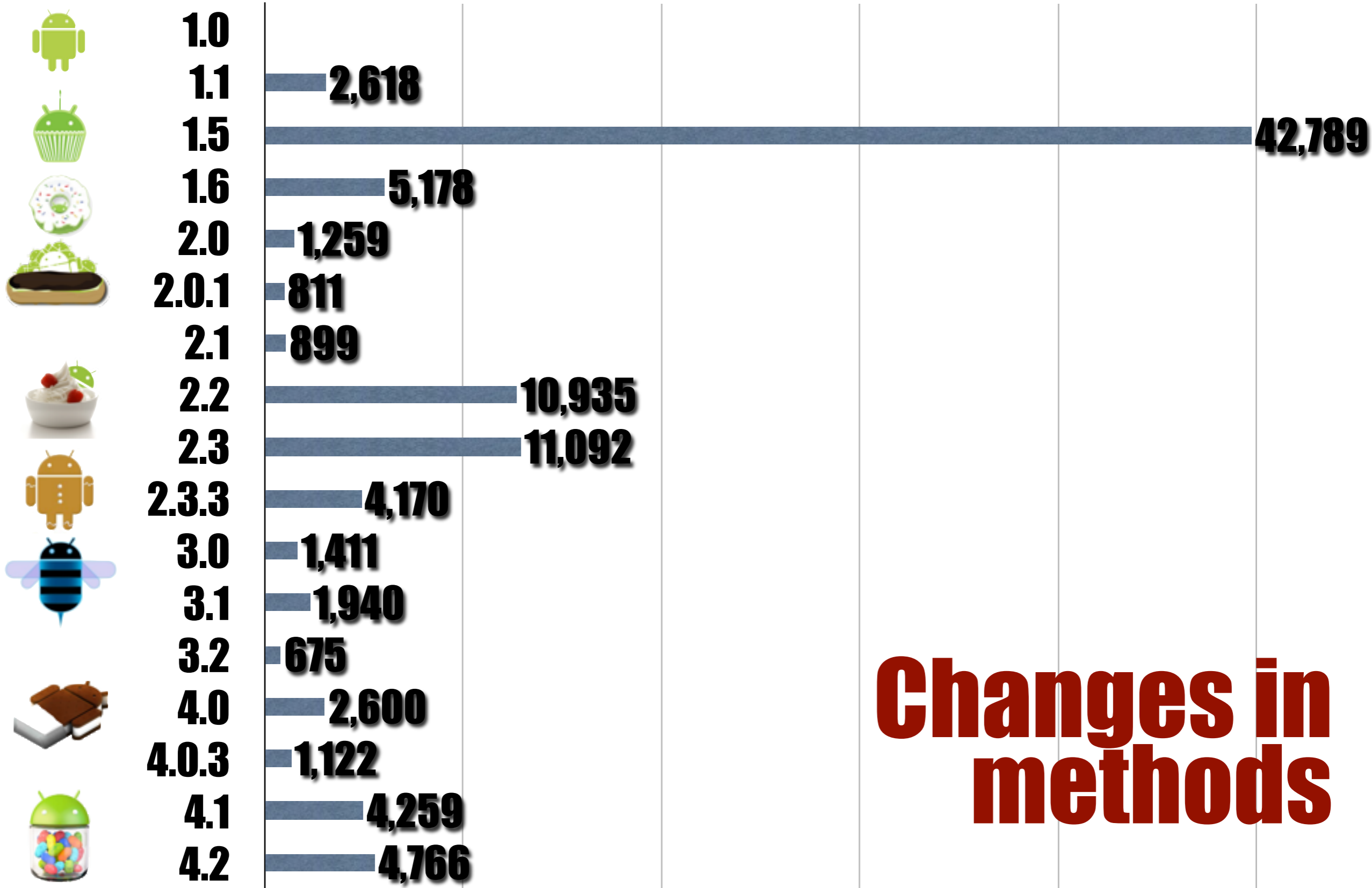


**New classes**

**17 releases in 4 years  
(2008-2012)**

**96,524  
changes in  
methods**

1100000000



**Changes in  
methods**

**May API instability and  
fault-proneness impact  
the success of Android  
applications ?**



**5,848**

**Free Apps  
analyzed**



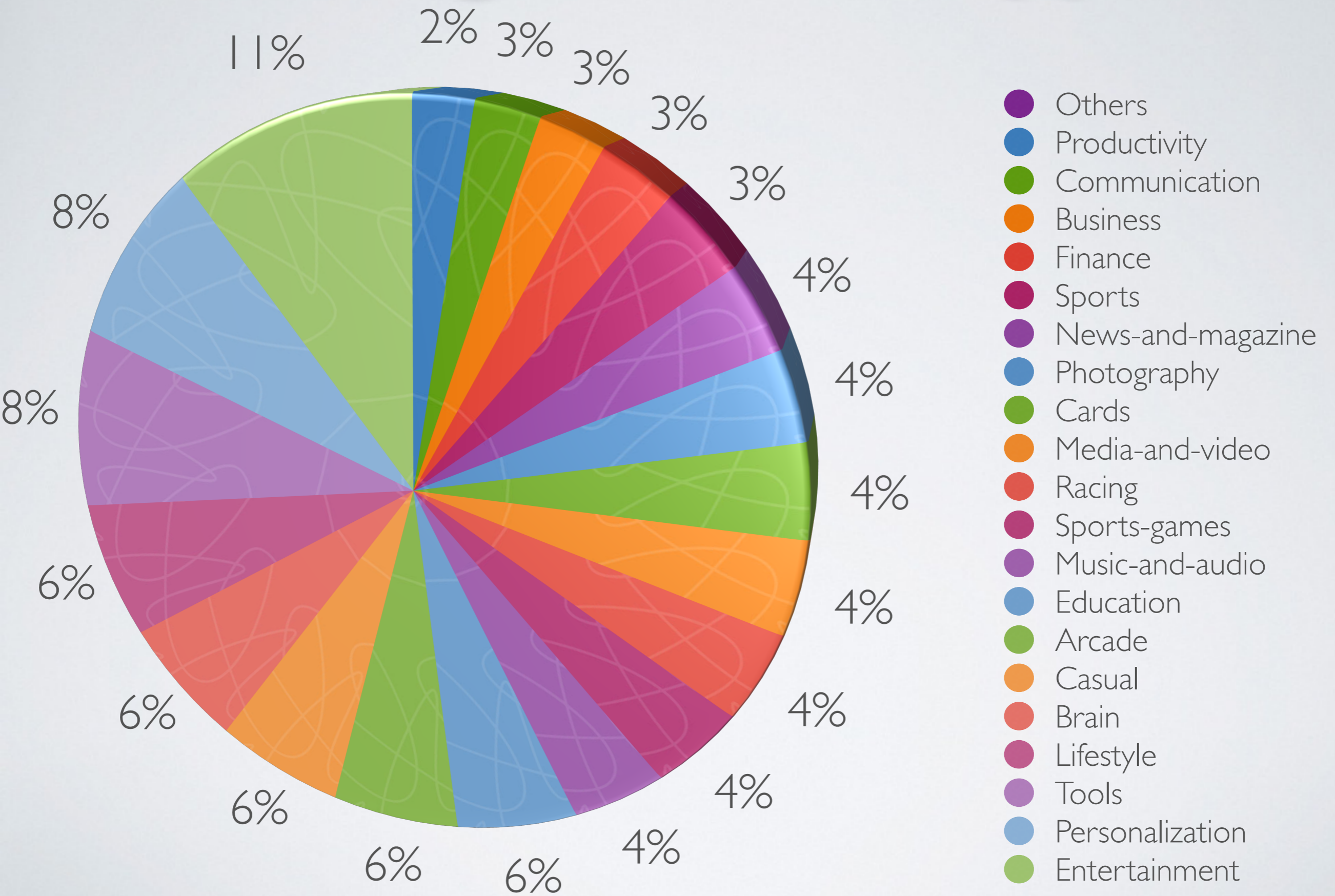
# 30

# Domain categories from Google play





# Categories and Apps



# 68

# Third party libraries



**85k+**

**developers'  
commits**



**39k+**

**bug-fixing  
activities**

**1M+**

**method's  
changes**

**85k+**

**developers'  
commits**



**35k+**

**Android API**

**49k+**

**Third party  
libraries**

**85k+**

**developers'  
commits**



**1,068**

**Android API  
developers**

**1,232**

**Third party  
libraries devs**

**App's success:**

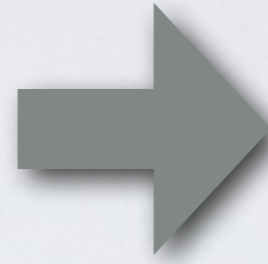
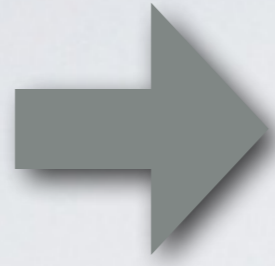
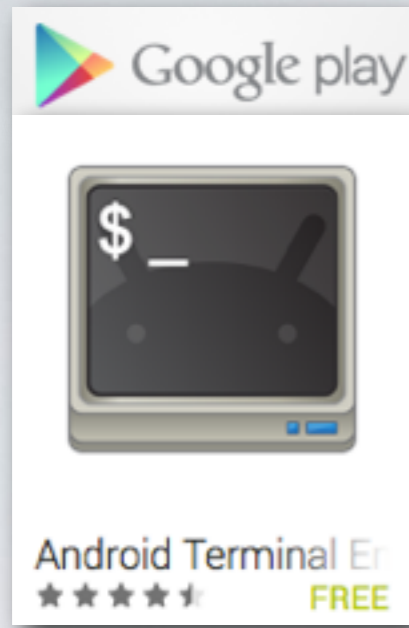
**Average users  
rating**

**API fault-  
proneness:**

**Number of bugs  
fixed in the  
Android API**

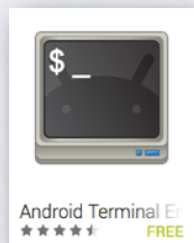
**API change-  
proneness:**

**Number of changes at  
method level in the  
Android API**



**android.app.ActionBar**  
:  
**android.gesture.Gesture**

# Bug-fixes, and changes in the used APIs



**time...**

**Considered version**

**Next version or last rating**

# android / platform/packages/apps/Gallery2

git clone https://android.googlesource.com/platform/packages/apps/Gallery2

## Branches

- master
- ics-factoryrom-2-release
- ics-mr0
- ics-mr0-release
- ics-mr1
- ics-mr1-release
- ics-plus-aosp
- jb-dev
- jb-mr0-release
- jb-mr1-dev

More...

