USABLE PRIVACY POLICY AND PERSONALIZED PRIVACY ASSISTANT PROJECTS

Session III: Personalized Privacy Assistants for Mobile and IoT

Instructors:

Anupam Das, Martin Degeling and Norman Sadeh Carnegie Mellon University

> usableprivacy.org privacyassistant.org explore.usableprivacy.org

> > Copyright © 2016-2017 Sadeh et al.

What If....

Computers understood privacy policies?

Computers understood what we care about and what we already know/expect

Session III Outline

- Understanding Mobile App Privacy Preferences
- Learning People's Mobile App Privacy Preferences
- Mobile App Privacy Assistants
- IoT Privacy Preferences
- IoT Privacy Assistants & Infrastructure

Questions/Challenges

- What types of privacy preferences should we try to learn?
- Do people know their privacy preferences? Can we just ask them?
- Can we learn people's privacy preferences by observing them?
- How similar/diverse are people's privacy preferences?
- How stable are people's privacy preferences?

Historical Perspective - I

- Early work in MyCampus (2001-2006)
- Work on location sharing privacy preferences (2006-2012)
 - Comfort sharing one's location with others, under what conditions, at what level of granularity, etc
 - Exploring expressiveness and user burden tradeoffs
 - Learning people's privacy preferences (e.g. privacy profiles)



Historical Perspective - II

- Later moved to mobile app permissions (2011-present)
- ...and most recently richer IoT privacy preferences (2014present)
 - no longer just disclose vs. do not disclose
 - But also
 - retention, purpose, sharing, aggregation, etc
 - Notification preferences and expectations



Understanding People's Mobile App Privacy Preferences

7

Explosion in Number of Privacy Settings (iOS) A few iOS8 privacy screens – not even all location permission screens!

•••• AT&T LTE	9:06 AM Privacy	¥ 96% 페)	••••00 #	AT&T 4G	7:56 PM	1 69% ■)•	••••00	AT&T 후	7:57 PM	69%
	Thracy		_ 〈 Pri	vacy Lo	cation Servie	ces	< Pr	ivacy Loc	cation Service	S
Location	Services	On >	Loca	ation Ser	vices		Asib &	Yelp		\bigcirc
Contacts		>	Loca	tion Servic	ces uses GPS a	along with		Find M	y iPhone	On >
Calendar	S	>	crowe	d-sourced ions to de	l Wi-Fi hotspot termine your a	and cell tower oproximate		System	Services	>
Reminde	rs	>	locati Priva	ion. About cy	Location Serv	ices &	- A	Gyötölli		
🌸 Photos		>					A ne	ext to an ite	em that has rece	ntly used your
Bluetooth	n Sharing	>		aisle41	1	\bigcirc	A A	gray locati	on services icon	will appear
Micropho	one	>	2	ATT Wi	iFi Int'l	\bigcirc	lo	cation with	in the last 24 ho	urs.
Camera		>		Aurasn	na		A al	n outlined I opear next eofence.	ocation services to an item that is	icon will s using a
Health		>	Ó	Camer	а	\bigcirc	A	geofence i	s a virtual perim	eter around a
🙆 HomeKit		>	CNN	CNN		\bigcirc	ge	eofencing t , or leave,	o notify you whe these locations.	en you arrive
Motion A	ctivity	>								

As applications request access to your data **USABLE PRIVACY POLICY AND PERSONALIZED PRIVACY ASSISTANT PROJECTS**

People Are Often Unaware of their Permission Settings



- Privacy as a secondary task
- Lack of mechanisms to engage people and motivate them to look at settings
- Unexpected collection & sharing are widespread

J. Lin, S. Amini, J. Hong, N. Sadeh, J. Lindqvist, J. Zhang, "Expectation and Purpose: Understanding Users' Mental Models of Mobile App Privacy through Crowdsourcing", Proc. of the 14th ACM International Conference on Ubiquitous Computing, Pittsburgh, USA, Sept. 2012

