

Lecture 12: Biometrics

CS 181W

Fall 2022

Recall: Authentication of humans

- **Something you know**
secret information (e.g., a password)
- **Something you are**
biometrics (e.g., fingerprints)
- **Something you have**
possession of a physical device (e.g., a particular phone)

SOMETHING YOU ARE

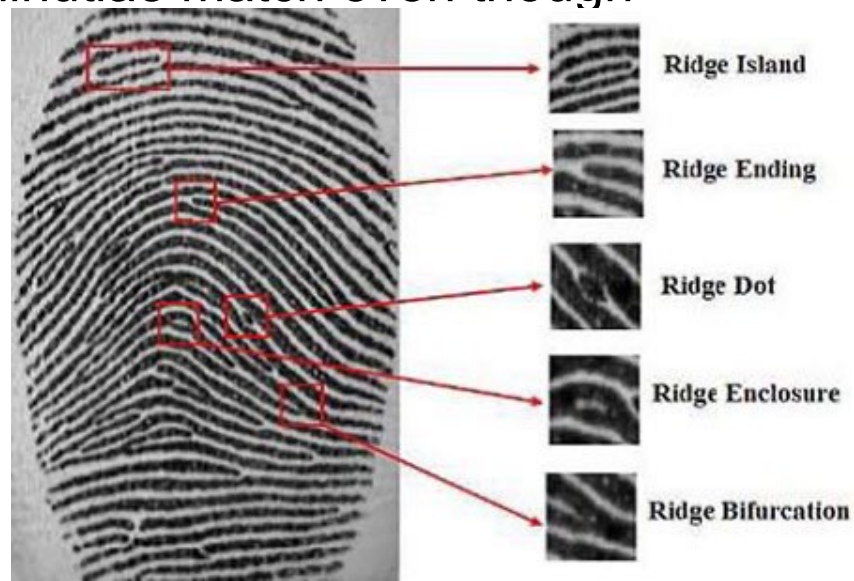
Biometric

- **Biometric:** measurement of biological and behavioral attributes (something you are)
 - biological attributes can be confounded by behavior
 - biology and behavior is non-constant: variation from one measurement to the next

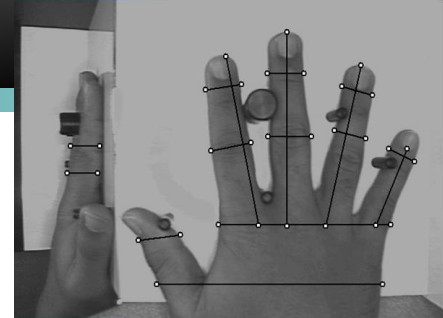
Example: Fingerprint



- Particular use: California social services
 - prevent applicants for welfare from defrauding state by receiving assistance under multiple identities
- Fingerprint stored as bitmap and as **minutiae**
 - When user authenticates, computer compares minutiae
 - If they match, human additionally reviews bitmap images (about 15 out of 10000 authentications have minutiae match even though fingerprints do not)