- f6167c8 Reconcile with jb-mr2-zeroday-release - do not merge by The Android Open Source Project - 6 weeks ago
- 84b75bf merge in jb-mr2-zeroday-release history after reset to jb-mr2-dev by The Android Automerger - 6 weeks ago
- release android-4.3\_r2.1
- 8569545 am ee14cce0: am e8e2610f: Fix preview thumb and touch target out of sync by Doris Liu - 6 weeks ago
- ee14cce am e8e2610f: Fix preview thumb and touch target out of sync by Doris Liu - 6 weeks ago
- e8e2610 Fix preview thumb and touch target out of sync by Doris Liu - 6 weeks ago **jb-mr2-dev**
- 57d45b6 Reconcile with jb-mr2-zeroday-release - do not merge by The Android Open Source Project - 8 weeks ago
- e873a55 merge in jb-mr2-zeroday-release history after reset to jb-mr2-dev by The Android Automerger - 8 weeks ago
- 098fe71 Merge remote-tracking branch 'origin/jb-mr2-zeroday-release' into HEAD by The Android Automerger - 8 weeks ago
- android-4.3\_r2
- 090c669 Reconcile with "
- not merge by The Android Open Source Project - 9 weeks ago

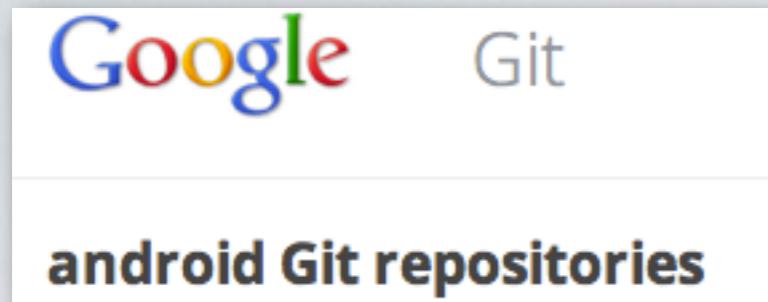
## Populating a Release History Database from Version Control and Bug Tracking Systems\*

Michael Fischer, Martin Pinzger, and Harald Gall  
 Distributed Systems Group, Vienna University of Technology  
 {fischer,pinzger,gall}@infosys.tuwien.ac.at

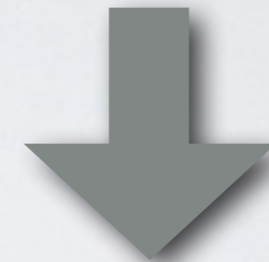
anticipating future evolution of software projects. Unfortunately, current version and bug report systems provide no support for the combination of both data sources in software evolution

# Bug-fixes in APIs





# MARKOS code analyzer



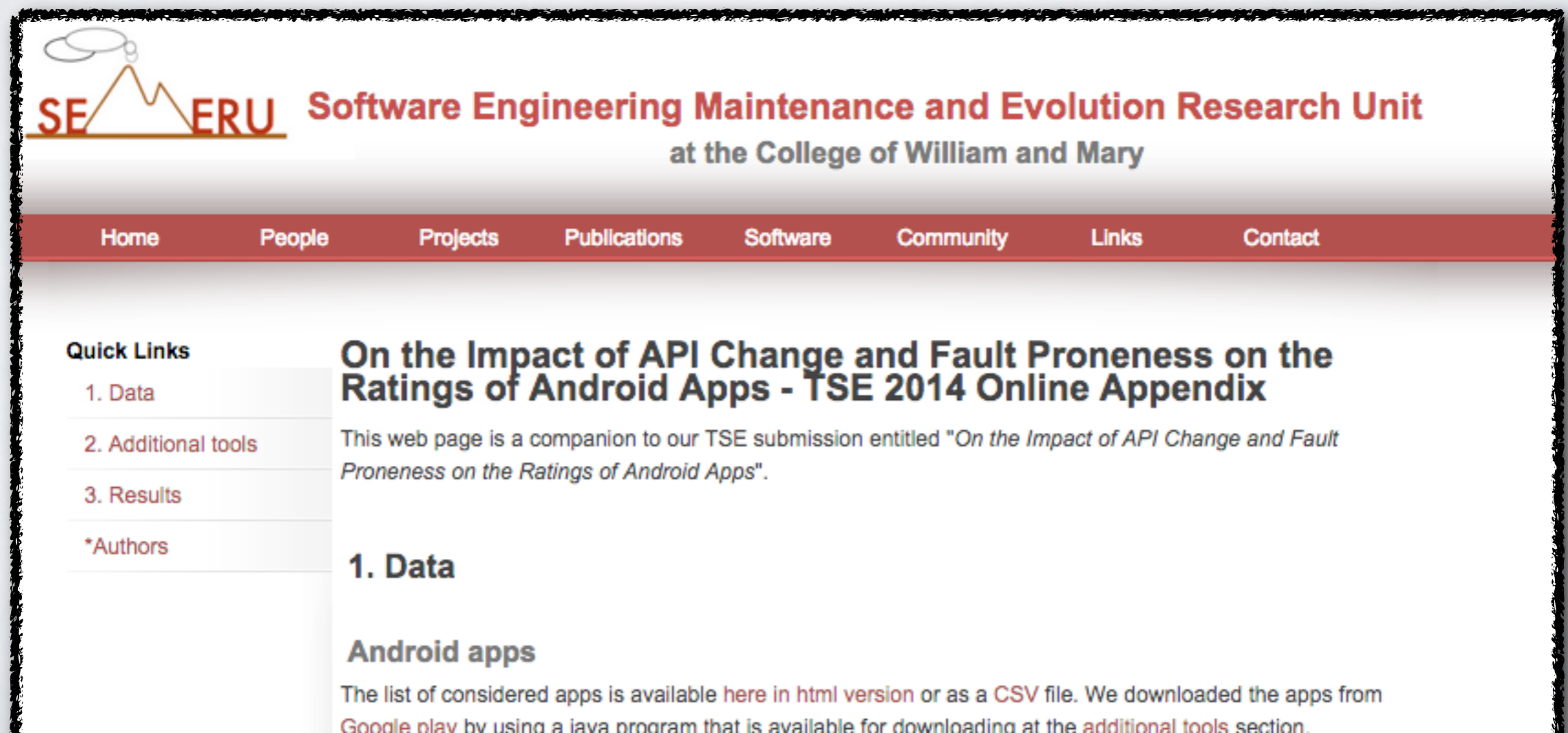
**Changes  
at method level**

- **Generic changes**
- **Method signature**
- **Exceptions**



# All the data are available at...

[http://www.cs.wm.edu/semeru/  
data/tse-android/](http://www.cs.wm.edu/semeru/data/tse-android/)



