Investigating Country Differences in Mobile App User Behaviour and Challenges for Software Engineering

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Analysis of app store data reveals what users do in the app store.

- We want to know why users do what they do.
- We want to know what users do *after* they leave the app store.

Motivation

- Existing research in market-driven SE and IS study country differences in software systems usage
- Findings used to inform developers when building software for different countries
- Apps are sold worldwide
- No studies on country differences in mobile app usage

Hypothesis: Differences exist in mobile app usage behaviour between countries.

These differences bring new challenges to marketdriven software engineering.

Research Questions

- RQI: User adoption of the app store concept
- RQ2:Their app needs
- RQ3:Their rationale for selecting or abandoning an app
- RQ4: Differences in behaviour (RQ1-3) between countries

RQI:App Store Adoption

- RQI.I What is the distribution of users across mobile app platforms?
- RQI.2 How frequently do users visit their app stores to look for apps?
- RQI.3 On average, how many apps do users download per month?
- RQI.4 How do users find apps?

RQ2: User Needs

- RQ2.1 What triggers users to start looking for apps?
- RQ2.2 Why do users download apps?
- RQ2.3 What types of apps do they download?

RQ3: Influencing Factors

- RQ3.1 What are the factors that influence users' choices of apps?
- RQ3.2 Given that ratings influence app selection, why do users rate apps?
- RQ3.3 Why do users pay for apps?
- RQ3.4 Why do users stop using an app?

RQ4: Differences between Countries

- Revisit all the previous research questions to identify differences across countries. E.g.:
 - Do users in different countries have different approaches to finding apps?
 - Are they influenced by different factors when they choose or abandon apps?

Methodology

• Target top 15 GDP countries

USA, China, Japan, Germany, France, Brazil, UK, Italy, Russia, India, Canada, Spain, Australia, Mexico, and South Korea

- Online survey
 - Construct questionnaire (close-ended with "other", language for 12+)
 - Pilot study
 - Translate questionnaire from English into 9 other languages (Spanish, German, French, Italian, Portuguese, Russian, Mandarin, Japanese, Korean)
 - Verify translated questionnaire

Questionnaire

- 31 questions
 - App usage
 - Demographics (gender, age, marital status, nationality, country of residence, first language, ethnicity, education level, occupation, and household income)
 - Big 5 personality traits (openness to experience, conscientiousness, extraversion, agreeableness, neuroticism)

English | <u>Español</u> | <u>Deutsch</u> | <u>Français</u> | <u>Italiano</u> | <u>Português</u> | <u>Русский</u> | <u>简体中文</u> | 日本語 | 한국어</u>



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당신이 사용하고 있는 모바일기기	는 무엇입니까?		
제조사 이름 (예, 노키아)			
기기 모델명과 번호(예, E71)			
어떤 앱스토어를 이용합니까?			
● 블랙베리 앱 월드	● 삼성 어플	리케이션 스토어	
● 구글재생 / 안드로이드 마켓	● 내 휴대 기	기에 앱을 실행할 수 없습니다	
● 노키아 ovi 스토어	● 잘 모르겠	습니다	
● 윈도우 폰 마켓	● 기타(구체	적으로 기재)	
● 애플 앱스토어			
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			>>

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Производитель (например, Нокия)		
Название и номер модели (например, E71)		
аким магазином приложен	ий вы пользу	уетесь?
 Blackberry App World 		Samsung Application Store
Google Play / Android Market		 Никаким - на моем устройстве не запускаются никакие приложения
Nokia Ovi Store		 Не знаю
Windows Phone Marketplace		 Другими (Просьба указать)
Apple iOS App Store		

Data Collection

- Total participants: >30,000
- Total responses: >10,000 (30% response rate)
- Screened out people who don't use apps & incomplete responses
- N = 4,824
- Male = 2,346 (49%), Female = 2,478 (51%)
- Aged 11-87 (avg = 34.51, std = 15.19)





Cyprus, Malaysia, Belarus, Ukraine, Colombia, Costa Rica, Indonesia, Vietnam, Sweden, Guatemala, Kazakhstan, Singapore, Chile, Puerto Rico, Thailand, Argentina, El Salvador, Peru, Philippines, Croatia, Ecuador, Greece, Norway, Panama, Paraguay, Romania, Austria, Belgium, Bolivia, Caribbean, Dominican Republic, Fiji, Ghana, Honduras, Ireland, Ivory Coast, Kyrgyzstan, Mauritius, Netherlands, Pakistan, Poland, Portugal, St. Vincent, Switzerland, Taiwan, Turkey, Uruguay, and Venezuela.

