### **PlaceRaider** Virtual Theft in Physical Spaces with Smartphones

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# Today's smartphones are highly capable sensing platforms



http://www.google.com/mobile/skymap/









www.kronospark.com



# These sensors allow for a new generation of **sensory malware**

#### Hearing credit card numbers



Soundcomber Schlegel et al. NDSS 'I I

#### **Feeling** keystrokes with accelerometer



(sp)iPhone Marquardt et al. CCS 'I I



TouchLogger Cai and Chen HotSec '11





## We explore sensory malware with the sense of sight (beyond taking compromising photos)

### Virtual Theft

## Performing remote reconnaissance and targeted theft using the victim's camera



#### Attacker **loses control** of the camera Faced with a **data deluge** Cannot make sense of the environment

Can the attacker reconstruct a **3D model** of the victim's space for structured navigation?





## Building 3D models from images



http://phototour.cs.washington.edu/bundler/

Photo Tourism, Snavely et al. 2006 Building Rome in a Day, Agarwal et al. 2009 Building Rome on a Cloudless Day, Frahm et al. 2010 Accurate, Dense, and Robust Multiview Stereopsis, Furukawa et al. 2010 SfM with MRFs, Crandall et al. 2012





# Can we generate good 3D models from surreptitiously taken photos?

Deliberate Photos





#### Opportunistic Photos







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#### Opportunistic Photos







#### Collecting data





























## Collecting Images











## Disabling image previews and shutter sounds









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## Disabling image previews and shutter sounds



camera.setPreviewDisplay(null)

AudioManager.setRingerMode(AudioManagerRINGER\_MODE\_SILENT) camera.takePicture(null,null,jpegCallback); AudioManager.setRingerMode(AudioManagerRINGER\_MODE\_NORMAL





# PlaceRaider Trojan requires innocuous permissions

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# PlaceRaider Trojan requires innocuous permissions



## Removing low-quality images









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#### **Anisotropic** analysis

(Gabarda and Cristobal 2007)

Variance in directional pixel entropy as a measure of image quality

or

'edginess'







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## Guided removal of redundant images









## Guided removal of redundant images

#### **Movement-based reduction**



$$\Theta t = (\Theta_X t, \, \Theta_Y t, \, \Theta_Z t) \quad \Delta \Theta t = II \Theta t + 1 - \Theta t II$$



Identify sequences of images within some rotation threshold





## Guided removal of redundant images

#### **Movement-based reduction**



## Keep the image in each series with the highest anisotropic index





## Building a 3D model









## Building a 3D model

#### Bundler

sparse 3D reconstruction of camera and scene geometry <a href="http://phototour.cs.washington.edu/bundler/">http://phototour.cs.washington.edu/bundler/</a>

#### PMVS2



## Navigating the Data









## Navigating the Data

#### Meshlab - Point cloud (.PLY) viewer

#### custom plugin to select vertices and list contributing images JExifViewer - image viewer integrated with plugin explore and manipulate presented image sets







## Evaluation

# Study I: Can we build 3D models from opportunistically collected photos?

20 participants Android HTC Amaze phone Surreptitious collection in lab tests took ~20-45 minutes µ<sub>images</sub>=864/test

#### Tasks

1. Please SIT in the swivel chair for the following activity: Check the local weather on the browser (Perform a Google search for "47405 weather")

2. Please SIT in the swivel chair for the following activity: Go to the IDS News website and read no more than four paragraphs of the first article on the website (do not click through to other sites).

3. While holding the phone: Remove the folder from the bag and place it on the desk.

4. Please SIT in the swivel chair for the following activity: Hold the phone to your ear and pretend you are in a phone conversation for 3 minutes. You do not need to speak during this pretend call. It is okay to change positions of the phone during this pretend call (e.g., move the phone to another ear if you arm gets tired).

5. Please STAND during the following activity: Take a picture of the whiteboard.

6. Please STAND during the following activity: Put the phone in your pocket.

7. Please WALK around the room for the following activity: Pull the phone from your pocket, and pretend to have a 3 minute phone conversation as before. You do not need to speak during this pretend call. Walk naturally and comfortably through the room during this pretend call. It is okay to stop periodically if you are tired.

8. Please SIT in the NON-swivel chair for the following activity: Check the local weather again on the browser (Perform a Google search for "47405 weather")





## Examined 3D reconstructions for each participant's dataset

#### Model quality varied (partly a function of # of images)



#### Average reduction of 73.2% in # of images per test





#### http://www.youtube.com/watch?v=ltA791RGvrM





# Study 2: Do these 3D models aid virtual theft?



**Coarse features** - walls, doors, pieces of furniture, etc.

Fine features - checks, barcodes, monitors, whiteboard, etc.





# PlaceRaider is useful for reconnaissance and exploration

#### **Coarse features - 3D group performed better**

Raw images: 5.8% of raw features correctly identified ( $\sigma = 45.8\%$ ) 3D model + viewer: 86% ( $\sigma = 10.2\%$ ) (Welch's t-test, p < 0.002)

#### Fine features - no statistical significance between groups People can visually process images at high rates, (20 images/second)

But 3D models may perform better in larger reconstructions





### Defending against sensory malware like PlaceRaider - it's complicated





www.mysecuritysign.com

#### **OS-based defenses**

Require a substantial **preview** surface object

Hardwire a **shutter sound** or add another hardware **indicator** 

**User driven** access control (Roesner et al., Oakland '12)





## In conclusion...

Visual malware enables sophisticated reconnaissance and 'virtual theft'

This threat is only amplified with augmented reality and first-person video applications

Need generalizable defenses to counter sensory malware











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## **Backup Slides**





## Stealthiness of PlaceRaider

#### Power

At maximal collection rate (1800 photos/hr) power draw is comparable to other applications. Tested on HTC Amaze.

#### Bandwidth

Transmit images only when connected to WiFi networks



Max image collection rate	1800 images/hr
Expected reduction	0.261
Avg file size (IMP)	0.138 MB/image
Avg data bandwidth	64.83 MB/hr





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## Current permissions are too loose

#### Fine-grained permissions are necessary!

Enck et al. (2009), Nauman et al. (2010), Felt et al (2011), Jeon et al. (2011)

Don't take pictures at workDon't take pictures between 9PM and 3AMDon't take pictures in barsDon't take pictures in bathroomsDon't take pictures of my monitorDon't take pictures of me in VegasOnly take pictures that I commandDon't take pictures of me naked