**SEMERU** Software Engineering Maintenance and Evolution Research Unit  
at the College of William and Mary

Home People Projects Publications Software Community Links Contact

**Quick Links**

- 1. Data
- 2. Additional tools
- 3. Results
- \*Authors

## On the Impact of API Change and Fault Proneness on the Ratings of Android Apps - TSE 2014 Online Appendix

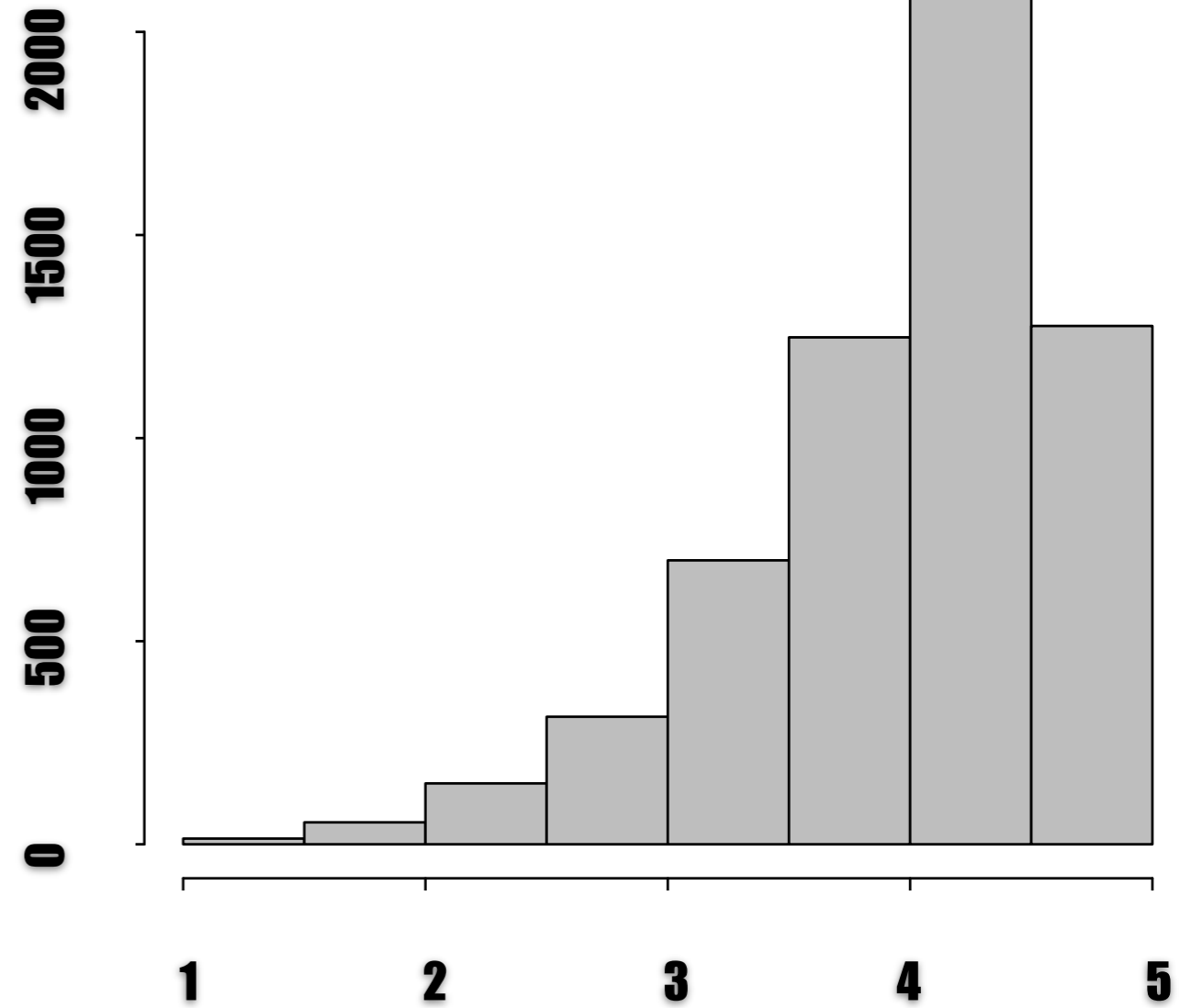
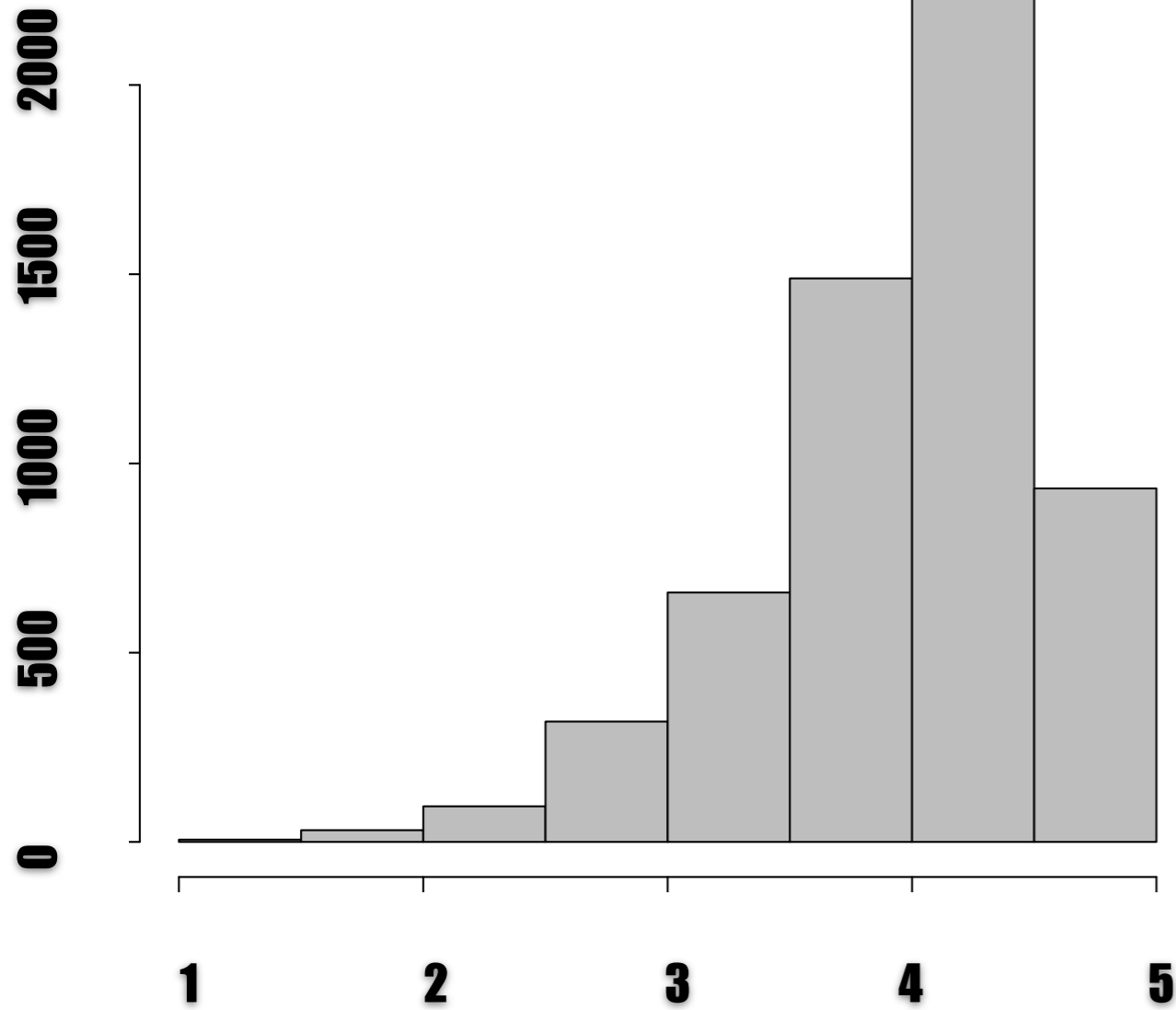
This web page is a companion to our TSE submission entitled "*On the Impact of API Change and Fault Proneness on the Ratings of Android Apps*".

### 1. Data

#### Android apps

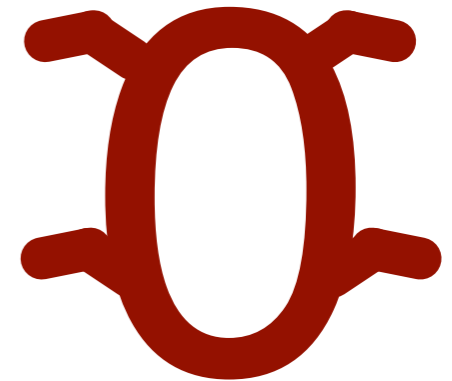
The list of considered apps is available [here](#) in html version or as a CSV file. We downloaded the apps from Google play by using a java program that is available for downloading at the [additional tools](#) section.