Nudging Users to Engage with Settings

Privacy Nudge

Detailed Report

(R) Your location shared with 10 apps		Your location shared with 10 apps	(🛞 Your location shared with 10 apps				
Did you know? Your location has been shared 5398 times with Facebook, Groupon, GO Launcher EX, and 7 other apps for the		Number of times your location has been shared with each app for the past 14 days.			Number of times your location has been shared with each app for the past 14 days.			
		Google Play services	1603		Maps	18		
		Android System	1602		Viber	11		
Let me change my settings	G	Groupon	1602	f	Facebook	5		
Show me more before I make changes		Weather & Clock Widget	296	8	Google Search	3		
Keep sharing my location	8	GO Launcher EX	255	myfoed coach sruby	MyFoodCoach Study	3		
		Let me change my settings			Let me change my settings			
Notification provided by AppOps.		keep sharing my location			keep sharing my location			

Field Study

- 22-day study with 23 participants using their regular Android phone
- Week 1: baseline no access to App Ops
- Week 2: App Ops (email & SMS)
- Final 8 days: App Ops + one daily nudge focused on one permission
- Collected detailed logs of all permission changes + pre- and post-surveys

Demographics

- 23 participants (65% female; ages 18–34, median=23)
 21 owned Samsung devices and 2 owned an HTC One.
- On average, 89 apps installed (SD=22), including services and pre-installed apps.
- 21 (91%) reported never using AppOps before
 - 1 had used AppOps, and 1 was unsure.
 - Phase 1 showed that participants could not access AppOps until phase 2 (e.g. no other launcher app for AppOps installed).

Overview of participants' interactions with AppOps and the privacy nudges



App Permission Manager w/o Privacy Nudges (Phase 2)

- 22 (out of 23) participants (95.6%) reviewed their app permissions at least once
- 15 (65%) participants restricted 272 app-permission pairs from 76 distinct apps, including both participant-installed and pre-installed apps.
- Only one interaction where a user opened access to one permission.
- Conclusion: Permission Managers Help

Adding Privacy Nudges – Final 8 days (Phase 3)

Do nudges further change user behavior and how do users feel about them?

Effectiveness of Privacy Nudges – Final 8 days

- In phase 3, participants reviewed their app permissions
 69 times, restricted 47 distinct apps from accessing 122
 app-permission pairs, and permitted six apps access to six permissions.
-this is after a week with access to App Ops.

Reviewing App Permissions

- Participants could review their app permission either by
 - 1. opening AppOps directly (same as in phase 2)
 - 2. opening AppOps in response to a nudge

Reviewing App Permissions

 22 participants (95.6%) reviewed their app permissions at least once in phase 3.

– 21 participants reviewed their apps' permisions in The privacy nudges were the primary trigger for participants to review their app permissions.

 – 1 participant reviewed her apps' permissions only once and only by directly opening AppOps

Observations

- Privacy Nudges can help increase user awareness and motivate users to review their privacy settings
- Using settings from users who have received privacy nudges is more likely to reflect their "true" preferences

-Less likely to result in regret

 But the number of mobile app permissions remains overwhelming

Mobile App Privacy Assistant*

- Could we learn people's privacy preferences?
- Different possible models:
 - Learn privacy profiles from a collection of people, and assign users to **profiles** to generate recommendations
 - Learn from a user's existing settings (e.g. as user download more apps, start making some recommendations)
 - Combine both models
 - Another dimension: recommend vs. configure
 - Not just configuration of settings but also notification
 - Including frequency, manner, etc.

* Patent pending

Configuring Privacy Settings

- Learn People's Mobile App Privacy Preferences
 - Including analysis of permission purpose, using code analysis
- Build Privacy Profiles (clusters of users)
- Ask each user a few questions to identify a profile that best matches their preferences
- Based on their profiles and the apps on their smartphones, recommend settings

Android Permissions: Purpose Matters!



