# All Your Face Are Belong to Us: Breaking Facebook's Social Authentication

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### **Outline**

- Introduction
- Social Authentication
- Breaking Social Authentication
- Experimental Evaluation
- Remediation Measures
- Discussion
- Conclusions

### Introduction

- Social Networks
  - Massive user base (Facebook: 1 Billion active users)
  - Appealing targets
- Compromised accounts sold in underground markets
- Majority of spamming accounts compromised, not fake [ Gao et al., IMC 2010]
- Recent Facebook phishing attacks
  - Use compromised accounts
  - Steal personal info
  - Social engineering

### Social Authentication (SA)

- Two-factor authentication scheme
  - 2nd factor: something user knows
  - Difficult for the attacker to learn
- More user-friendly
  - No need for physical tokens
  - Easy for people to recognize their friends
  - People accustomed to tagging friends (creating the labeled dataset for Facebook)

### Social Authentication (SA)







#### This appears to be:

- Jason Polakis
  Federico Maggi
- Marco Lancini
  Sotiris Ioannidis
- Georgios Kontaxis
  Angelos Keromytis
- 7 challenges
- 3 photos per challenge
- 6 possible answers
- User has to correctly answer 5/7 challenges

### Motivation

"Can adversaries break SA in an automated manner?"

### Triggering Social Authentication

- When log-in considered suspicious
  - From geo-location never seen before
  - From device never seen before

- Requirements
  - Friend list: 50 Friends
    - Gradually increased # of friends in dummy accounts
  - Tagged photos
    - Friends must be tagged in adequate # of photos

### **SA Photo Selection**

"Are photos randomly selected?"

- 2,667 SA photos from real SA tests checked
  - 84% containing faces in manual inspection
  - 80% in automatic inspection by software
- 3,486 random Facebook photos checked
  - 69% contained faces in manual inspection
- Face detection procedures used for selecting photos with faces

### **SA shortcomings**

- Number of friends influences usability
  - Difficult for users with many friends
  - Dunbar's number
- Content of photos
  - May not contain faces, or even the user tagged
  - Initial user feedback expressed frustration
- Current implementation by Facebook
  - Users can bypass SA by entering date of birth
    - Trivial for attackers to obtain

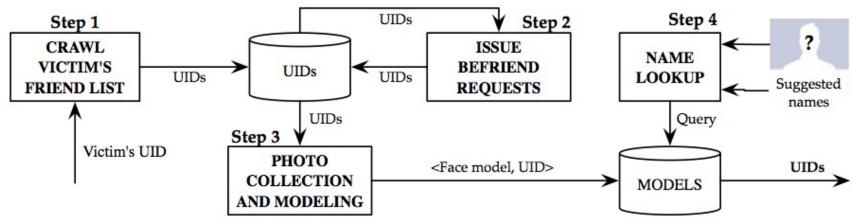
#### Threat model

- SA considered safe against adversaries that
  - Have stolen credentials
  - Are strangers (not members of the victim's social circle)
- Not safe against friends or family
- Or any tightly connected network (e.g. University) [Kim et al., FC '12]
- We demonstrate SA not safe even against strangers
  - Publicly available data
  - Face recognition software

### **Attack Scenarios**

- Casual Attacker
  - Collects publicly available data
- Determined Attacker
  - Penetrates victim's social circle
    - Befriends victim's friends
  - Employs fake accounts
    - Different characteristics appeal to different demographics [Irani, DIMVA '11]
  - Collects as much private data as possible

#### **Breaking Social Authentication**



- Crawling Friend List (offline)
  - Crawler retrieves names and UIDs of target's friends
- 2. Issuing Friend Requests (offline, optional)
  - Can use dummy accounts
- Photo Collection/Modeling (offline)
  - Photo collection
  - Face extraction and Tag matching
  - Facial Modeling
- 4. Name Lookup

## Face recognition

- Custom solution
  - Based on OpenCV library
  - + Versatility in parameter tuning
  - + Offline
  - Not as accurate
- Cloud Service
  - Face.com (subsequently acquired by Facebook)
  - Exposes API to developers
  - + Superior accuracy
  - API rate limiting

### **Experimental Evaluation**

- We collect data as casual attackers (publicly available data)
  - We have not compromised or damaged any user accounts (as if I'd ever tell...:-)
- Determined attacker experiment
  - Through simulation
  - Custom face recognition software (flexible)
- Casual attacker experiment
  - Using face.com (accurate)

# Dataset

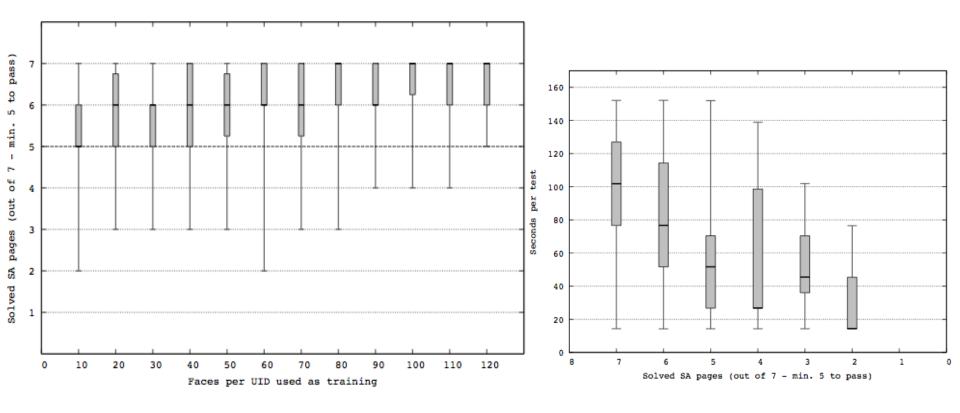
	TOTAL	PUBLIC	PRIVATE
UIDs	236,752	167,359	69,393
Not tagged Tagged	116,164 120,588	73,003 94,356	43,161 26,232
Mean tags per UID:		19.39	10.58
Tags <sup>9</sup>	2,107,032	1,829,485	277,547
Photos	16,141,426	16,141,426	(not collected)
Albums	805,930	805,930	(not collected)