# Free vs. Paid (5,848 apps)



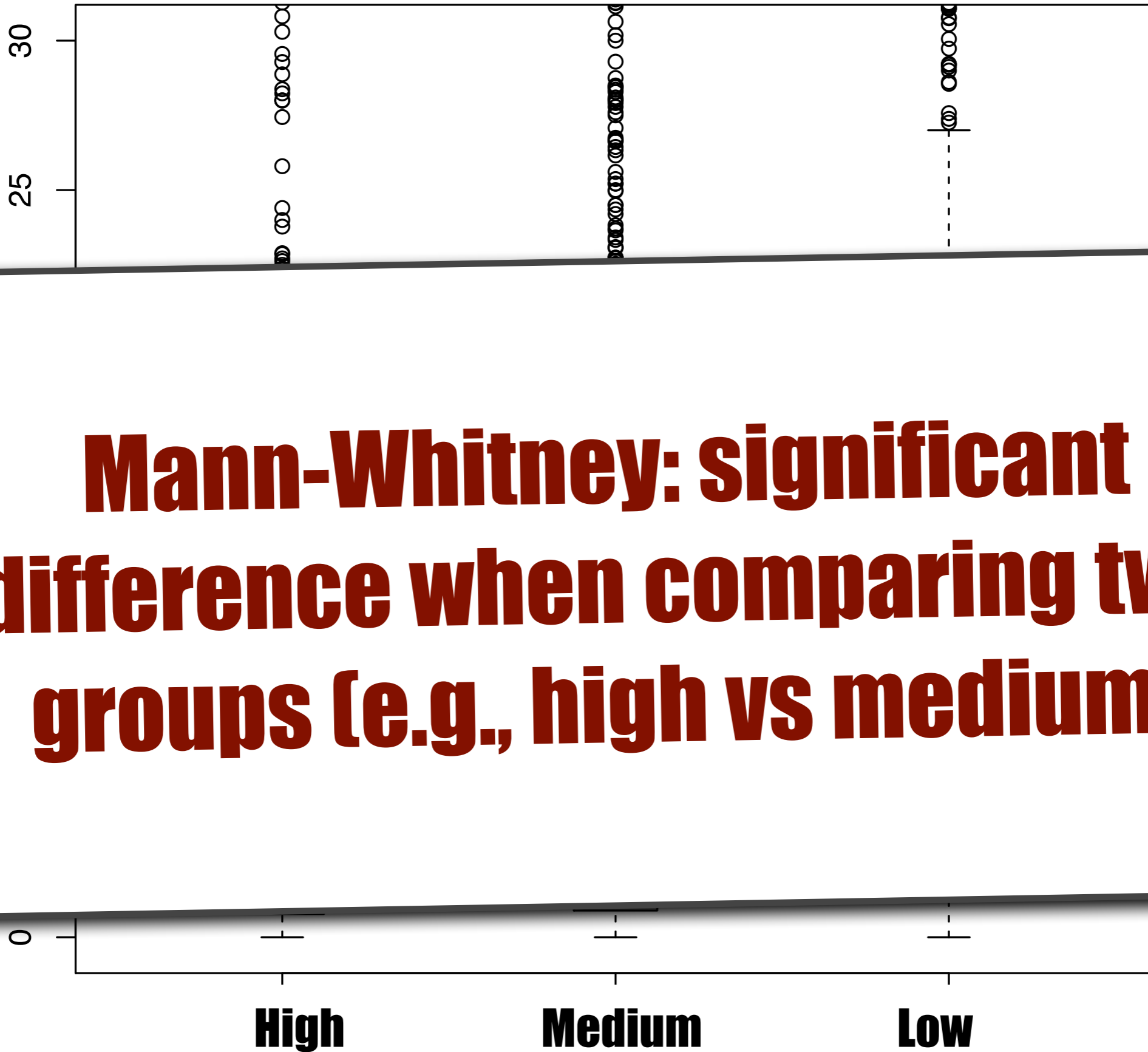
**Average App Rating**

**Does the fault-proneness  
of APIs affect the success  
of Android Apps?**

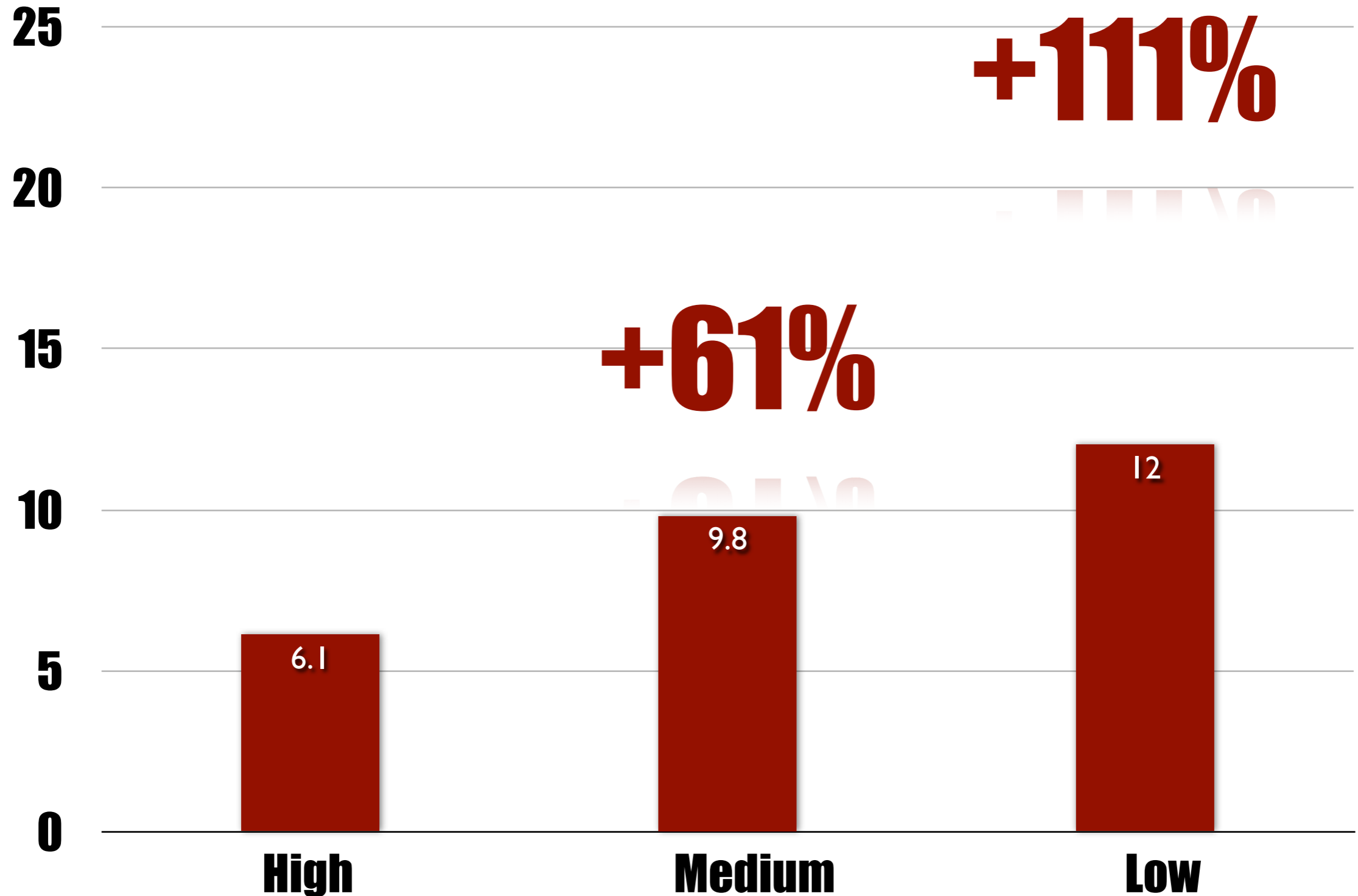


**Bid-fixes in iCalendar APIs**

**Mann-Whitney: significant difference when comparing two groups (e.g., high vs medium)**



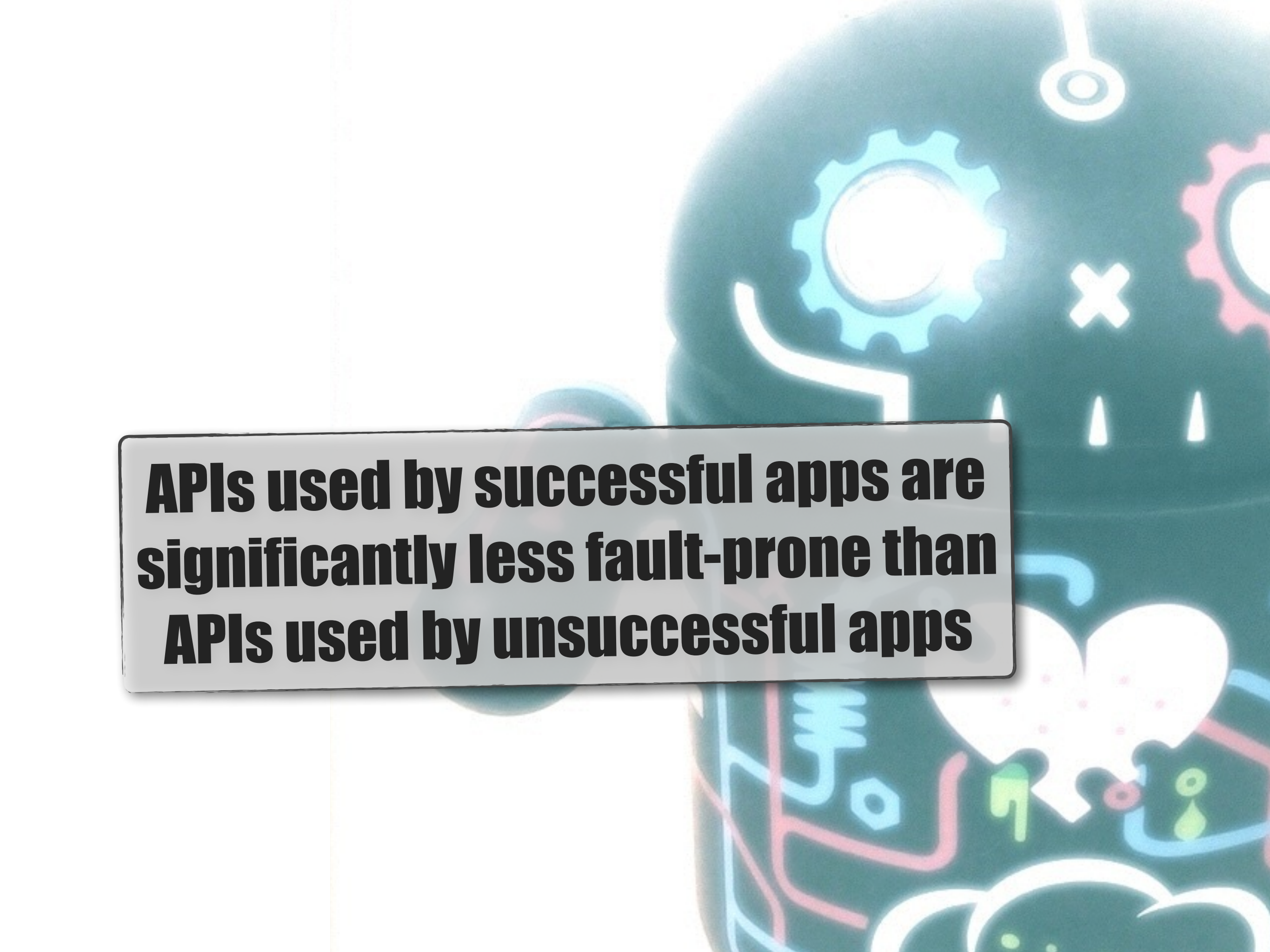