Purposes Users' Average Preferences

White \rightarrow comfortable Red \rightarrow uncomfortable J. Lin, B. Liu, JN. Sadeh, and J.I. Hong, "Modeling Users' Mobile App Privacy Preferences: Restoring Usability in a Sea of Permission Settings", 2014 ACM Symposium on Usable Security and Privacy (SOUPS 2014), July 2014.

One Size-Fits-All Defaults Don't Work



Hierarchical Clustering



Unconcerned Cluster



· Generally open to all types of disclosures

· Red in SNS/Accounts is probably a fluke - insufficient data

Fence-Sitters



Largest group of users (47.81%)

• Seem to have relatively neutral attitudes – could be habituation USABLE PRIVACY POLICY AND PERSONALIZED PRIVACY ASSISTANT PROJECTS

Conservatives



· Uncomfortable letting external libraries access their information in general

• Even for internal purposes in the case of contact list, SMS and phone state

Advanced Users



- Don't like ads and mobile analytics
- OK disclosing coarse location information, more cautious with fine location

Identifying a User's Privacy Profile

•Asking users a small set of questions (simulation)









4 Profiles: 79.4%



User Burden: One size fits all: 86.8% 4 Profiles: 36.5%

USABLE PRIVACY POLICY AND PERSONALIZED PRIVACY ASSISTANT PROJECTS

30

Learning People's Privacy Preferences with Nudges



"Follow My Recommendations: A Personalized Privacy Assistant for Mobile App Permissions", B. Liu, M. Schaarups Andersen, F. Schaub, H. Almuhimedi, S. Zhang, N. Sadeh, A. Acquisti, Y. Agarwal, Proc. of the USENIX Symposium on Usable Privacy and Security, SOUPS 2016, June 2016

Privacy Profiles – Hierarchical Clustering



- App categories along vertical axis; Permissions along horizontal axis
- Clustering based on triples for each user: <app category, permission, purpose purpose can be obtained via static code analysis – similar to previous study
- Profile-based recommendations using SVM

Dialogue with Users: Profile Assignment & Setting Recommendations



Field Study: Evaluating the Recommendations

- **Recruited Android Users**: installed the privacy assistant on their actual Android phones; observed them as they used their phones and their apps as part of their regular activities
 - Day 1 and 2: collected usage data
 - Day 3: interaction with Privacy Assistant
- Starting on Day 4, participants were subjected to nudges for an additional 6 days to see if they wanted to modify their settings
- Total of 72 participants
 - 49 treatment condition Privacy Assistant
 - 22 control condition

Breakdown by User



Results (Treatment condition)

- Users accepted 78.7% of Privacy Assistant's recommendations
 - Could probably do even better with larger training set & more personalized learning
- Users showed great engagement as they received nudges for 6 days following interaction with the recommendations

A number of settings not covered by the recommendations were modified

 Only 5.1% of accepted recommendations were modified over the 6 days

Mobile App Privacy Assistant* [ROOT] Privacy Assistant



🖬 🗄 # 🕈 🙋

To help the privacy assistant

a few quick questions.

Mobile Commerce Lab @ Carnegie Mellon University Tools $\star \star \star \star \star \star 4$ **E** Everyone Add to Wishlist Install 🖬 🛛 # 🖣 🙋 72 2 2:32 🖬 🖻 # 🖣 🥶 ♥⊿ 🛿 2:10 💎 🖉 🛿 2:10 Tell Us About Your Privacy Preferen... **Privacy Assistant Privacy Assistant** In general, do you feel In general, do you feel recommend settings, please answer comfortable with Social comfortable with Finance C 0 apps accessing your apps accessing your Camera? Location? Social apps installed on your phone accessing Camera: Finance apps installed on your phone sing Location G PayPal Google+

 $\mathbf{37}$

(You will be asked up to 5 questions. This shouldn't take more than a couple of minutes.) f Facebook Citi Mobile 0 Snapchat Chase MOSTLY NOT MOSTLY MOSTLY NOT MOSTLY NO SLIRE OK NO SURE OK * Patent pending **USABLE PRIVACY POLICY AND PERSONALIZED PRIVACY ASSISTANT PROJECTS**

Mobile App Privacy Assistant Demo

Pure Prediction vs. Interactive Model



239K LBE users, 12K apps, 14.5M records

With more labeling of users, we can increase the accuracy of our predictions.