#### Breaking SA: determined attacker

- Attacker has access to "all the photos"
- Selected users with enough photos as friends
- Extract faces from photos

- Train our system with K = 10, 20, .., 120 faces per friend
- Simulated SA tests from public photos
- Generate 30 simulated SA tests from photos not used for training

#### Breaking SA: determined attacker



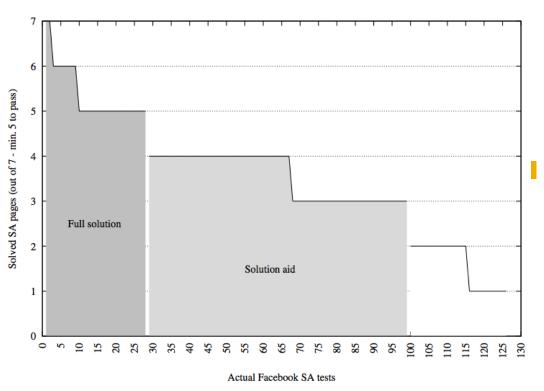
Successfully passed pages as a function of the training set.

Time required to lookup photos as a function of solved pages.

### Breaking SA: casual attacker

- Use our dummy accounts as "victims"
- Automated SA triggering through ToR
- Collect snapshot of 127 real SA tests
  - Manually answered the CAPTCHA
- Use face.com to break the tests (challenging conditions)
- ~44 seconds to solve a complete test

### Breaking SA: casual attacker



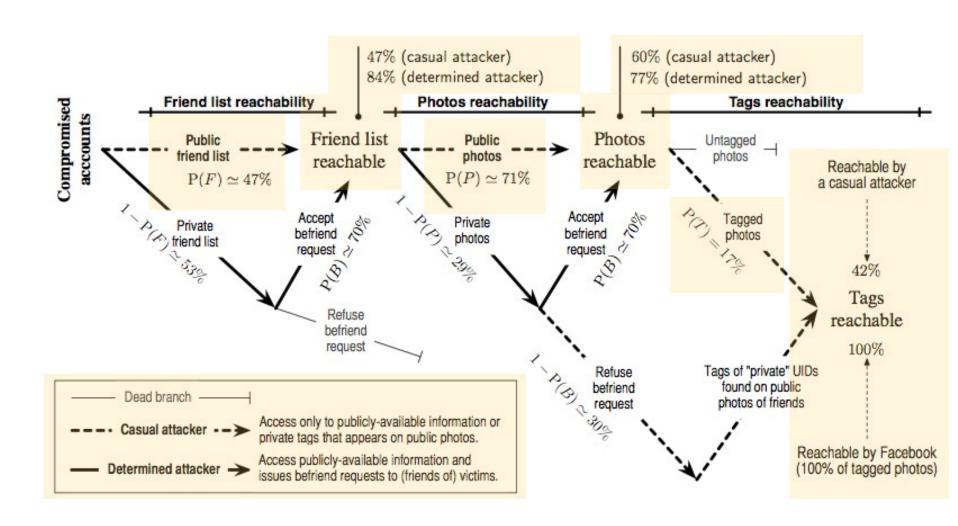
#### Manual verification

- 22% solved
- 56% need 1-2 guesses

#### Failed photos

- 25% no face in photo
- 50% unrecogn. face
- 25% no model available

### **Attack Surface Estimation**



### **Remediation Measures**

- Facebook features (opt-in)
  - Login Approval (SMS based) traditional 2 factor auth.
- Slowing down the attacker
  - Remove suggestions
  - Reduce time window

- Revisit SA
  - Select photos that contain faces software can't identify

### Facebook's Response

- Acknowledged our results
- "Deployed SA to raise the bar in large-scale phishing attacks"
- "Not designed for small-scale or targeted attacks"
- "Users can enable Login Approval"
  - How many have actually done so?

#### Discussion

- Eurograbber malware [1]
  - Targets EU banks
  - Infects user's computer
  - Tricks user into installing smartphone malware via bogus messages and social engineering
  - Intercepts 2nd factor token sent to user's device
- What are the implications of using the same device as the 2nd factor, and for browsing?
- SA security compared to traditional two-factor with smartphones?

[1] https://www.checkpoint.com/products/downloads/whitepapers/Eurograbber\_White\_Paper.pdf

#### Conclusions

- Designed and implemented an automated SA breaking system
- Demonstrated the weaknesses of SA
- Publicly-available data sufficient for attackers
- Cloud services can be utilized effectively

- Facebook should reconsider its threat model
- Need to revisit the SA approach

### Thank you!



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