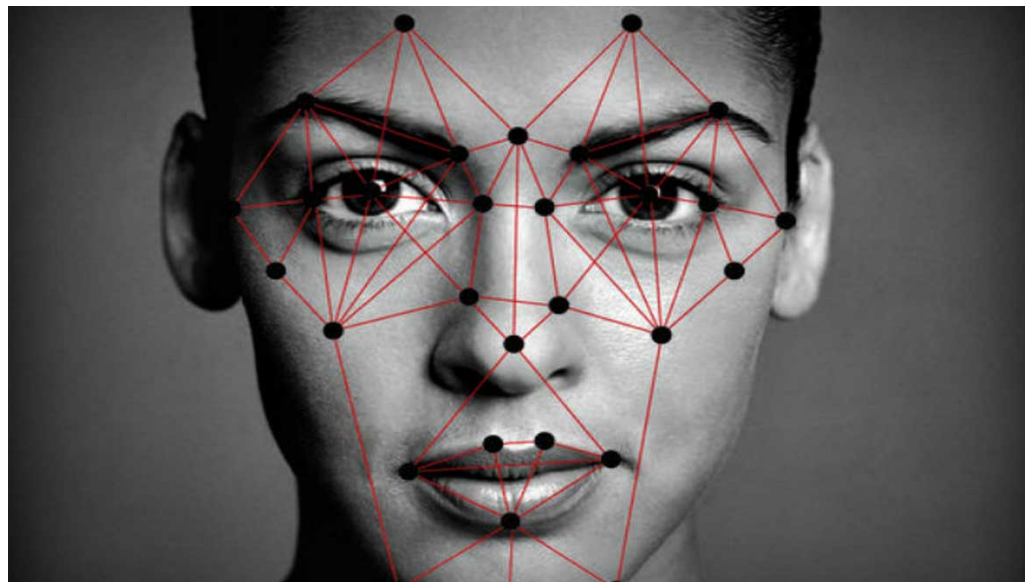
Example: Hand geometry



- Used in 2012 Olympic Games, Walt Disney World, nuclear facilities, data centers, ...
- Camera images palm and side of hand (no texture information)
- Images reduced to (e.g.) 31000 points then 90 measurements then 9 bytes of data
 - Final data not directly related to any source measurements
 - Data stored as a **template** for later comparison
- When user authenticates, another set of images taken
 - If data are close enough to stored template, user deemed authenticated
 - Can adjust threshold per-user, in case some users are difficult to authenticate
- Each time user is authenticated, template is updated to account for change over time

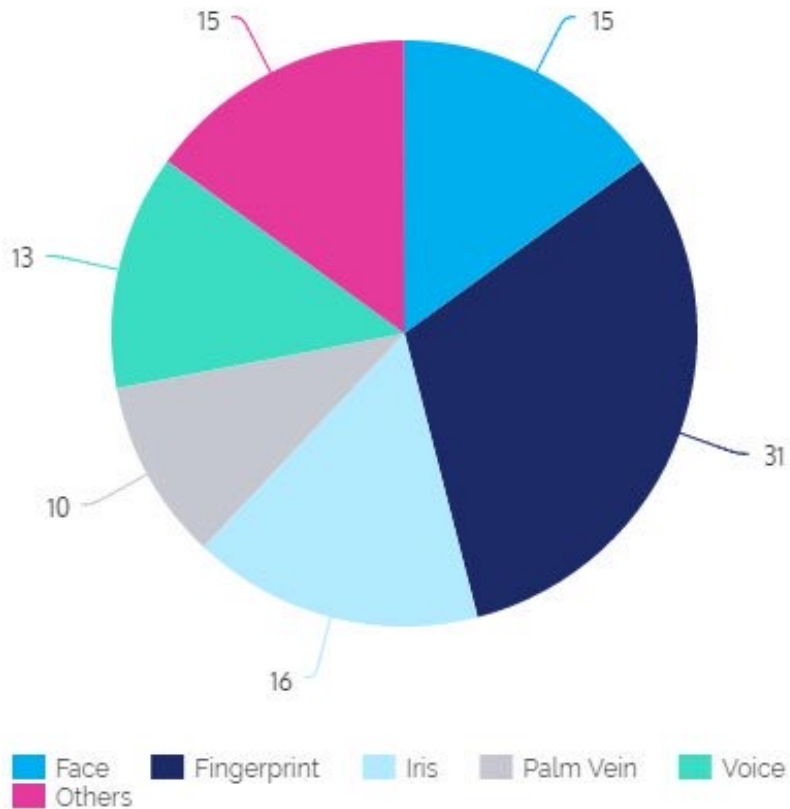
Example: Facial recognition

- Used in border control, Facebook, iPhones
- Operates on 2D image or depth map
- Modern systems use ML classifiers to identify matches
 - Most systems perform poorly on profiles, low-res images
 - Most systems perform less well on women and minorities

