

39<sup>th</sup> IEEE International Conference on Software Maintenance and Evolution  
(ICSME 2023) Bogota, Colombia

# Most Influential Paper Award from ICSME 2013

“An Empirical Study of API Stability and Adoption in the  
Android Ecosystem”

by Tyler McDonnell, Baishakhi Ray, and **Miryung Kim**



**What was 2013 like?**

# Senior undergraduate student: Tyler McDonnell



2013: Senior Undergrad at  
University of Texas, Austin



2023: Senior Manager,  
AI Researcher,  
lives in Austin area



2018: PhD in AI from  
University of Texas, Austin

# 4th Year graduate Student: Baishakhi Ray



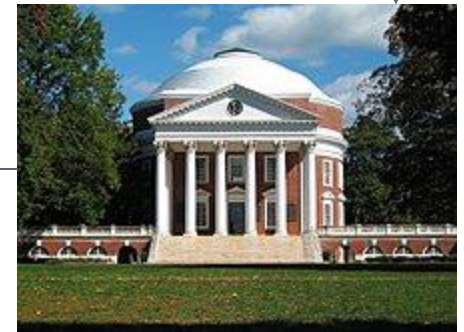
PhD, UT Austin



Postdoc, UC Davis



Assistant/Associate Professor,  
Columbia University at New York

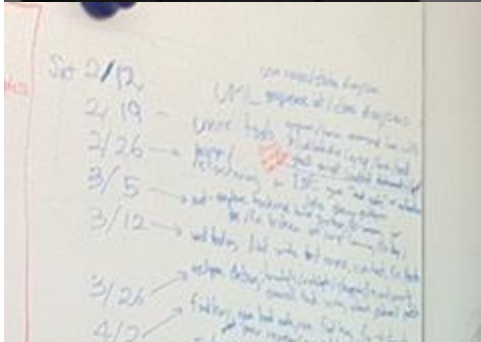


Assistant Professor,  
University of Virginia





# 5th year Assistant Professor: Miryung Kim



Deadlines sketched on  
the white board



Feb 25 2013



David Notkin,  
Jan 1, 1955-  
Apr 22, 2013



Suman & Baishakhi  
Farewell in Austin  
Sept 17 2013

ICSM 2013  
Submission Deadline  
Apr 24, 2013  
Conf: Sept 22-27 2013

# ICSM 2130 in Eindhoven, The Netherlands.



# What ideas have motivated and inspired Android API Evolution?



# Dagstuhl: Multiversion Program Analysis in 2005

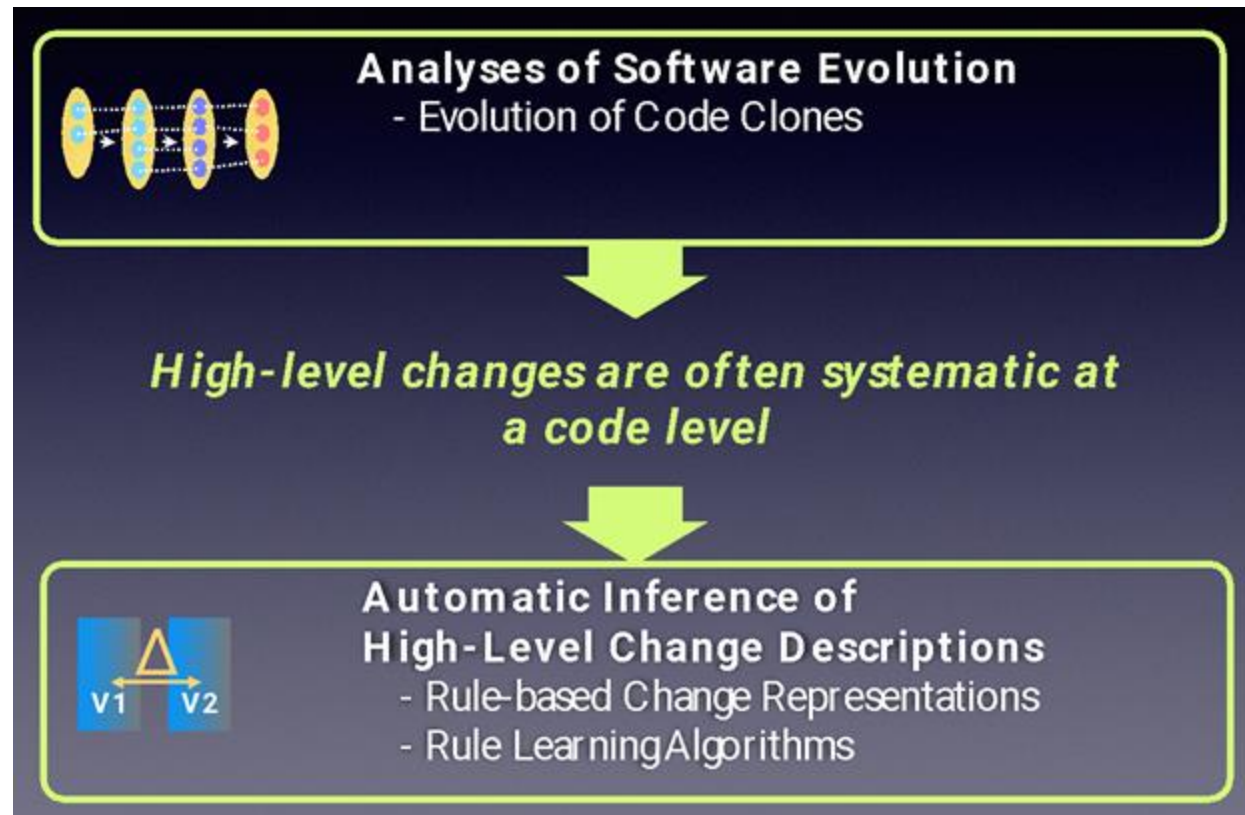




# Miryung's PhD @ University of Washington



My PhD Advisor:  
David Notkin  
(1 Jan 1955 – 22 Apr 2013)



# Baishakhi's PhD @ UT Austin

## Cross-system co-evolution



### A Case Study of Cross-System Porting in Forked Projects

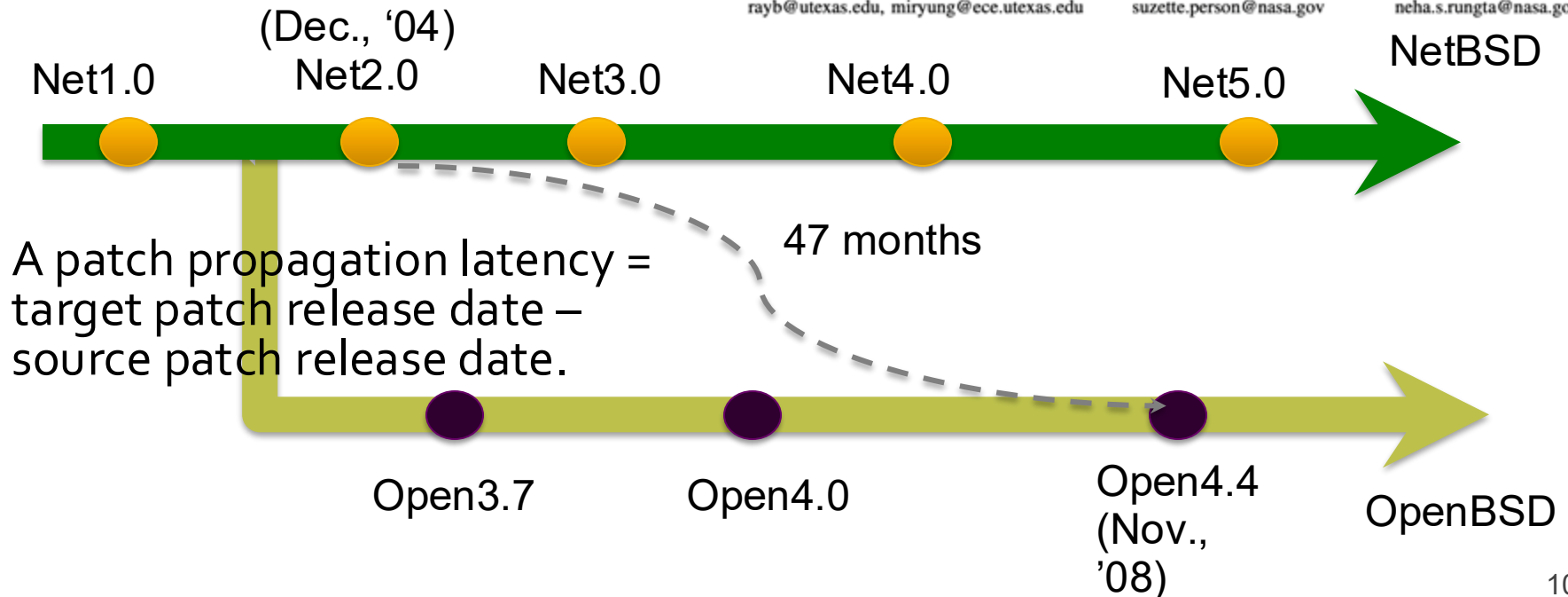
Baishakhi Ray and Miryung Kim  
The University of Texas at Austin  
Austin, TX USA  
rayb@utexas.edu, miryung@ece.utexas.edu