RQI.I User Distribution



15% did not know what their app store was

RQI.2 Frequency of Visit



RQI.3 Average Downloads



RQI.4 Finding Apps



RQ2.1 Triggers



RQ2.2 Reasons for Download



RQ2.3 App Types



RQ3.1 Choice



RQ3.2 Rating



RQ3.3 Payment



RQ3.4 Abandonment



Pearson's chi-squared test (χ2)

- Analyse whether there were significant differences across countries for all categorical variables
- p < 0.001 => significant difference
- Odds ratio
 - Measure the magnitude of the difference between each country and the other countries
 - Country C has an odds ratio of R for behaviour B => users from country C are R times more likely to exhibit behaviour B compared to users from the other countries

Heat Map of Odds Ratio per Variable

				Met Trigger	hods s to s	used tart lo	to fine	d apps g for a	pps				
	Reasons to download apps												
				Types o	f apps	that	users	down	load				
				Factors	s that	influe	nce a	pp cho	oice				
Reasons for rating apps													
				Reas	sons f	or pay	ing fo	or app	S				
				Reas	ons fo	or aba	ndoni	ng app	DS				
Australia	Brazil	Canada	China	France German	y India	Italy	Japan	Mexico	South	Russia	Spain	UK	USA

Korea





Australia

App users are 3 times more likely than other countries not to rate apps $(\chi 2 (I) = 47.47, p = .000)$

App users are 2 times more likely than other countries to be influenced by price when choosing apps $(\chi 2 (1) = 14.24, p = .000)$

App users are 2 times more likely than other countries to abandon an app because they had forgotten about it $(\chi 2 (I) = 9.95, p = .002)$





Canada

App users are 2 times more likely to be influenced by price when choosing apps $(\chi 2 (1) = 74.19, p = .000)$

App users are 2 times more likely not to rate apps $(\chi 2 (1) = 53.18, p = .000)$

App users are 2 times more likely to stop using an app because they had forgotten about it

 $(\chi 2 (1) = 29.8, p = .000)$



China

Users are 9 times more likely than other countries to select the first app on the list presented to them $(\chi 2 (1) = 541.92, p = .000)$

Users are 6 times more likely than other countries to rate apps $(\chi 2 (I) = 278.4, p = .000)$

Users are 6 times more likely than other countries to download apps that feature their favourite brands or celebrities $(\chi 2 (I) = 264.32, p = .000)$



France

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App users are 2 times more likely to download
catalogue apps
(\chi 2 (I) = 6.9, p = .009)
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App users are 1.5 times more likely not to rate apps $(\chi 2 (1) = 7.93, p = .005)$

App users are 1.3 times more likely to be influenced by price when choosing apps $(\chi 2 (1) = 3.89, p = .049)$



Italy

App users are 1.43 times more likely not to rate apps $(\chi 2 (1) = 7.6, p = .006)$

App users are 1.30 times more likely not to pay for apps $(\chi 2 (1) = 3.94, p = .047)$

App users are 1.21 times more likely to download travel apps $(\chi 2 (1) = 1.67, p = .196)$

Mexico

App users are 3 times more likely to pay for apps because they believe that paid apps have more features in general $(\chi 2 (1) = 45.15, p = .000)$

App users are 2 times more likely to rate an app because they were asked by the app to do so $(\chi 2 (I) = 39.22, p = .000)$

App users are 2 times more likely to pay for an app to get additional features for free apps $(\chi 2 (I) = 33.17, p = .000)$

South Korea

App users are 4 times more likely than other countries to look for apps when feeling bored $(\chi 2 (1) = 103.8, p = .000)$

App users are 4 times more likely than other countries to download game apps $(\chi 2 (I) = 59.9I, p = .000)$

App users are 3 times more likely than other countries to look for apps when they want to be entertained $(\chi 2 (1) = 61.78, p = .000)$

Russia

App users are 2.5 times more likely to download reference apps $(\chi 2 (1) = 35.6, p = .000)$

App users are 2 times more likely to find apps using search engines $(\chi 2 (1) = 51.3, p = .000)$

App users are 2 times more likely to rate apps because someone asked them to do so $(\chi 2 (1) = 11.62, p = .000)$

Spain

App users are 1.6 times more likely to find apps by looking at the featured apps section of the app store $(\chi 2 (1) = 13.16, p = .000)$

App users are 1.6 times more likely to stop using an app because it crashes $(\chi 2 (1) = 13.52, p = .000)$

App users are 1.5 times more likely to download apps to interact with people they don't know $(\chi 2 (1) = 4.45, p = .035)$

New Market-driven SE Challenges

• App store dependency [RE]

Traditional software can be sold via multiple channels. Apps can only be sold via the app store of the platform they are developed for. App store guidelines are frequently updated and vary across app stores (some are strict, e.g., App Gratis). App store guidelines are country specific (e.g., FDA). Developers need to consider app stores as important stakeholders.