# Avg bug-fixes in used APIs



# 50 most successful vs 50 least successful apps

**+457%**

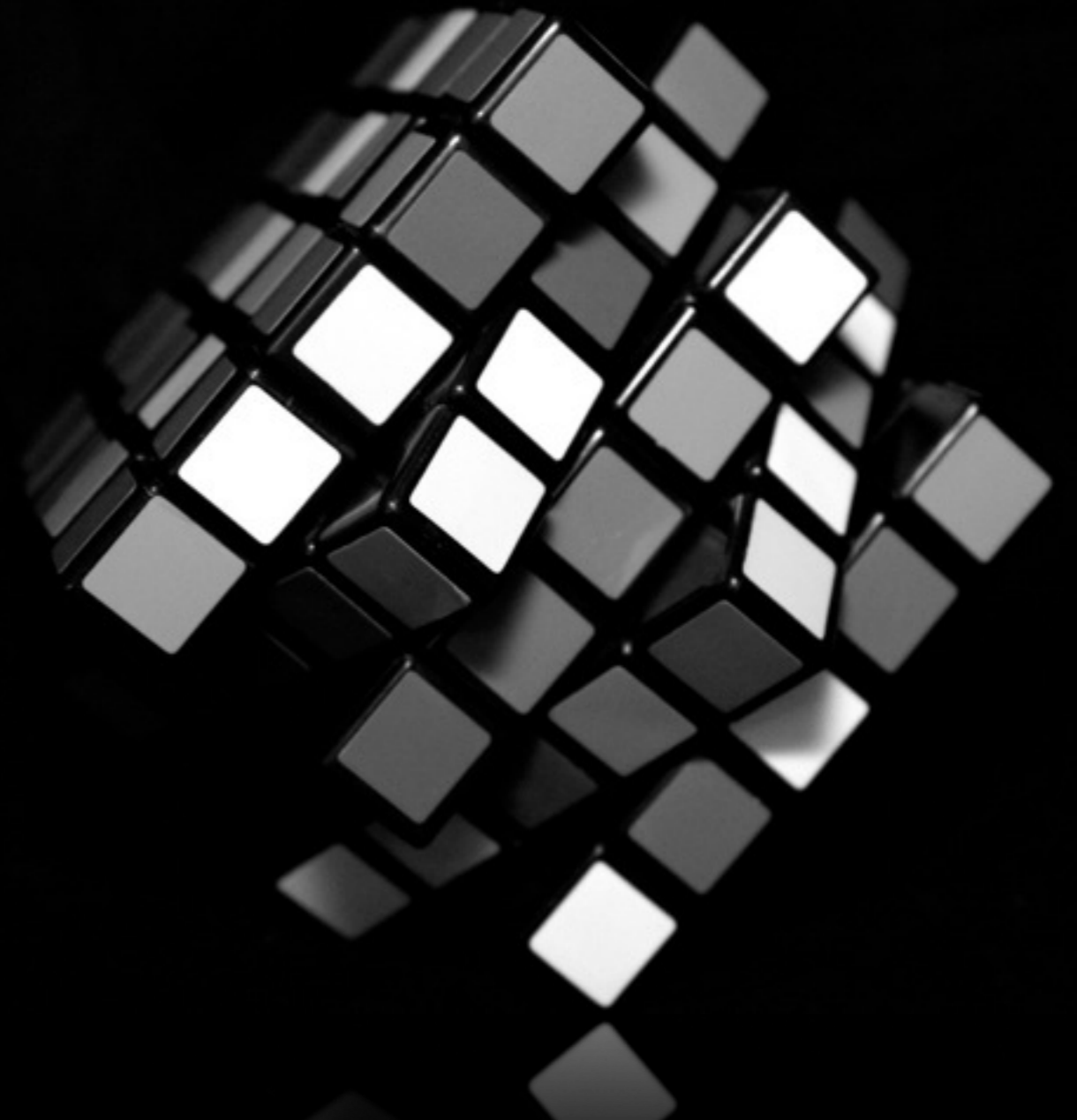
+457%



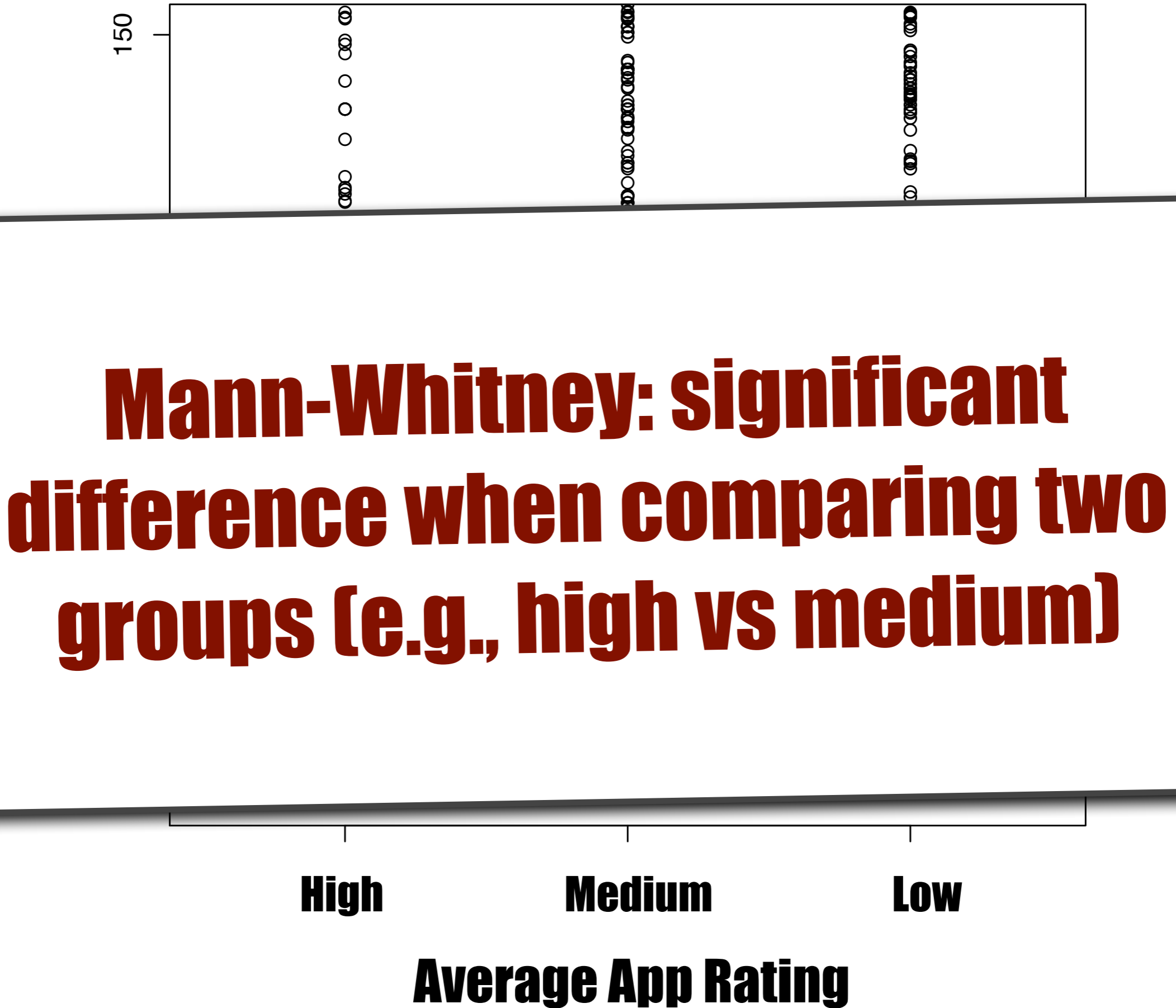
**APIs used by successful apps are significantly less fault-prone than APIs used by unsuccessful apps**



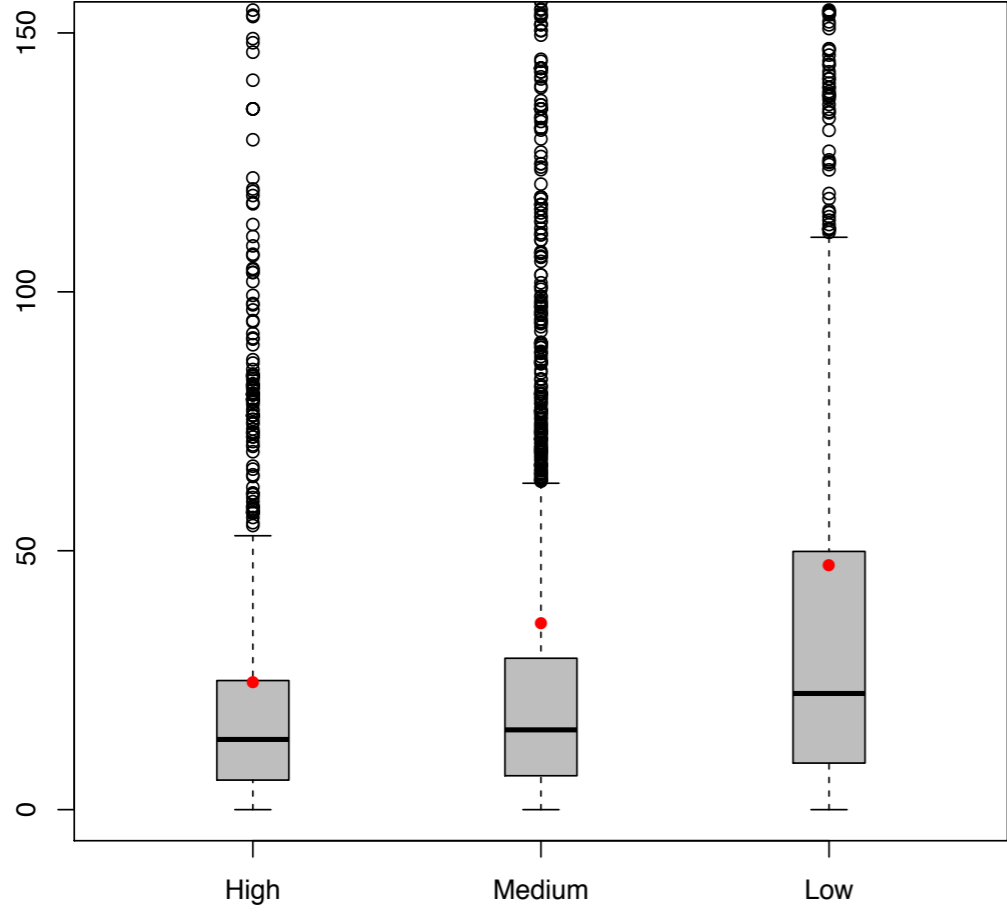
**Does the change-proneness  
of APIs affect the success of  
Android Apps?**