### Detecting and Characterizing Semantic Inconsistencies in Ported Code

Baishakhi Ray, Miryung Kim  
The University of Texas at Austin  
Austin, USA  
rayb@utexas.edu, miryung@ece.utexas.edu

Suzette Person  
NASA Langley Research Center  
Hampton, USA  
suzette.person@nasa.gov

Neha Rungta  
NASA Ames Research Center  
Mountain View, USA  
neha.s.rungta@nasa.gov



# Na Meng's PhD @ UT Austin

## Automating Updates to Clones



### Systematic Editing: Generating Program Transformations from an Example

Na Meng      Miryung Kim      Kathryn S. McKinley  
The University of Texas at Austin  
mengna152173@gmail.com, miryung@ece.utexas.edu, mckinley@cs.utexas.edu

### LASE: Locating and Applying Systematic Edits by Learning from Examples

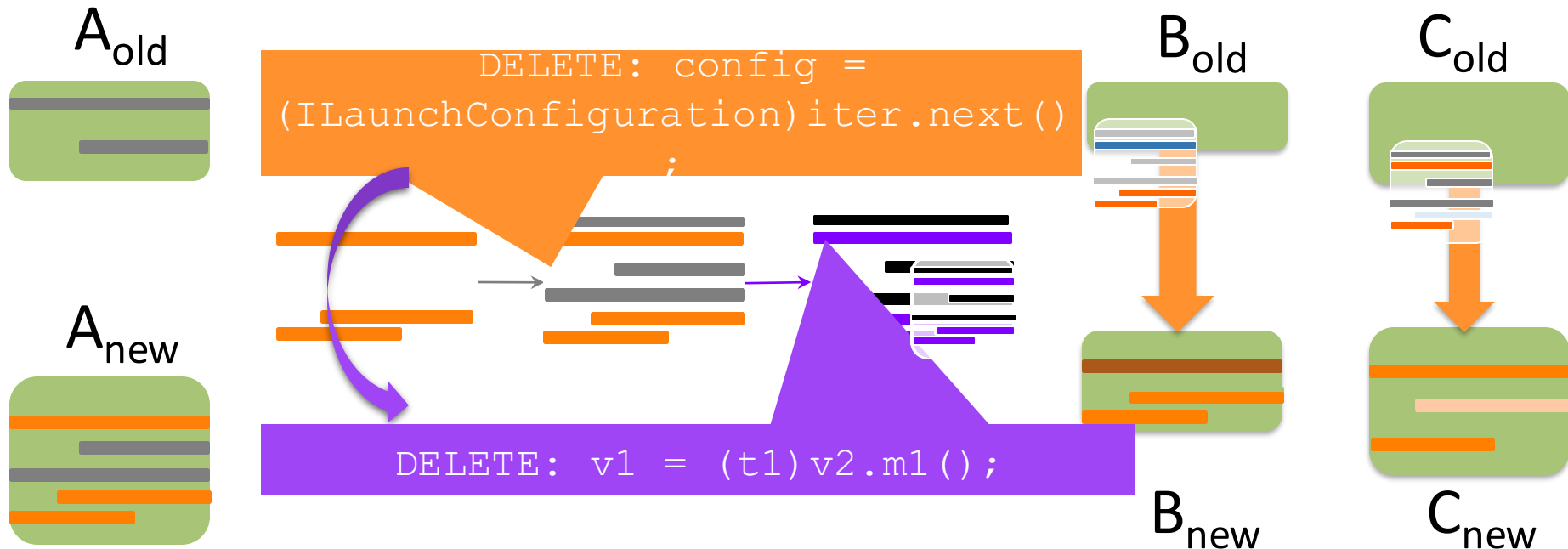
Na Meng\*      Miryung Kim\*      Kathryn S. McKinley\*<sup>†</sup>  
The University of Texas at Austin\*      Microsoft Research<sup>†</sup>  
mengna09@cs.utexas.edu, miryung@ece.utexas.edu, mckinley@microsoft.com

Program  
differencing

Context  
extraction

Identifier &  
edit position  
abstraction

Abstract edit script  
application



**Which ideas have influenced us to study evolution in software ecosystem?**





# Evolutionary Studies on Software

## Analysis of the Linux Kernel Evolution Using Code Clone Coverage

Simone Livieri<sup>†</sup>

Yoshiki Higo<sup>†</sup>

Makoto Matsushita<sup>†</sup>

Katsuro Inoue<sup>†</sup>

<sup>†</sup>Graduate School of Information Science and Technology, Osaka University  
1-3 Machikaneyama, Toyonaka, Osaka 560-8531, Japan

E-mail: {simone, y-higo, matusita, inoue}@ist.osaka-u.ac.jp

## Evolution in Open Source Software: A Case Study

Michael W. Godfrey and Qiang Tu  
Software Architecture Group (SWAG)

Department of Computer Science, University of Waterloo  
email: {migod, qtu}@swag.uwaterloo.ca

## Understanding Collateral Evolution in Linux Device Drivers

Yoann Padioleau  
OBASCO Group  
Ecole des Mines de  
Nantes-INRIA, LINA  
44307 Nantes cedex 3, France  
Yoann.Padioleau@emn.fr

Julia L. Lawall  
DIKU  
University of Copenhagen  
2100 Copenhagen Ø,  
Denmark  
julia@diku.dk

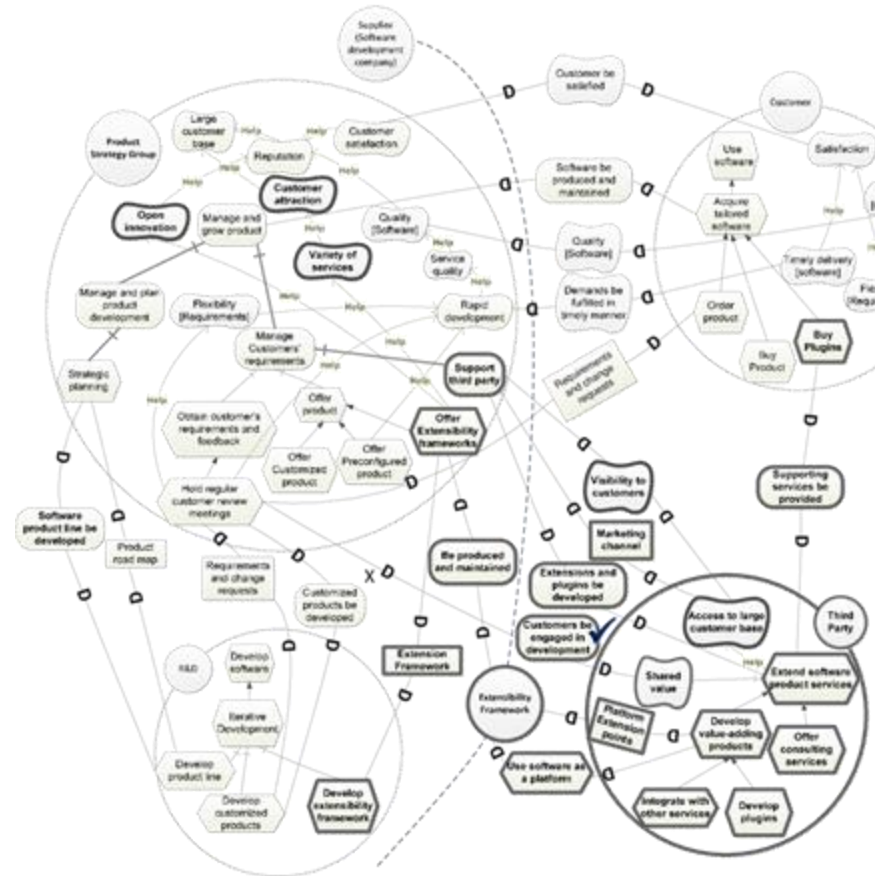
Gilles Muller  
OBASCO Group  
Ecole des Mines de  
Nantes-INRIA, LINA  
44307 Nantes cedex 3, France  
Gilles.Muller@emn.fr