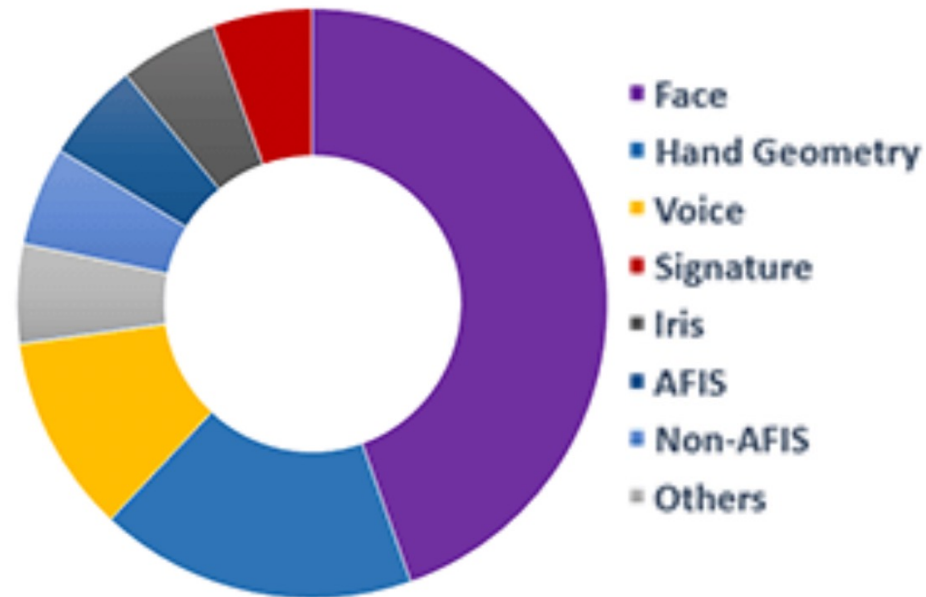


Other Biometrics

2018



2021



Biometric attributes as verifiers

- **Advantages:**

- Can't lose or forget a biometric
- Easy to use some biometrics (e.g., facial scan vs. PIN on iPhone)

- **Disadvantages:**

- Physical process with errors...
- Updating identities after disclosure is hard (new fingerprints? new retina?)
 - So enrolling a biometric identifier places **permanent trust** in receiver, even if they go bankrupt, retroactively change privacy policies, get taken over by new administration, ...
- Impossible to be application specific (your hand geometry is the same regardless of what system you use)
- Fear of negative implications for privacy...

EVALUATING BIOMETRICS

Biometric attributes as verifiers

Requirements:

- Easy to measure
- Identifier
- Small variation over time and measurement
- Acceptable to users
- Difficult to spoof

Biometric	Easy to Measure
Face	High
Voice	High
Fingerprint	Medium
Iris	Medium
Palm vein	High

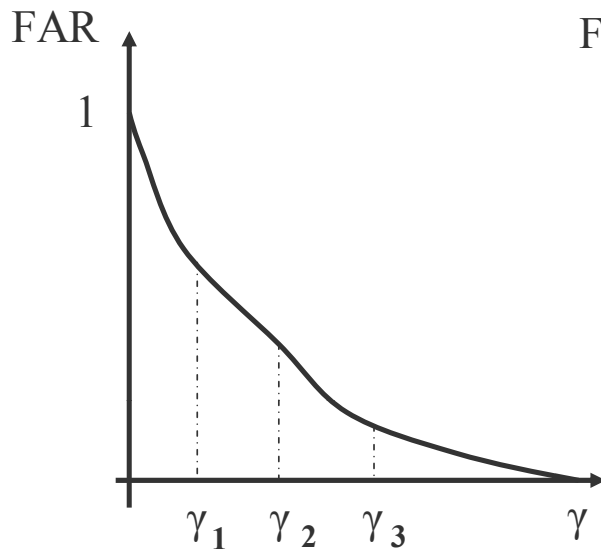
Accuracy

- **False accept:** authenticate a principal with wrong identity
- **False reject:** fail to authenticate a principal under right identity