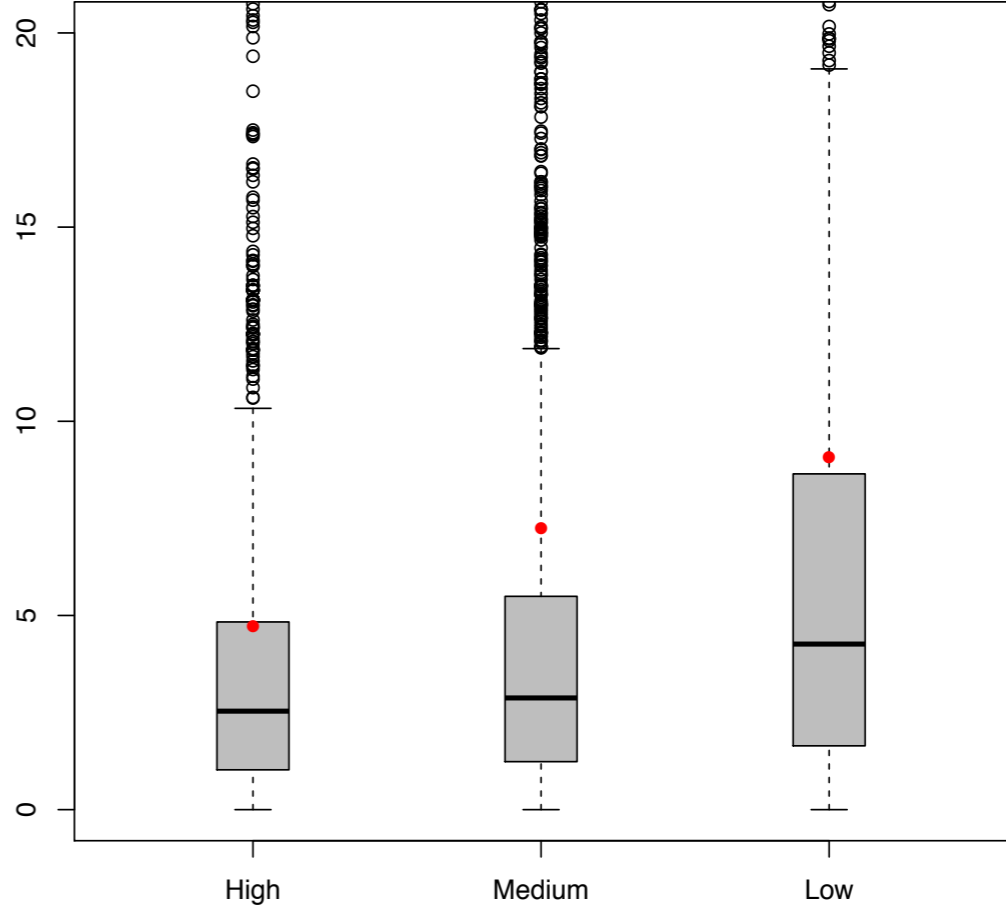
Overall method used APIS



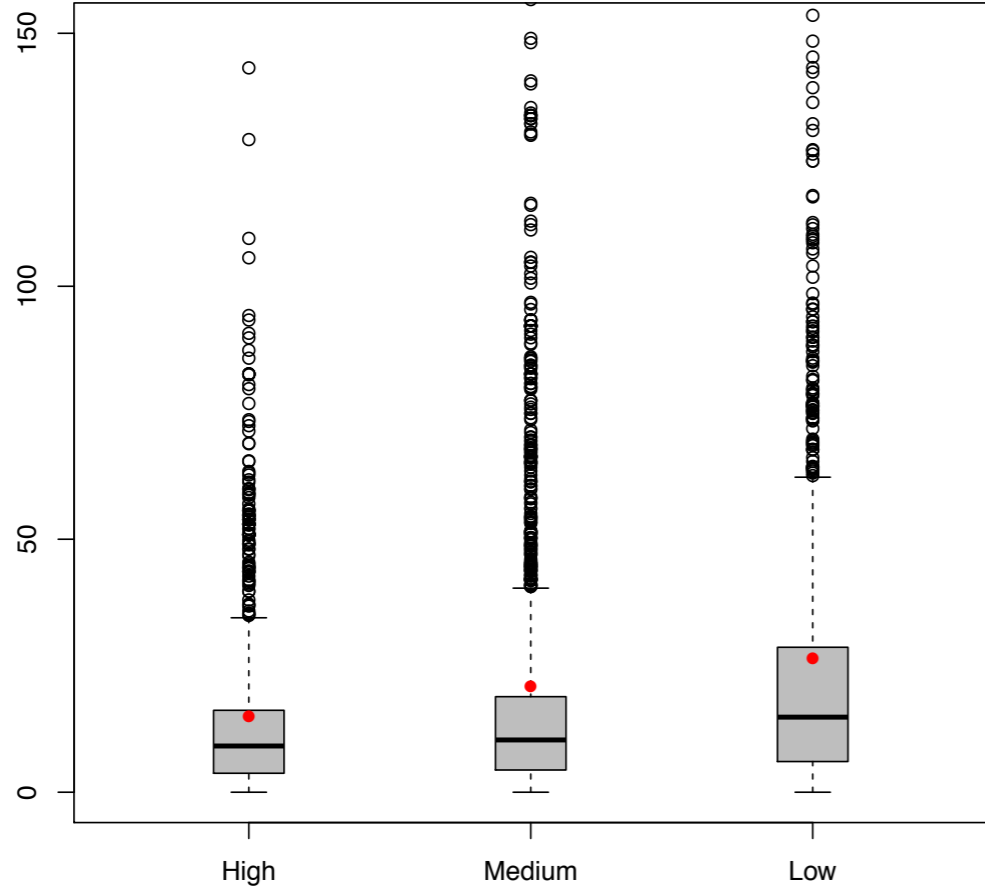
**Method changes**



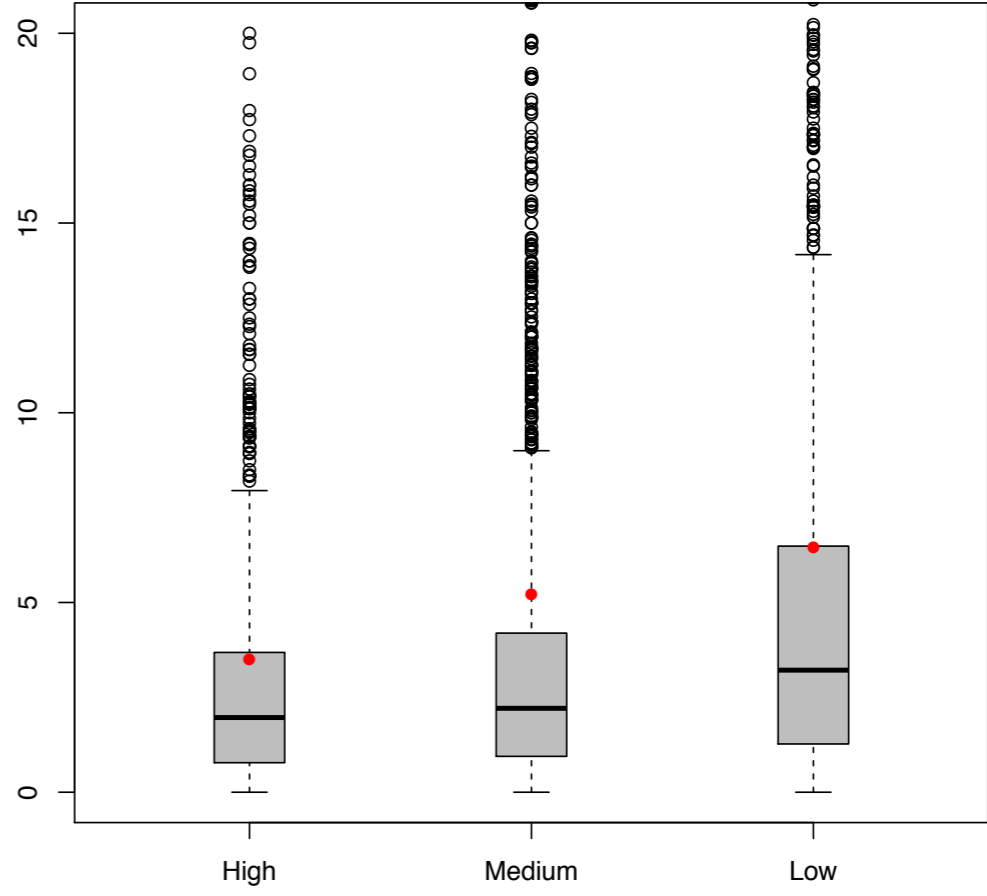
**Changes in method signatures**



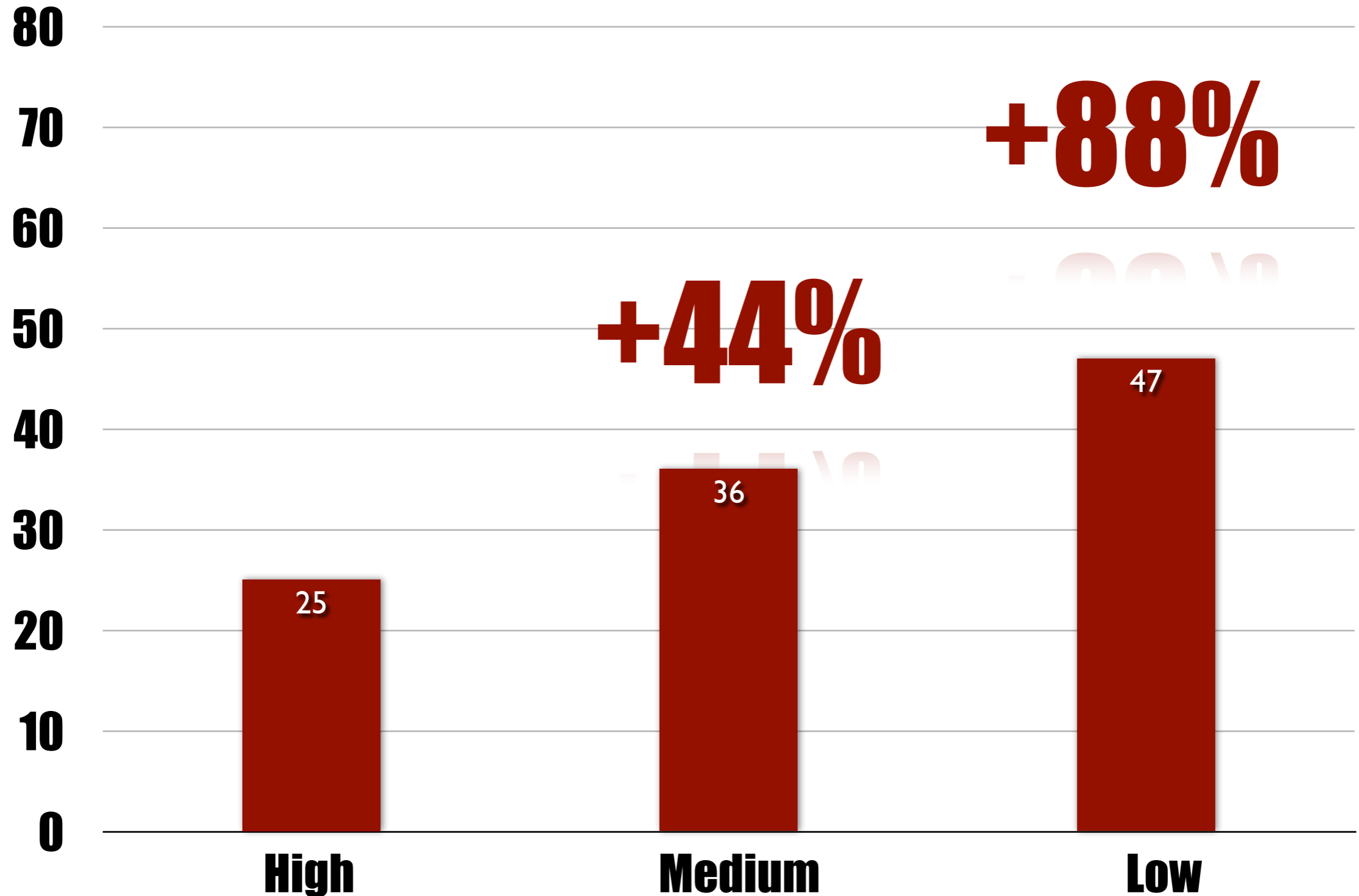
**Public method changes**



**Changes in pub. method signatures**



# Avg changes in used APIs

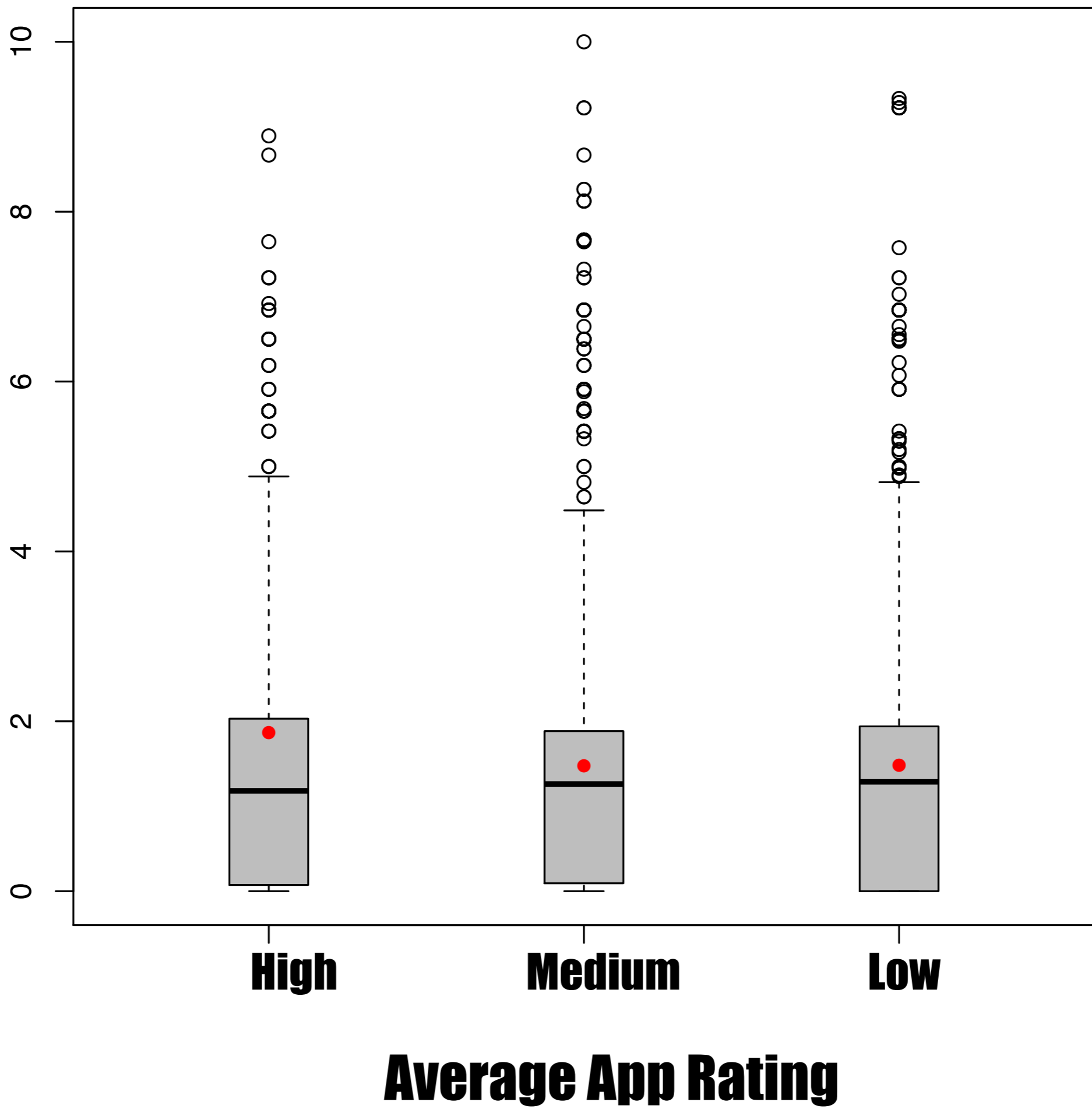


**50 most successful vs  
50 least successful apps**

**+315%**

**-315%**

# Changes in exceptions thrown by methods



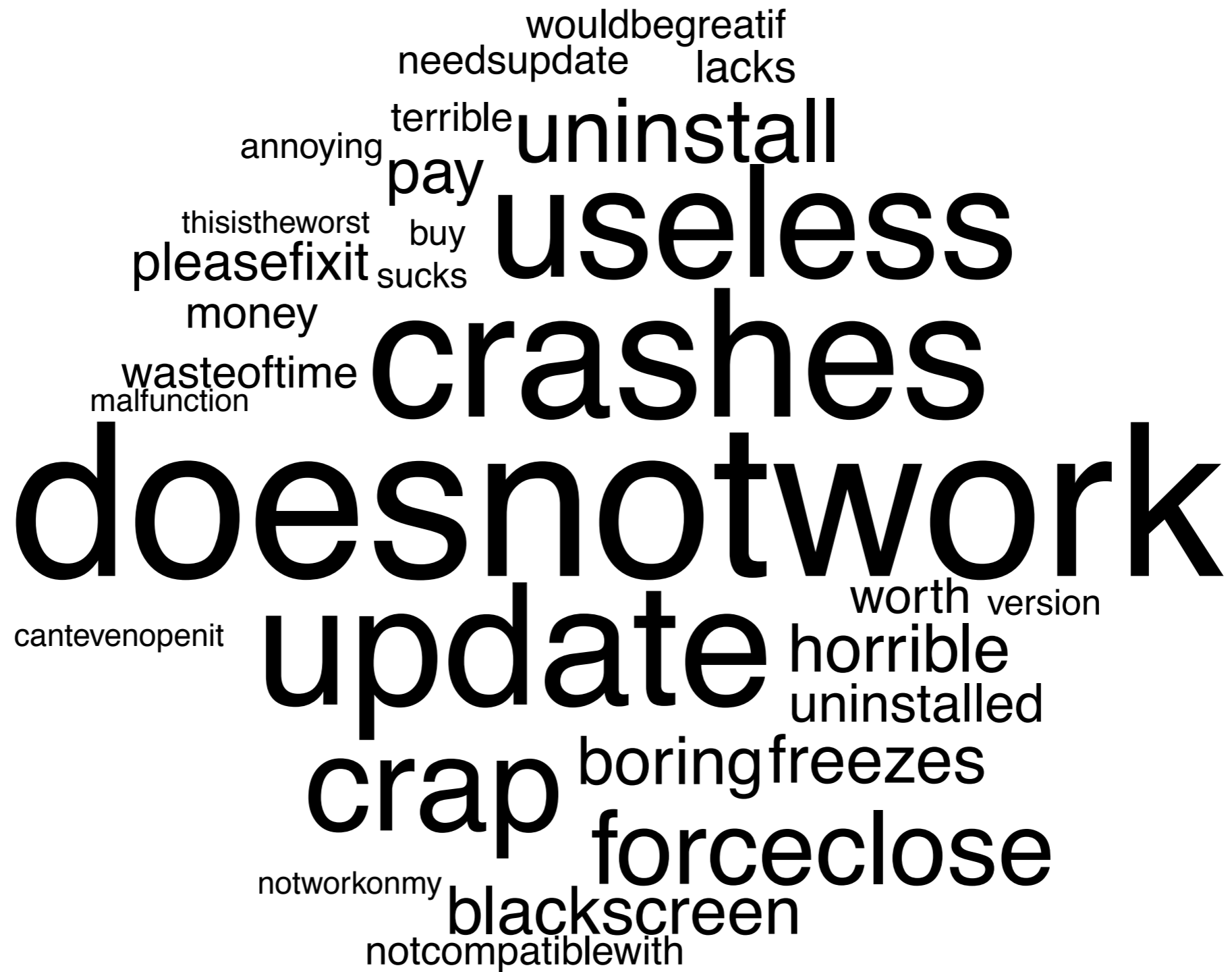
**APIs used by **successful apps** are **less prone to changes** than APIs used by unsuccessful apps.**

**No difference when the changes are on the exceptions thrown by API methods.**



# **Qualitative analysis**





**Most common n-grams in low rated  
apps user comments**



# CNN App for Android Tablet

CNN - July 29, 2013

News & Magazines

Install



Add to Wishlist

★★★★★ (1,056)

Top Developer



+591 Recommend this on Google

**482 out of 812 votes were 1 star, mostly due to presence of a bug**

**Rating: ★**

**A Google User - July 3, 2012**

**Widget?**

**The widget looks awesome when it doesn't foul up. I just don't understand the invisible widget thing. please fix**

**Rating: ★★**

**A Google User - July 6, 2012**

**Needs some MAJOR bug fixes**

**I was excited to see that the app has finally been updated. But some of its widgets became invisible.**

**FIX BUG #6773607: Layered views animating from offscreen sometimes remain invisible**

# android.speech.tts

15 Classes

460 Method changes

289 to public methods

A change each 69 bug fixes  
each 13 days



More than 200 users  
complained about  
problems related to  
this feature

# Facebook Android SDK (3.5)

“Every time I login to Facebook the app is forced to close”

“Started once, seemed to login with Facebook, but after that, it went back to the main screen and nothing happened”

**Bug solved in version 3.5.1**

# **Survey with Android Developers**

**- Purpose:** understanding to what extent they experience problems when using APIs and how much they consider these problems to be related to negative user ratings/comments

**- Focus:** the developers' perception of the impact change- and fault-prone APIs can have on the apps' user ratings

**- Developers' emails  
mined from Google Play**

**- 1,221 developers  
contacted via email**

**- Online survey (qualtrics)**

# 45

**professional  
Android  
developers**

## 21 Questions

- **Background**
- **Problems**  
**when using APIs**
- **Impact of API**  
**on user ratings**