# Notion of Software Ecosystem

Lungu et al.'s definition—a *collection of software projects which are developed and co-evolve in the same environment.*

Robbes et al. found that 14% of deprecated methods produce non-trivial API change effects.

Studies in Smalltalk



# Impact of API Refactoring on Client Applications

Dig and Johnson found that 80% of the code changes that break client-side code are API refactorings.

Xing and Stroulia studied Eclipse evolution history and found that 70% of structural changes are due to refactorings and existing IDEs lack support for complex refactoring.

Kim et al. found the number of bug fixes increases after API refactorings

```
/**  
 * REFACTOR  
 * YOUR CODE.  
 */
```

```
public static Function beanRequest($id, $secret)  
{  
    $url = self::$apiUrl . "Account/token";  
  
    $body = self::urlEncoded(  
        "grant_type" => "client_credentials",  
        "client_id" => $id,  
        "client_secret" => $secret  
    ), false);  
  
    $response = self::callRequest($url, $body, "post");  
  
    if($response->code != 200) throw new \Exception("API response  
    return $response->body;  
}
```

# Fast-paced Android Ecosystem Evolution

## Android 1.0 to Android M

The story of Android Evolution





# Excerpts from Original ICSM 2013 Talk

**An Empirical Study of API Stability and Adoption in the Android Ecosystem**

Tyler McDonnell, Baishakhi Ray, Miryung Kim  
*Department of Electrical and Computer Engineering*  
*The University of Texas at Austin*  
*Austin, TX, USA*

# An Empirical Study of API Stability and Adoption in the Android Ecosystem

Tyler McDonnell, Baishakhi Ray and Miryung Kim  
The University of Texas at Austin

# Motivation

- Despite the benefit of new or updated APIs, developers are often slow to adopt new APIs.
- API evolution and its associated ripple effect throughout software ecosystems are still under-studied.

# Study Findings

- We study the **co-evolution** of Android APIs and applications using the github data
  - Android is evolving fast at a rate of 115 API updates per month.
  - 28% of API references in client apps are outdated with a median lagging time of 16 months.
  - API usage adaptation code is **defect prone** than other code.

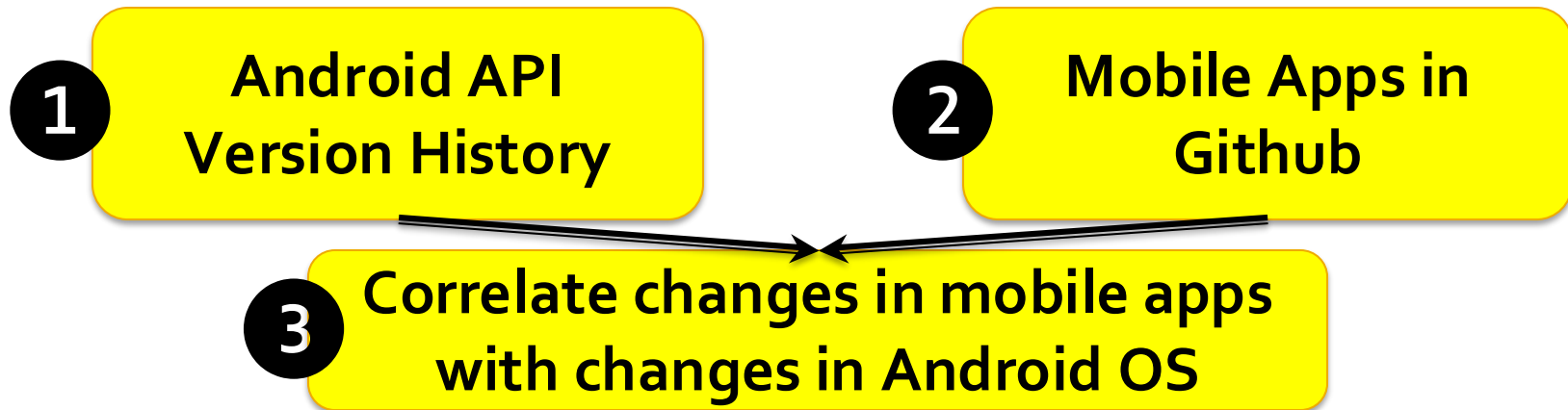


# Outline

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- Motivation & Related Work
- Study Approach
- Research Questions and Results
- Limitations
- Conclusions

# Study Approach



API Version:

14

Release date: October 19, 2011

Class: android.widget.RemoteViews

void setRemoteAdapter(int, Intent)

Android API Version History

Client Code :

Remote.java

Commit Date: January 26, 2012

```
import android.widget.RemoteViews;
```

```
int viewID = settings.getViewID();  
Intent I = new Intent(this,  
ActivityTwo.class);
```

```
setRemoteAdapter(viewID, I);
```

Client Source Code

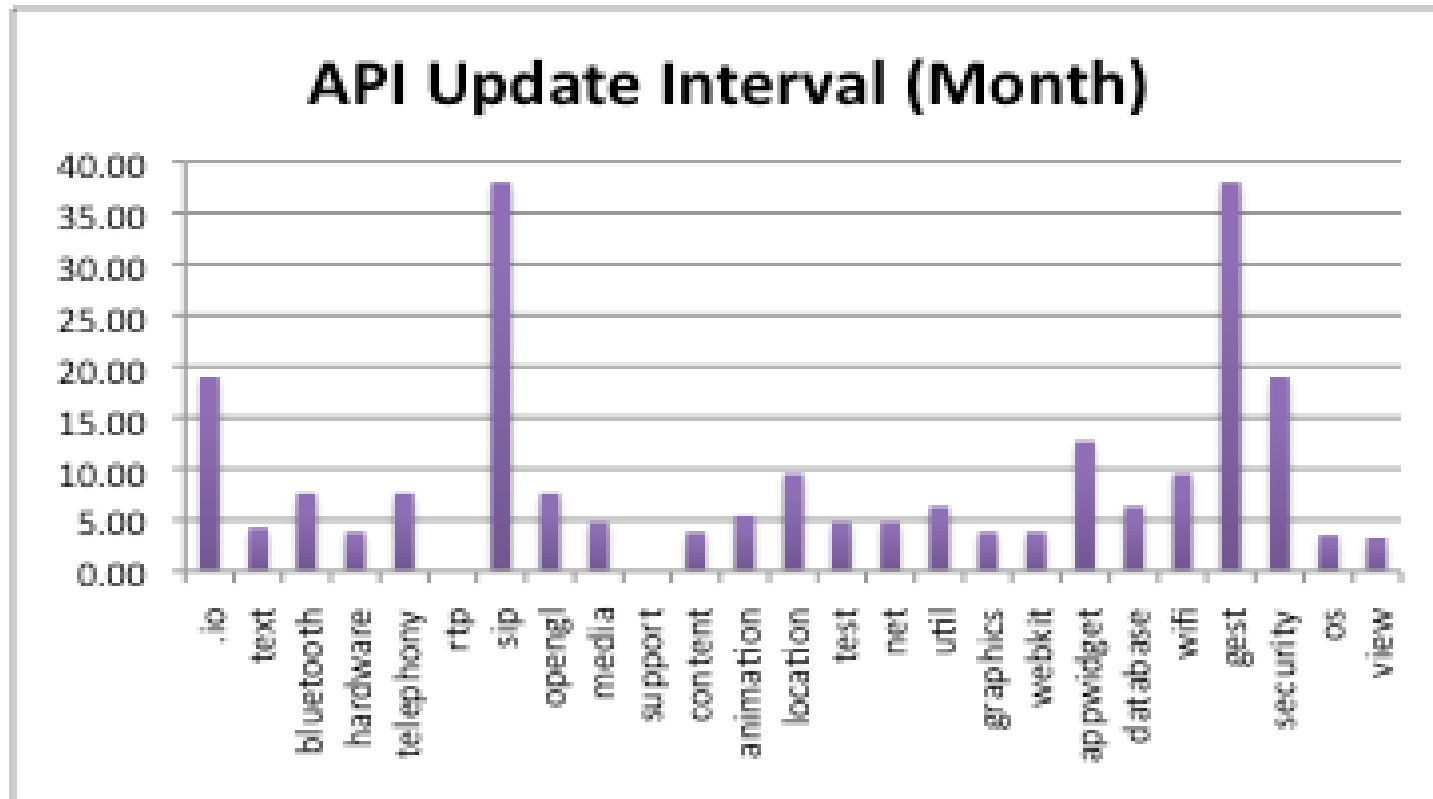
# Android OS API Evolution Characteristics