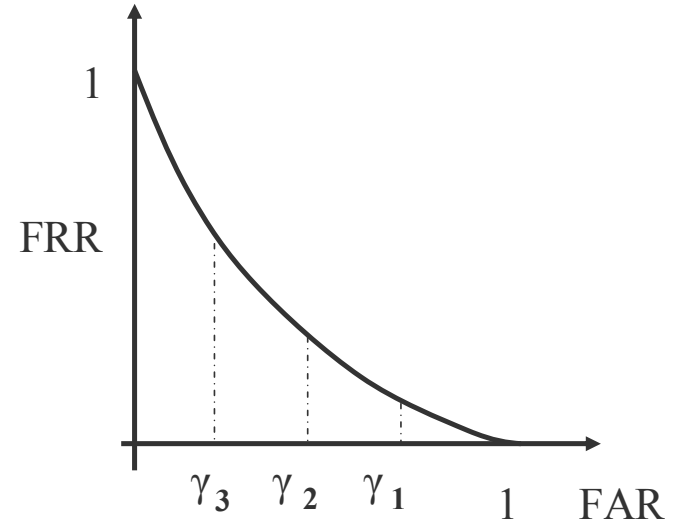
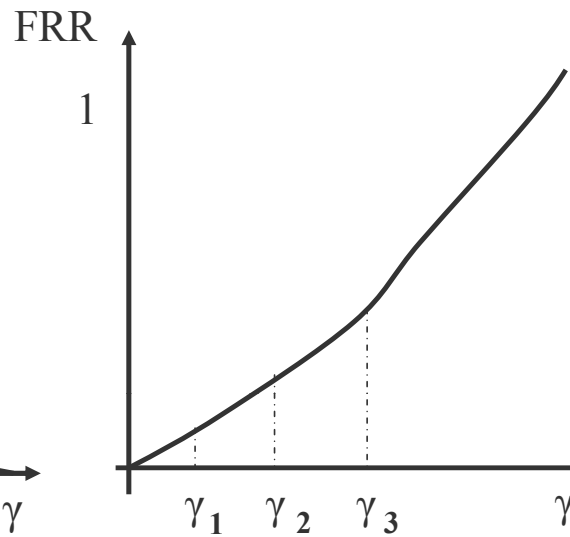
- Tunable trade off of **sensitivity** between which error is more likely
 - **False acceptance rate (FAR):** percentage of attempts in which imposters are authenticated (with wrong identity)
 - **False reject rate (FRR):** percentage of attempts in which legitimate users are denied authentication