If users can label an additional 10% of their permission decisions, the **prediction accuracy will climb from** 87.8% to 91.8%...and that's only 6 questions...

At 20% (about 12 questions), accuracy climbs to 94%!

IoT Challenges

IoT entails additional challenges:

- No App Stores
- No (standardized) UI
- Often hidden, embedded
- More ways of collecting personal information
- Explosion in number of devices and services (scale)



Our Goals

- Support notice and choice in IoT
- Objective: Selectively notify users without overwhelming them & helping them configure available settings

Capture user privacy preferences

- Notification preferences (when, how, how often)
- Data collection & sharing preferences

Building an Infrastructure*



Internet of Things Resource Registry (IRR)

- Advertises privacy practices (including any privacy settings) and capabilities of IoT resources (e.g., apps, sensors, services)
- Multiple registries controlled by different entities



Personalized Privacy Assistants (IoT Assistant)

- Discovers IoT resources, their capabilities, and privacy practices (including any privacy settings)
- Learns user preferences; supports selective user notification, and semi-automated configuration of settings



Policy Enforcement Point (PEP)

- Captures and stores user-specific privacy settings (e.g., opt in/out)
- Enforces users' privacy settings

* Patent pending

Theme Park Example



Key Features of the IRR

- Support for multiple (cloud based) IRRs per location
- Multiple types of owners, some IRRs more tightly managed than others (e.g. corporate, municipal, office, home)
- Multi-user support with role based access control (managing drafts and published resource descriptions)

About the IoT Resource Registry

Support for multiple and geographically overlapping IRRs

source Registry is infrastructure that enables IoT service providers to connect with users. IoT-connected systems out collecting, storing, and processing sensitive data without ever being evident. Using information propagated e registry, we can empower choice by exposing IoT-connected systems and their privacy-relevant configuration service can be notified about their potential encounters with IoT-connected systems in the physical world.

Using the Registry

IoT service and resource owners register their services' and resources' information, location, and configurable options. Users can then see what data collection efforts are occurring within the physical area of the registry's oversight. Users can browse and select configuration options relevant to their personal engagement with systems made discoverable by the registry. These options can include opting in or out, as well as other parameters that can be configured to suit their individual expectations of privacy.

CLICK TO LEARN MORE



About the IoT Res

The **IoT Resource Registr** may go about collecting, through the registry, we c options. Users can be not

Using the Registry

Administration and access control settings enables IoT service providers to connect with users. IoT-connected systems sensitive data without ever being evident. Using information propagated exposing IoT-connected systems and their privacy-relevant configuration ial encounters with IoT-connected systems in the physical world.

IoT service and resource owners register their services' and resources' information, location, and configurable options. Users can then see what data collection efforts are occurring within the physical area of the registry's oversight. Users can browse and select configuration options relevant to their personal engagement with systems made discoverable by the registry. These options can include opting in or out, as well as other parameters that can be configured to suit their individual expectations of privacy.

CLICK TO LEARN MORE



About the IoT Resource Registry

The **IoT Resource Registry** is infrastructure that enables IoT service may go about collecting, storing, and processing sensitive data with

through the registry, we can empower choice by exposing IoT-connected systems and their privacy-relevant configuration options. Users can be notified about their potential encounters with IoT-connected systems in the physical world.

Using the Registry

IoT service and resource owners register their services' and resources' information, location, and configurable options. Users can then see what data collection efforts are occurring within the physical area of the registry's oversight. Users can browse and select configuration options relevant to their personal engagement with systems made discoverable by the registry. These options can include opting in or out, as well as other parameters that can be configured to suit their individual expectations of privacy.