## ■ API Version 3 to 15

	Class	Method			Fields		
	$\Delta$	$\Delta$	+	-	$\Delta$	+	-
Min	37	0	0	0	7	0	0
Max	269	416	98	9	619	205	0
Avg	149	158	37	2	179	32	0
Rate	42	44	11	<1	51	9	0

Android OS is evolving fast at the rate of 115 API updates per month.

# Android API Evolution Characteristics



Hardware, user interface and web support are evolving fast.



# Data Sets : Mobile Apps

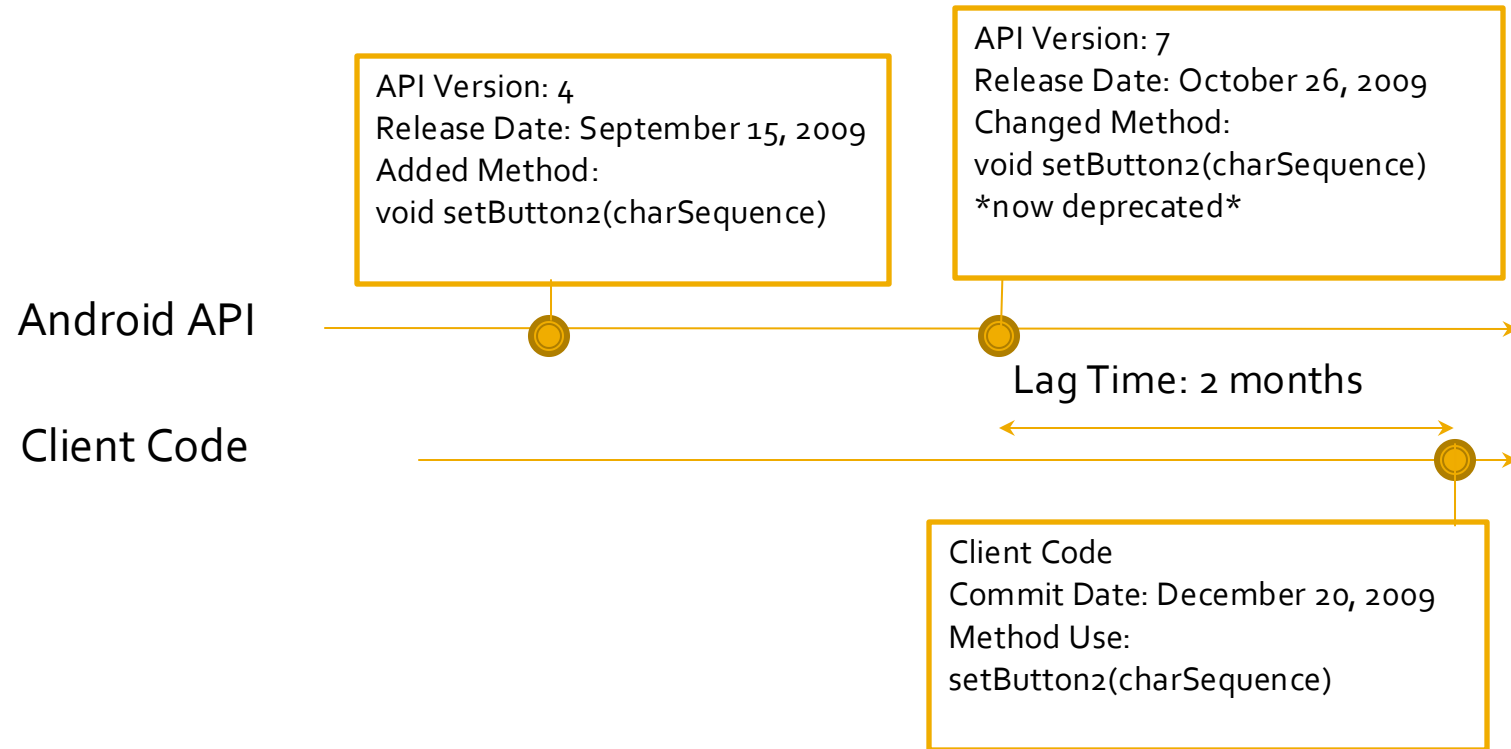
	Revision	LOC	Author	% Android Refs.
<b>Congress Tracker</b>	1359	13349	7	30%
<b>Apollo M</b>	9	15783	1	35%
<b>Cyanogen</b>	109	28972	20	24%
<b>Google Analytic</b>	926	52932	23	26%
<b>LastFM</b>	212	9771	7	16%
<b>mp3Tunes</b>	104	9608	1	22%
<b>OneBusAway</b>	497	51784	5	22%
<b>ownCloud</b>	665	25109	12	30%
<b>RedPhone</b>	116	21315	5	19%
<b>XMBCremote</b>	928	92893	24	22%