Packaging requirements [RE]

App description, screenshots, name, and icon have a large influence on the visibility & number of downloads. Traditionally met by marketing teams. Country specific (e.g., cuteness).

Vast feature spaces [RE]

Traditional market-driven software offer large feature sets to meet all of the users' anticipated needs, add new features for new releases. Apps tend to have fewer features but with very frequent updates. Trends change fast. What are the optimal set of features, what to omit/include. Creative RE. Requirements prioritisation.

High quality expectations [NFR]

App users have high expectations on usability and performance - unforgiving when an app fails to meet their expectations. Different countries have different level of tolerance.

Price sensitivity [SEE]

Price influence app selection (57% do not pay for apps). Willingness to pay for apps depend on country (WhatsApp). Traditional software cost estimation techniques limited by lack of pricing data.

Ecosystem effect [SE]

Traditionally, software vendors function as independent units, where performances are largely dependent on product features, reputation & marketing efforts (e.g., Microsoft, Norton). App stores have created a software ecosystem where developers are networked and their success/failure highly dependent on one another and on app users who can influence the sale of their apps.

Investigating Country Differences in Mobile App User Behavior and Challenges for Software Engineering

Soo Ling Lim, Peter J. Bentley, Natalie Kanakam, Fuyuki Ishikawa, and Shinichi Honider

Abstract—Mobile applications (apps) are software developed for use on mobile devices and made available through app httres. App stores are highly competitive markets where developers need to cater to a karps number of users spanning multiple outrites. This work hypothesizes that there exist country differences in mobile app users harvivra and controls and of the argest surveys to date of app users across the world, in order to identify the procise nature of those differences. The survey vestigated user adoption of the app store concept, spanneds, and rationals for salesting or abandoning an app. We collected tast from more than 15 countries, including USA, China, Japan, Germany, France, Brazil, UK, Italy, Russia, India, Canada, Spain, Australia, Mexico, and South Korea. Analysis of data provided by 4,820 participants shored significant differences in ago are behaviors across countries, for source from USA are more likely to download medical apps, users from UK and e likely to be influenced by price, users from Japan and Australia are less likely to rate apps. Analysis of the new challenges to market-driven software engineering related to packaging requirements, feature space, uality expectations, app store dependency, price sensitivity, and ecosystem effect

Se Requirements/specifications, market-driven software engineering, mobile application (s, survey research, app user behavior, software product lines, software ecosystems.

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1 INTRODUCTION

1 INTRODUCTION
MOBILE apps are software applications developed for use on mobile devices such as marthpones and tables. Once developed, an app is sold via an app should ideally appeal to a far possible devices such as marthpones and the set access worldwide in order to be success tables. Once developed, an app is sold via an app should ideally appeal to a far possible devices such as marthpones and the three factors affect app developers are unaware that users should into platform, commonly known strategib built possible devices grade and the three factors affect app developers are unaware that users should into platform, similar dontable, and that these factors affect app developers for users are used when the set access and that these factors affect app developers are unaware that users developed and app to a worldwide. These challenges have caused many app is a downloads and revenues generated from the app developers for service as the tot for the set of the set of downloads, and so the set of the set of the set of the set of downloads, and so the set of the set of the set of the set of downloads, and so the set of the set of the set of the set of downloads, and so the set of th

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categories (e.g., medical apps), countries, or age groups

SL Lim, P Bentley, N Kanakam, F Ishikawa, and S Honiden (2014). Investigating Country Differences in Mobile App User Behaviour and Challenges for Software Engineering. IEEE Transactions on Software Engineering, in press.

http://www.cs.ucl.ac.uk/research/app user survey/

NewScientist Tech

Secrets of App Store revealed by artificial life forms

Modelling Apple's App Store marketplace as an ecosystem reveals what makes it thrive and which apps are likely to sell

IT IS easy to get rich as a developer on Apple's App Store - just build an app that mimics a bestseller. So why doesn't everyone get in on the act? Because the ploy ends up killing interest in the store entirely, according to researchers who built a simulation of the store to see what makes it tick.

Apple's thriving marketplace of well over 500,000 apps for the iPad, iPhone and iPod touch is a self-regulating ecosystem that doesn't tolerate copycats, say Soo Ling Lim and Peter Bentley at University College London, who modelled activity on the App Store.

Since Apple releases very little data associated with App Store interactions, Lim and Bentley built the next best thing - an "artificial life" simulation of the store. Named AppEco, it uses bits of software that obey unique behavioural rules to mimic apps, developers and consumers.

The simulation mimics four types of developer the team labelled innovators, optimisers, milkers and copycats. The copycats found it easy to make money -

Copy a killer app to make a killing KeystoneUSA-Zuma/Rex Features

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