CLICK TO LEARN MORE



Multi User Support: Local, or Google-based account registration and authentication

T-connected systems mation propagated

🧕 Martin Degeling 🗸

View and Manage Resources

 IRR stores and retrieves information about registered resources:

 Location, capabilities, configuration options, privacy "short notice"

 Add new devices from scratch, or use builtin templates for common devices
 Multi-User Support

IRR-BETA Administration - Resource Management -



🔍 Martin Degeling 👻

IRR-BETA Administration - Resource Management -

🔍 Martin Degeling 👻

 Search registered resources
 Sort by

 Below is a list of all the IoT resources that are registered to this IRR. Only those that are marked as "published" will be visible to IoT Assistants (the mobile client that resource users will use to discover and browse registered IoT resources).
 Select Template

 You can register new resources by either starting from scratch, or select a template corresponding to a specific type of IoT resource. Templates will fill in registration fields specific to that type of resource, allowing you to personalize the parameters specific to your deployment.
 Select Template

Administrators and resource owners control

whether

resources are

published for

others to discover

Google Home

Google Home is a voiceactivated speaker. It is powered by the Google Assistant. Ask it questions. Tell it to do things. And with support for multiple users, it can distinguish your voice from others in your home so you get a more personalized experience. It's your own Google, just for you.

Registered on Jul 3, 2017 by Martin Degeling

Is published

CMU Urban Video Analytics Testbed

This installation is an initial prototype unit for the CMU Urban Video Analytics Testbed, which is an initiative involving the Intel Science and Technology Center for Visual Cloud Systems (ISTC-VCS) at CMU and the Metro 21 Initiative at CMU.

Registered on Jun 28, 2017 by Martin Degeling

Is published



This zensor detects how many people are waiting in line at iNoodle Registered on Jun 28, 2017 by Martin

Is published

Degeling

EW EDIT

FeelingSpector

The FeelingSpector computes the average mood of the users in front of them.

Registered on Jun 28, 2017 by Martin Degeling

ls published

EDIT



Google Home

Google Home is a voiceactivated speaker. It is powered by the Google Assistant. Ask it questions. Tell it to do things. And with support for multiple users, it can distinguish your voice from others in your home so you get a more personalized experience. It's your own Google, just for you.

Registered on Jul 3, 2017 by Martin Degeling

Is published

CMU Urban Video Analytics Testbed

This installation is an initial prototype unit for the CMU Urban Video Analytics Testbed, which is an initiative involving the Intel Science and Technology Center for Visual Cloud Systems (ISTC-VCS) at CMU and the Metro 21 Initiative at CMU.

Registered on Jun 28, 2017 by Martin Degeling

Is published



iNoodle Zensor

FeelingSpector



Specify the Area of Oversight

- **1. Specify the area the IRR oversees:**
 - This is the area or areas where resources will be advertised to IoTAs
- 2. Specify locations for resources separately as you register them:
 - Be as precise as you like; optionally, don't specify a location

IRR-BETA Administration - Resource Management -

🔝 Martin Degeling 🚽



IRR-BETA Administration - Resource Management -

🧕 Martin Degeling 🚽



 What organization/individual owns and operates the devices or system of devices?
 Link to additional information

 Various partners at CMU
 Description
 https://

Specify Privacy Practices

- Easy process to register new resources:
 - Novel devices, sensors, etc. can be registered immediately
 - Informally specify resource capabilities
 - Generates "short notice" containing resource data practices
- Small number of required fields



Fields Based on Policy Schema

- Machine-readable policy schema
- Can represent various types of information on privacy practices for users, e.g.
 - Location
 - Granularity of data collection
 - Retention
 - Purpose
 - Sharing



Pappachan et al. "Towards Expressing Privacy Requirements in Smart Buildings." (IoTCA 2017)