**Around 25% of all method and field references in client code use Android APIs.**

# Research Questions

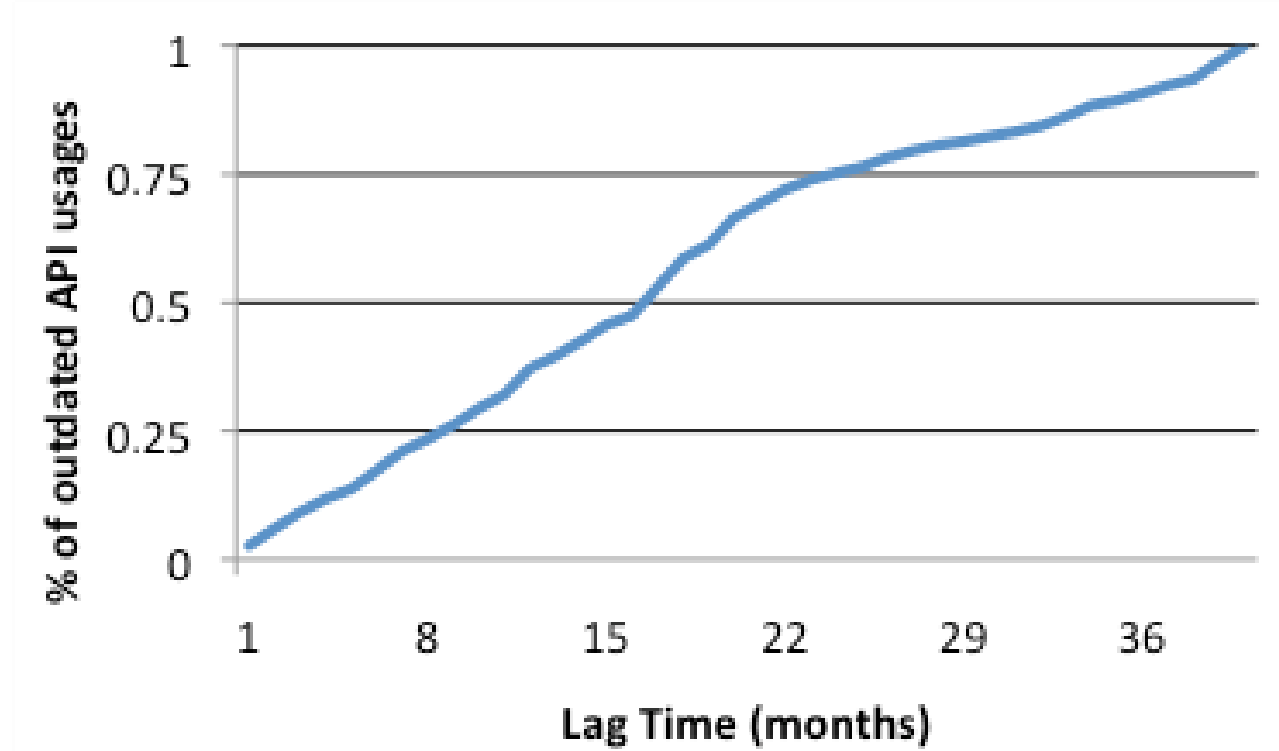
- Q1: What is the lag time between client code and the most recent Android API?
- Q2: How quickly do API changes propagate throughout client code?
- Q3: What is the relationship between API updates and bugs in clients?
- Q4: What is the relationship between API stability and adoption?

# Q1: What is the lag time between client code and the most recent Android API?



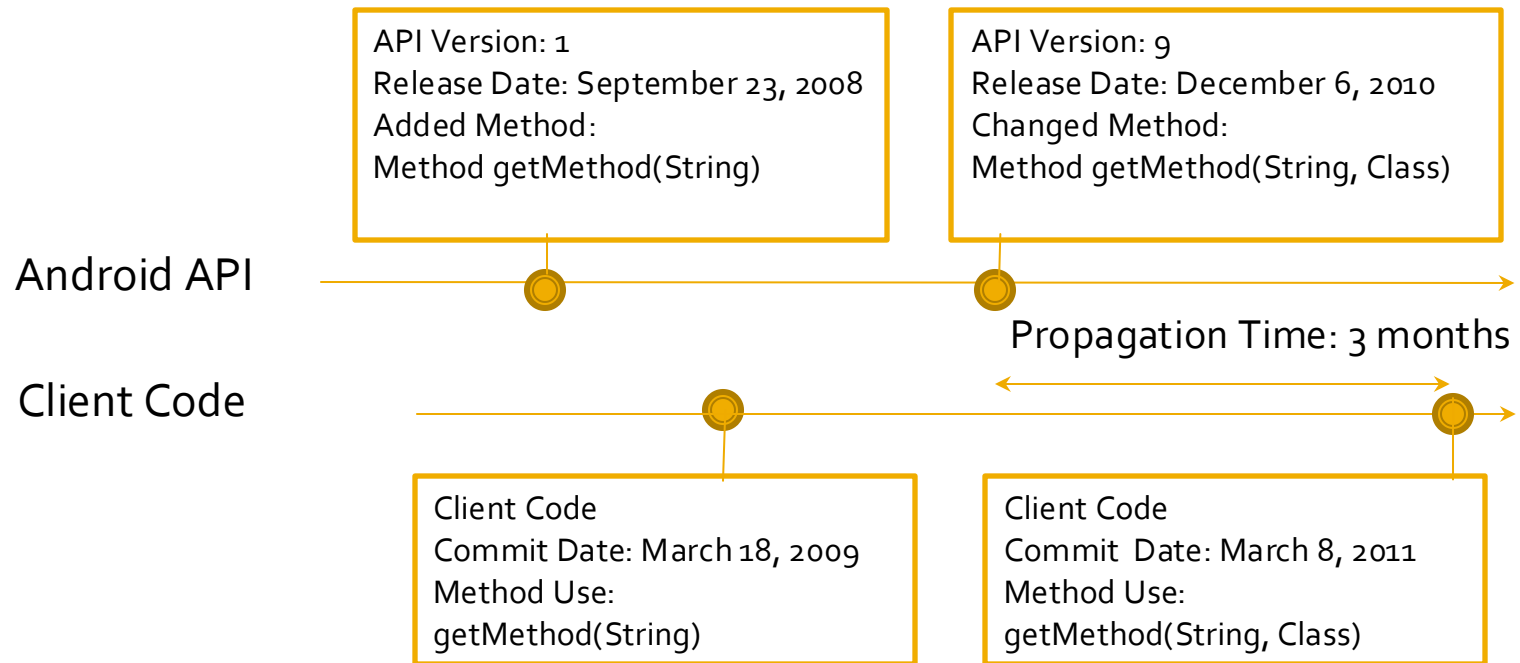
**Lag time: the number of months elapsed between the release of the new version and the commit time of the outdated API usage**

# Q1: What is the lag time between client code and the most recent Android API?



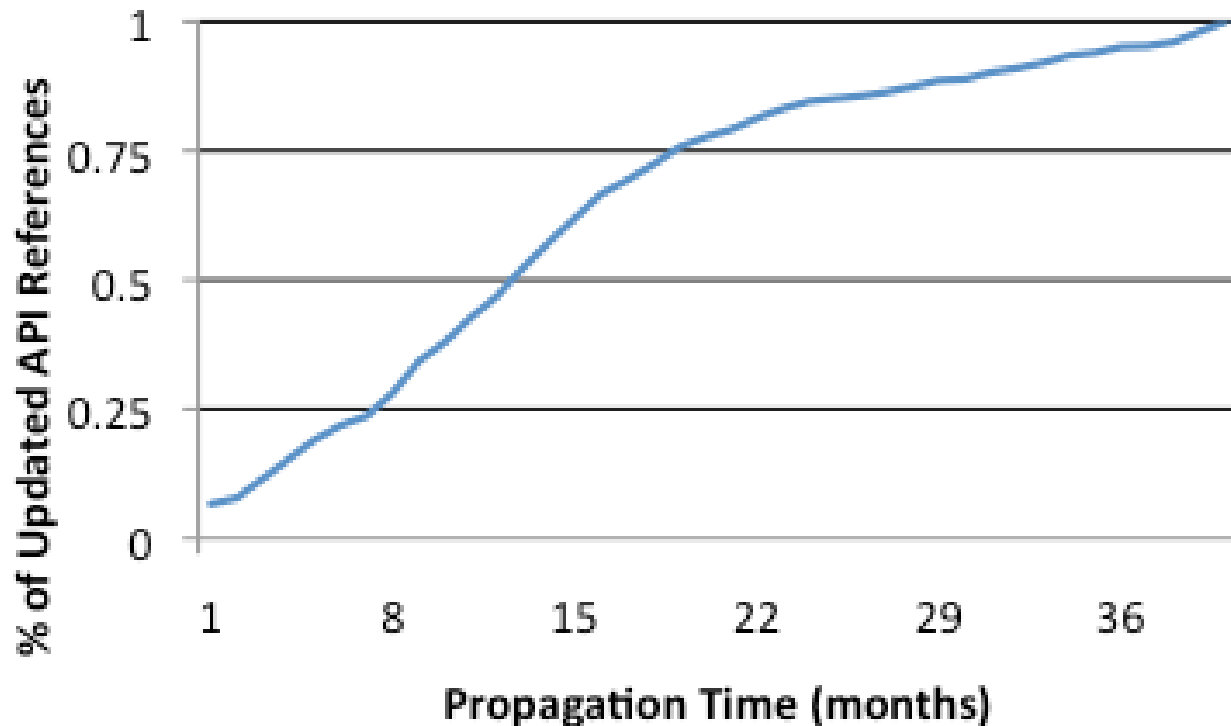
**A half of all outdated API references are lagging behind by 16 months or more.**

# Q2: How quickly do API changes propagate throughout client code?



**Propagation time: time difference in months between the API release and the timing of client adaptation**

## Q2: How quickly do API changes propagate throughout client code?



The median propagation time is 14 months. Outdated API usages upgrade to newer APIs but at a much slower pace than the API release rate.