# **Select, among the following, the most frequent perceived causes of app bugs/crashes**

**11. Java programming errors in the app**

**12. Use of third party libraries affected by bugs (e.g., a bug in a library used by the app causes crashes)**

**13. Changes in new releases of third party libraries used by the app cause crashes**

**14. Bugs present in the official Android APIs (e.g., a bug in the Android APIs causes the app to crash)**

**15. Changes in new releases of the official Android APIs cause the app to crash**

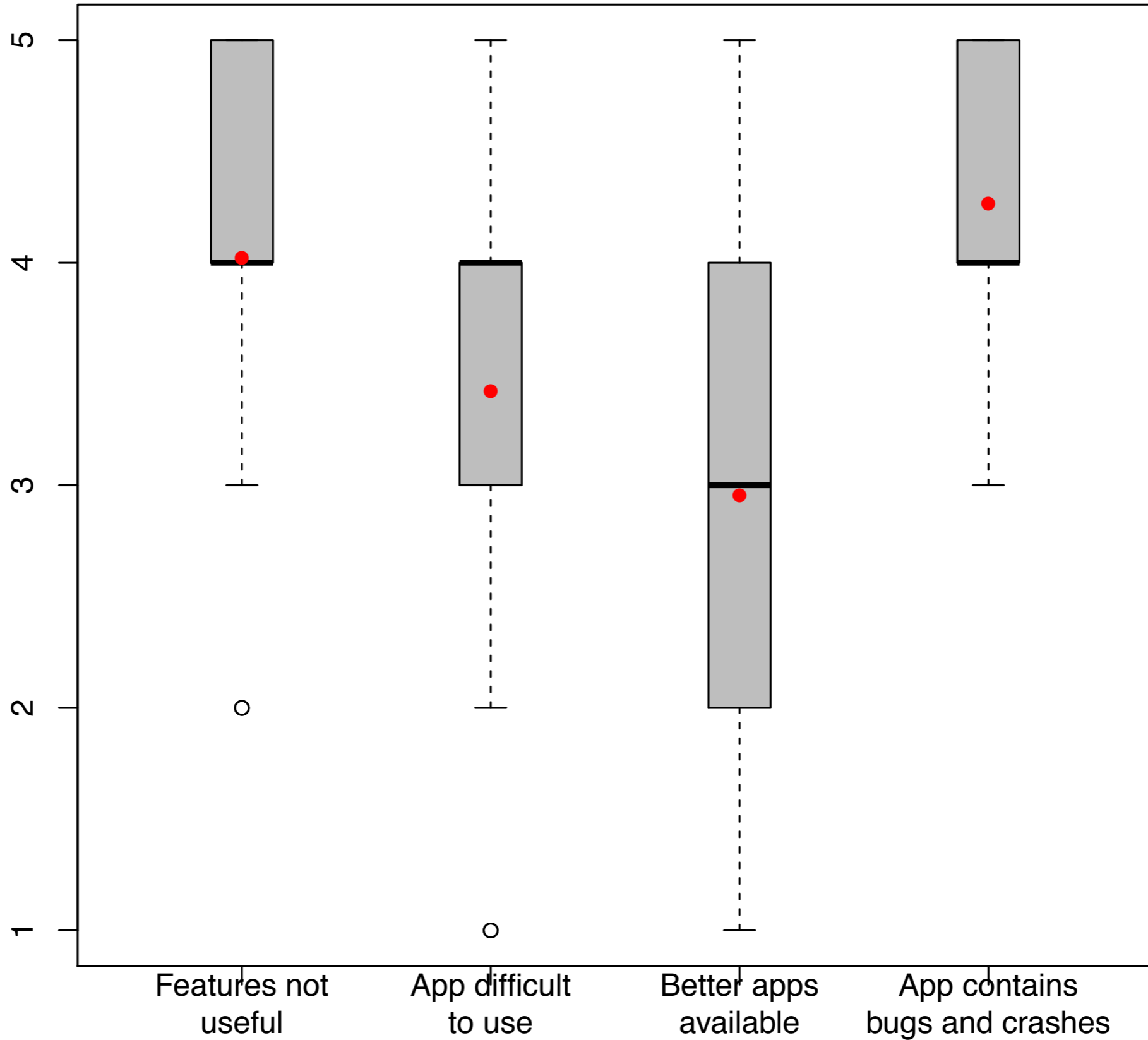
# **Experiences with used APIs**

**16. Did you ever experience problems with mobile development APIs?**

**17. If YES to 16, were they official Android APIs or third party APIs? Indicate release version and describe the problem if possible**

**8. Did you ever have new bugs in your app due to the new releases of the Android platform?use**

# Negative impact on ratings



## Factors affecting negatively apps' rating

**eason**



**44% and 71% consider change- and fault- proneness of APIs as threats to the proper working of their apps**



**Reasons causing bugs**

# Android Honeycomb (3.0)

“the removal of the menu button resulted in bad user experiences with my apps and, consequently, in bad user ratings/comments”

## MoPub library

“for few days I received bad user comments due to crashes in my app. However, the moPub team rapidly fixed the problem”

# Android Honeycomb (3.2)

“my app worked fine until Android 3.2 (API level 13). Then, the app started to crash on screen rotation. This was due to a change in the Android APIs requiring, besides the management of the orientation value (as needed until API level 12), also the management of the screenSize value when a screen rotation event arises. Unfortunately, given to commitments on other projects it took some days to fix the problem and this resulted in several low ratings for my apps”

# Conclusion

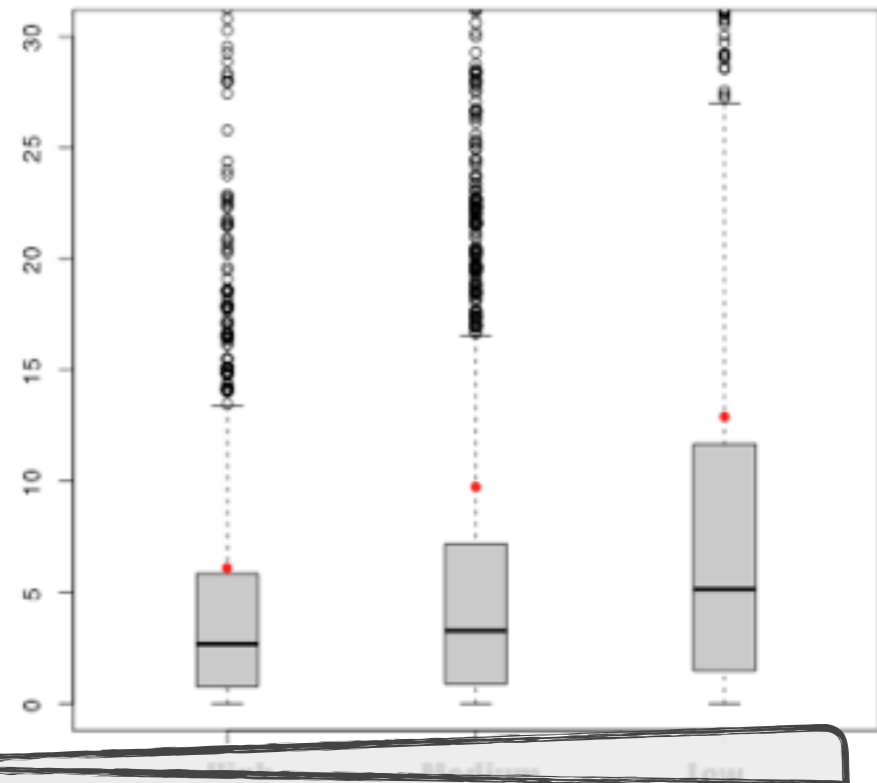


# 5848

Free Apps  
analysis

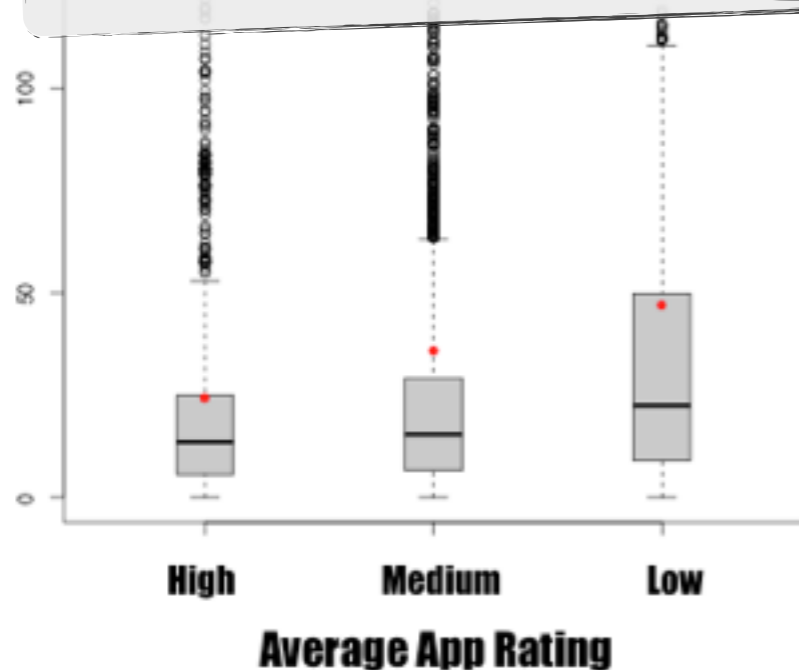


Bug-fixes in used APIs



## Not all APIs are the same...

Overall method changes in used APIs



15 Classes  
460 Method changes  
289 to public methods  
69 bug fixes  
A change each 13 days



More than 200 users  
complained about  
problems related to  
this feature



# Long-term Goals



**Create recommendation systems aimed at warning developers about breaking/buggy changes in the APIs**

**Create recommendation systems aimed at suggesting the developers which APIs to use given specific needs**

# Thanks

**Denys Poshyvanyk**  
**denys@cs.wm.edu**

**<http://www.cs.wm.edu/~denys/>**



**WILLIAM  
& MARY**