R-DETA Administration	ment 🗸				Martin Degeling -
i Basic Information	Collected Data	? Purpose	⑦ Times and Retention	Shared With	Control Options
				CANCEL	SAVE
Basic Information	Link to general information about this n https://www.amazon.com/Amazo	esource on-Echo-Bluetooth-Spea	ker-with-WiFi-Alexa/dp	/B00X4WHP5E	Start simple, add more details later.
Description Voice command device that performs a variety of	functions				Only a few fields a required to create valid registry entry
URI of an image that is displayed as logo or icon		Privacy Policy			
URI of an image that is displayed as logo or icon https://images-na.ssl-images-amazon.com/image	s/I/41iz5Tw82ILAC_US218_jpg	Privacy Policy https://www.amazon.o	:om/gp/help/custome	r/display.html?nodeld=2	01809740
URI of an image that is displayed as logo or icon https://images-na.ssl-images-amazon.com/image 	s/l/41iz5Tw82IL_AC_US218_jpg Type of Resource *	Privacy Policy https://www.amazon.o	om/gp/help/custome	r/display.html?nodeld=2	01809740



Enabling Privacy Choice

- Define privacy options for resources that end-users can individually configure
- 2. Specify control endpoints (i.e. REST, APIs) for resources' configurable options
- 3. Requests are authenticated

Multi-User Home Setup Scenario



1. Alice is setting up a new internet enabled thermal camera in her home, to keep an eye on her pets.

2. Alice registers the camera with her home IRR to inform visitors



5. Bob's IoTA exposes the option to disable Alice's camera while he is there.

IoTA Privacy Assistant

4. Bob's IoTA discovers Alice's IRR and its policies. Bob's IoTA knows that he prefers *not* to be recorded on video in private spaces.

contro Co

about it, and let them control recording.

3. Bob visits Alice.



IoT Assistant: Functionality

- 1. The **IoTA connects users with relevant IRR(s)** based on their location
- 2. Shows list of registered resources under the oversight of connected IRRs

IoT Assistant: Key Features

- 1. Informs user about privacy practices
- **2. Exposes privacy settings** that may (or may not) be available for user to configure

In the future...

Semi-automatically leverage user privacy preferences:

- What to notify the user about?
- When to notify (including how often)?
- How to notify (e.g. buzzing, vibrating, flashing, etc.)?

Naeini et al. "Privacy Expectations and Preferences in an IoT World." SOUPS 2017



IoT Assistant





Example: Privacy-Aware Video Streaming



Obfuscates faces being recorded in video streams in real-time.

Wang et al., "A Scalable and Privacy-Aware IoT Service for Live Video Analytics", MMSys 2017 (Best Paper Award)

Das, Anupam et a. "A Privacy-Aware Infrastructure for Using Facial Recognition." (CV-COPS 2017)

Automated Attendance Tracker







Demo

USABLE PRIVACY POLICY AND PERSONALIZED PRIVACY ASSISTANT PROJECTS

66

Discussion: Possible Uses of IoT Privacy Infrastructure

- Is this something that you could see your company/university deploy at some point?
- Is this something that you could see a use for in your home?
- Is this something that you wish your city or your mall would deploy?
- Is this something that you could use as a researcher/developer?
- What features would you be most likely to use/want?



Session III Recap

- People's privacy preferences are complex and malleable
- Explosion in permission settings
- Opportunity to learn people's privacy preferences not just to help users configure settings but also to learn when to notify users (situations, frequency, manner)
- Nudges can be used to increase to fidelity of permission settings
- Profile-based mobile app permission assistant
- IoT Infrastructure for IoT privacy assistant incl. registries

More Information?

- See our Poster tonight!
- Ask one of us for a demo while at the conference
- The **Privacy Assistant Project** involves a collaboration with a number of individuals.
- See **privacyassistant.org** for additional details incl. lists of collaborators, publications, sponsors and recent news
- Subscribe to our mailing list to stay up to date -<u>https://www.privacyassistant.org/contact</u>