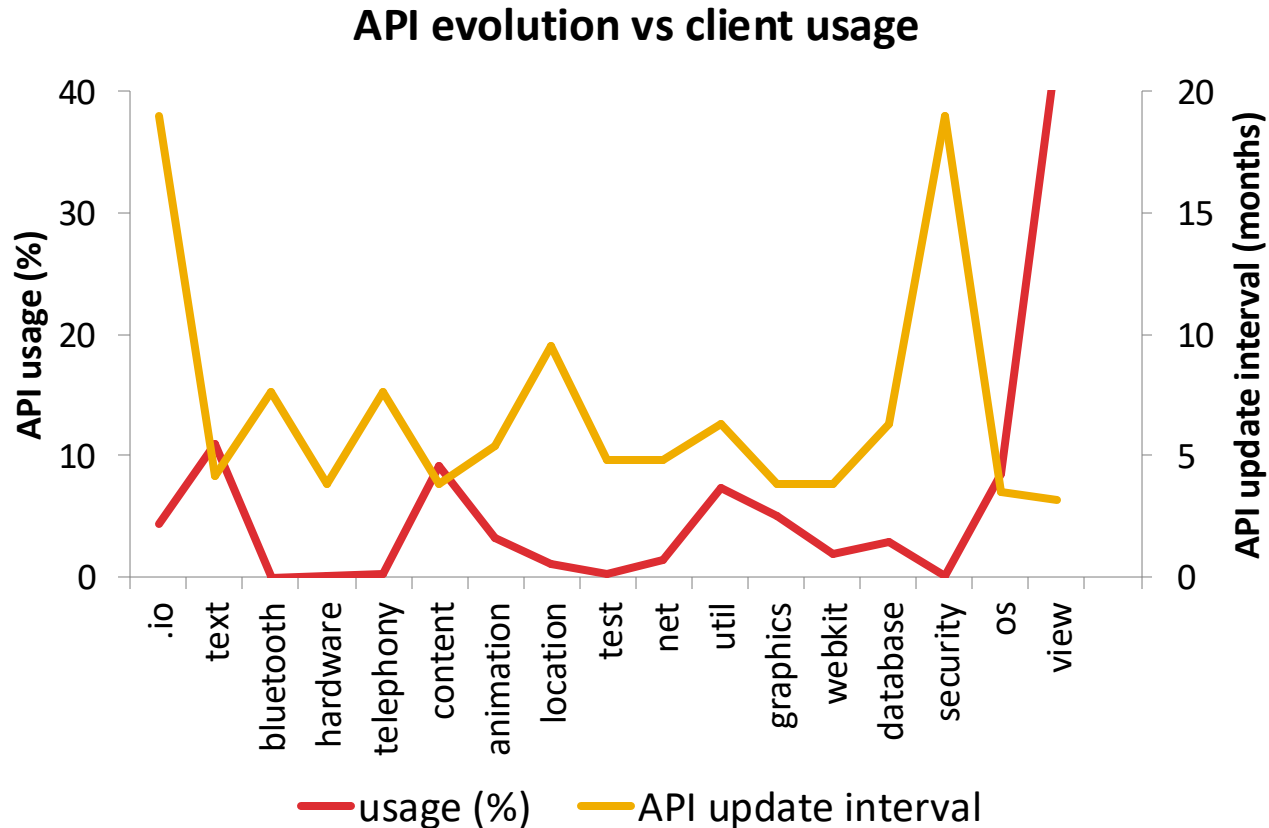


## Q3: What is the relationship between API updates and bugs?

	Spearman Correlation with bugs		
	CLOC	API Update	Non API Update
Congress Tracker	0.39	0.56	0.39
OneBusAway	0.26	0.46	0.25
RedPhone	0.23	0.24	0.23
XMBCremote	0.34	0.62	0.33
Google Analytic	0.36	0.54	0.31
ownCloud	0.43	0.55	0.42
Cyanogen	0.58	0.63	0.58
LastFM	0.42	0.37	0.43

Files with API usage adaptations are defect-prone in all applications except LastFM.

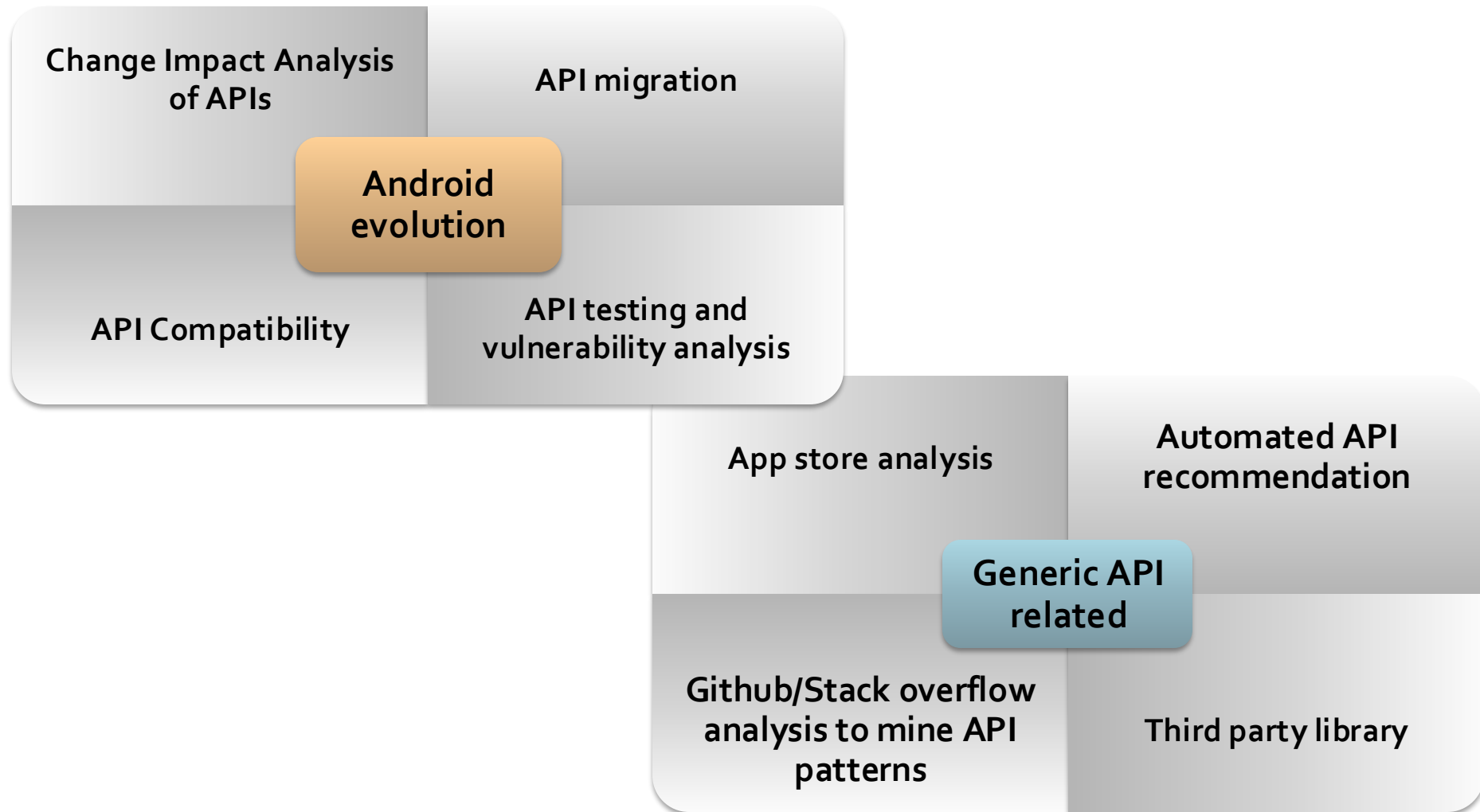
# Q4: What is the relationship between API stability and usage?



Correlation between API usage (%) and API update interval: -0.47  
Fast evolving APIs are used more by clients.

# Reflections on the paper

# SE community took this work to several directions



# Some follow-up studies on Android API evolution

More empirical analysis on API fragmentation

Session J3: Problematic Patches

CCS'17, October 30-November 3, 2017, Dallas, TX, USA



## Keep me Updated: An Empirical Study of Third-Party Library Updatability on Android

Erik Derr, Sven Bugiel  
CISPA, Saarland University  
Saarland Informatics Campus

Sascha Fahl, Yasemin Acar  
Leibniz University Hannover

Michael Backes  
CISPA, Saarland University  
Saarland Informatics Campus

Testing to handle API fragmentation

## Continuous, Evolutionary and Large-Scale: A New Perspective for Automated Mobile App Testing

Mario Linares-Vásquez<sup>1</sup>, Kevin Moran<sup>2</sup>, and Denys Poshyvanyk<sup>2</sup>

<sup>1</sup>Universidad de los Andes, Bogotá, Colombia

<sup>2</sup>College of William & Mary, Williamsburg, VA, USA

Fixing API fragmentation



## Taming Android Fragmentation: Characterizing and Detecting Compatibility Issues for Android Apps

Lili Wei, Yepang Liu, Shing-Chi Cheung  
Department of Computer Science and Engineering  
The Hong Kong University of Science and Technology, Hong Kong, China  
{lweiae, andrewust, scc}@cse.ust.hk

# Some follow-up studies on API Evolution in Ecosystem

## Understanding the Test Automation Culture of App Developers

Pavneet Singh Kochhar<sup>1</sup>, Ferdian Thung<sup>1</sup>, Nachiappan Nagappan<sup>2</sup>, Thomas Zimmermann<sup>2</sup>, and David Lo<sup>1</sup>  
<sup>1</sup>Singapore Management University  
<sup>2</sup>Microsoft Research  
{kochharps.2012,ferdiant.2013,davidlo}@smu.edu.sg,{nachin,tzimmer}@microsoft.com

## Can Automated Pull Requests Encourage Software Developers to Upgrade Out-of-Date Dependencies?

Samim Mirhosseini  
North Carolina State University  
Raleigh, NC, USA  
smirhos@ncsu.edu

Chris Parnin  
North Carolina State University  
Raleigh, NC, USA  
cjparnin@ncsu.edu



## When and How to Make Breaking Changes: Policies and Practices in 18 Open Source Software Ecosystems

CHRIS BOGART, CHRISTIAN KÄSTNER, and JAMES HERBSLEB,  
Carnegie Mellon University, USA  
FERDIAN THUNG, Singapore Management University, Singapore



# Thanks to Miryung's Students



From Right to Left

**Baishakhi Ray** (PhD 2013 ⇒ Assistant Prof @ Columbia) *Detecting Recurring Changes and Errors*

**Na Meng** (PhD 2014 ⇒ Assistant Prof @ Virginia Tech) *Automating Recurring Changes & Clone Removal*

**Tianyi Zhang** (PhD 2019, Postdoc @ Harvard) *Leveraging Redundancy for Code Review, Testing, API Usage Mining*

**Muhammad Ali Gulzar** (PhD 2020 ⇒ Assistant Prof @ Virginia Tech) *Debugging and Testing for Big Data Analytics*

**Myoungkyu Song** (Postdoc 2015 ⇒ Assistant Prof @ Nebraska, Omaha) *Error Detection in Refactoring Edits*

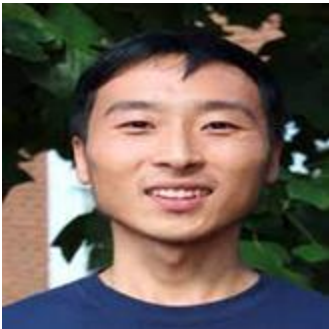
# Thanks to Baishakhi's Students



**Saikat Chakraborty** (PhD 2022  $\Rightarrow$  Senior Researcher @ Microsoft Research RiSE group)



**Kexin Pei** (PhD 2023/Postdoc  $\Rightarrow$  Assistant Professor, U Chicago)



**Yuchi Tian** (PhD 2021  $\Rightarrow$  Facebook Research)

# Thankful to ICSME “Community”



ICSM 2009 Edmonton  
My first PC



ICSM 2011 Williamsburg  
My first OC/ERA co-chair



ICSM 2013 Eindhoven



ICSM 2012 Riva del Garda



ICSME 2019  
My first PC co-chair



ICSME 2019-2022  
SC membership

# ICSM 2013 “Friendly” Memories

Meet, Learn, and Share Monday 9/23/13

Inbox x



Emily Hill hillem@mail.montclair.edu via ece.utexas.edu

Sun, Sep 22, 2013, 2:44 PM



to Lori, Lori, Anca.Ionita, U.Tikhonova, a.farcasi, anne.etien, aschwar2, bazelli, camargo, carolina.chiao, Dawi

Greetings!

Lori and I are excited to join everyone tomorrow for our Meet, Learn, and Share Session at **ICSM 2013**. Since we have this great opportunity with over a dozen ladies in software maintenance attending, **please try to think ahead about what you'd like to get out of the event** (e.g., what questions you'd like answered or partnerships you'd like to form). We will have an opportunity during the pre-dinner session to network and think about how best to address the questions & issues you bring with you.

The schedule:

4-5:45 pm Session in 2.03 Zwarte Doos (building #55 on the map [http://www.tue.nl/fileadmin/content/universiteit/Over\\_de\\_universiteit/Route\\_Plattegrond/plattegrond/actuele\\_plattegrond/90--GIP0\\_20130815\\_.pdf](http://www.tue.nl/fileadmin/content/universiteit/Over_de_universiteit/Route_Plattegrond/plattegrond/actuele_plattegrond/90--GIP0_20130815_.pdf))

5:45 pm walk to Usine, Lichttoren 6

6-8:30 pm Dinner

We look forward to seeing you at **ICSM**!

Emily & Lori





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# Most Influential Paper Award from ICSME 2013

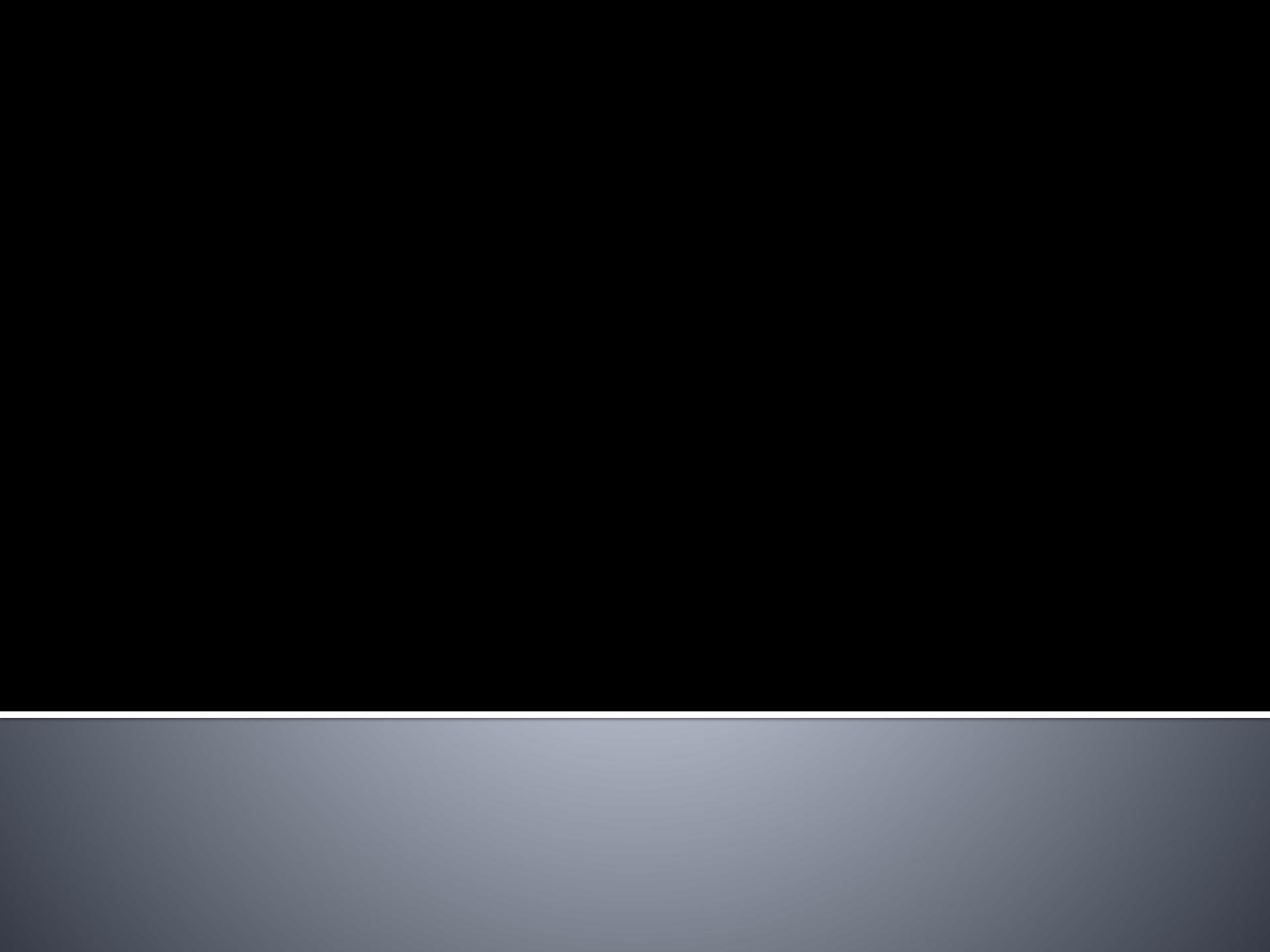
“An Empirical Study of API Stability and Adoption in the  
Android Ecosystem”

by Tyler McDonnell, Baishakhi Ray,  
and **Miryung Kim**



David Notkin  
(1955 –2013)





# Study Limitations and Future Work

- False negatives and positives in detecting API usage updates.
- Our method of detecting lagging methods does not take into account multi-version API support.
- We study the correlation between API usage, adoption, and bugs, but not causation.
- External validity beyond studied mobile apps from github.



# Summary and Future Work

- We study on the co-evolution of Android OS and its clients.
  - 28% of Android references are lagging behind the latest version with a median lagging time of 16 months.
  - 22% of outdated API references upgrade to use newer APIs. The median propagation time is 14 months.
  - Fast-evolving APIs are used more.
  - API updates are more defect prone than other types of changes in client code.

# Summary and Future Work

- Various stakeholders affect the process of API adoption in the software ecosystem. We need to identify factors affecting API adoption.
- Our goal is to automate required API adaptations in client applications using our example-based program transformation approach [Meng et al. 2013.]

# Q1: What is the lag time between client code and the most recent Android API?

	Lagging API references(%)
<b>Congress Tracker</b>	18%
<b>Apollo M</b>	72%
<b>Cyanogen</b>	12%
<b>Google Analytic</b>	37%
<b>LastFM</b>	43%
<b>mp3Tunes</b>	5%
<b>OneBusAway</b>	3%
<b>ownCloud</b>	18%
<b>RedPhone</b>	43%
<b>XMBCremote</b>	15%
<b>Average</b>	28%

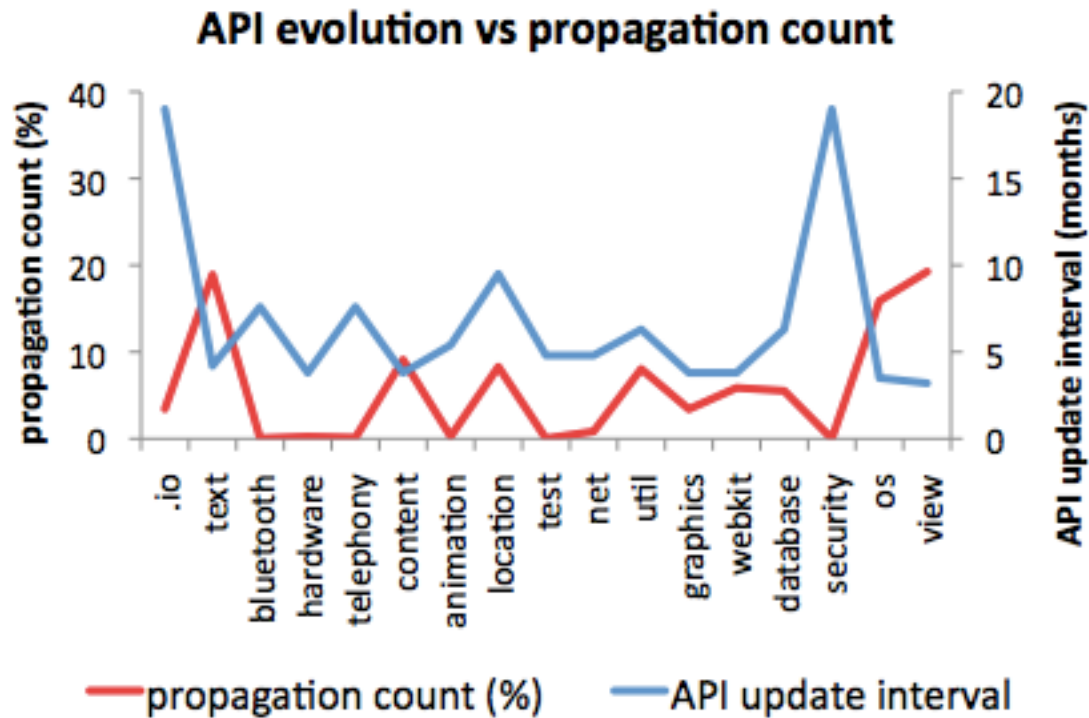
## Q2: How quickly do API changes propagate throughout client code?

	% of outdated usages that were upgraded to use newer APIs
<b>Congress Tracker</b>	45%
<b>Apollo Music</b>	0%
<b>Cyanogen</b>	27%
<b>Google Analytic</b>	34%
<b>LastFM</b>	5%
<b>mp3Tunes</b>	0%
<b>OneBusAway</b>	12%
<b>ownCloud</b>	29%
<b>RedPhone</b>	39%
<b>XMBCremote</b>	33%
<b>Average</b>	22%

# Q1: What is the lag time between client code and the most recent Android API?

	Lag (# Method)	Lagging API references(%)
<b>Congress Tracker</b>	216	18%
<b>Apollo M</b>	964	72%
<b>Cyanogen</b>	171	12%
<b>Google Analytic</b>	1409	37%
<b>LastFM</b>	181	43%
<b>mp3Tunes</b>	26	5%
<b>OneBusAway</b>	14	3%
<b>ownCloud</b>	489	18%
<b>RedPhone</b>	498	43%
<b>XMBCremote</b>	537	15%
<b>Average</b>	451	28%

# Q5: What is the relationship between API stability and adoption?



Correlation between API usage (%) and API update interval: -0.47  
Clients update to faster evolving APIs more frequently.

Client Applications	Android API	Total API	% Android API	Unique Android API
Apollo Music	1332	3820	35%	155
Congress Tracker	1007	3396	30%	82
Cyanogen	1439	5992	24%	144
Google A	3164	12145	26%	336
LastFM	371	2122	16%	64
mp3Tunes	510	2275	22%	101
OneBusAway	2416	10932	22%	297
ownCloud	1838	6132	30%	194
RedPhone	830	4303	19%	160
XMBRemote	3209	14626	22%	275

Figure 3. Degree of Android API dependence of client code



# Related Work

- Many techniques have been proposed to ease API update and version incompatibilities
- API evolution and its associated ripple effect through ecosystems are under-studied
  - Robbes et al. study how API deprecation affects client applications in Smalltalk.
- Kim et al. study the relationship between API refactoring and bugs in libraries.