Sensitivity

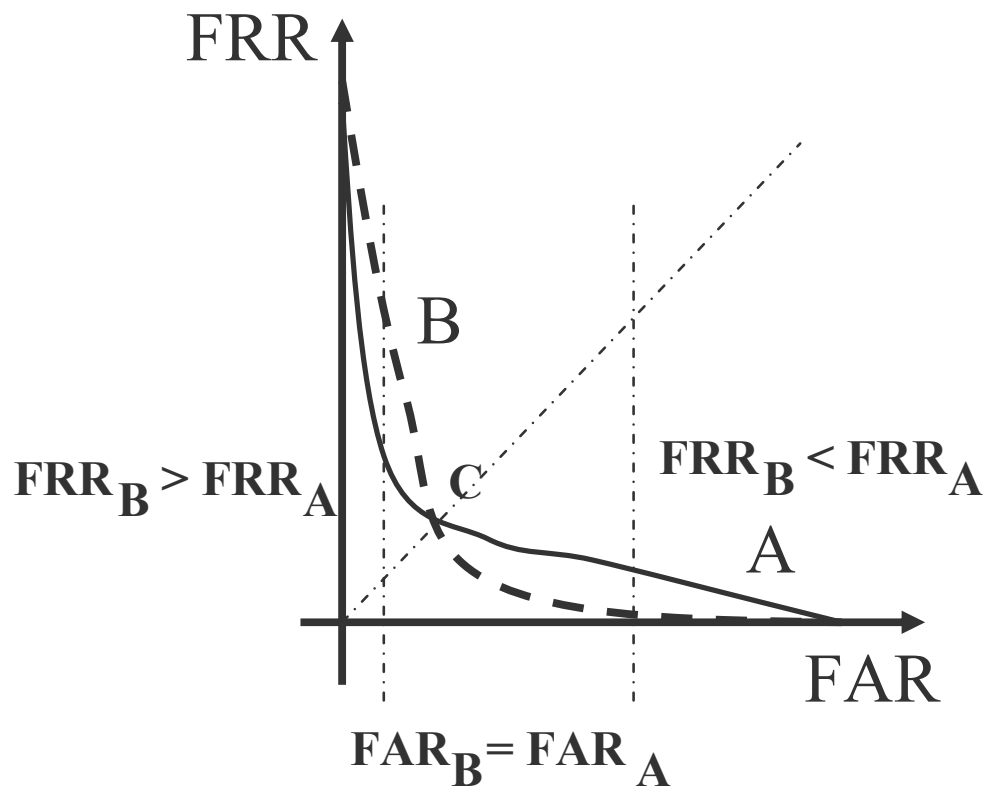
Receiver operating characteristics (ROC) curve: graph of FRR vs. FAR (or perhaps 1-FAR, perhaps nonlinear axes)



γ = sensitivity



ROC comparison



- Two matchers (A=solid; B=dashed)
- At point C, matchers have same FAR and FRR
- To the left of C, matcher A has lower FRR for same FAR
- To the right, matcher B has lower FRR for same FAR

ROC comparison

- **Crossover error rate (CER):** value on ROC at which FAR=FRR (aka *equal error rate, ERR*)
- Many other statistics for comparison possible
 - Anytime a graph is reduced to a single number, we lose information
- *What matters most for biometrics is the use case/threat model*

Use cases

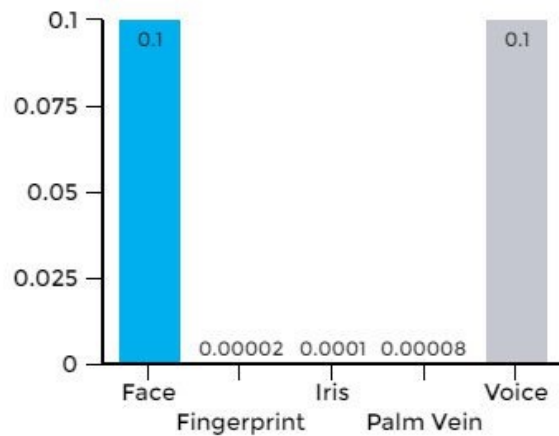
- **Entry to military facility:**

- letting imposters in might be worse than (temporarily) delaying entry of personnel
- so prefer low false accept rate

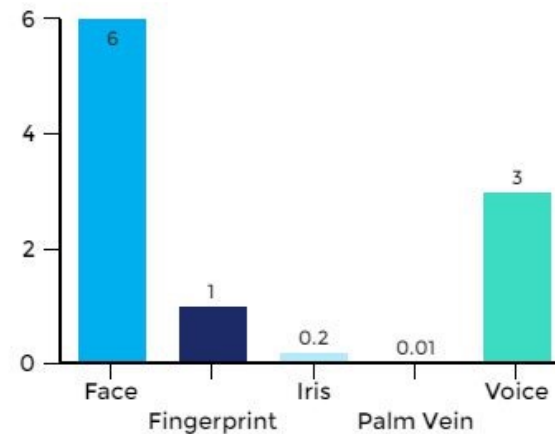
- **Entry to hotel lobby:**

- letting non-guests in might be better than (temporarily) delaying entry of guests
- so prefer low false reject rate

Comparing Biometric Accuracy



False Acceptance Rate



False Rejection Rate

Phone Authentication

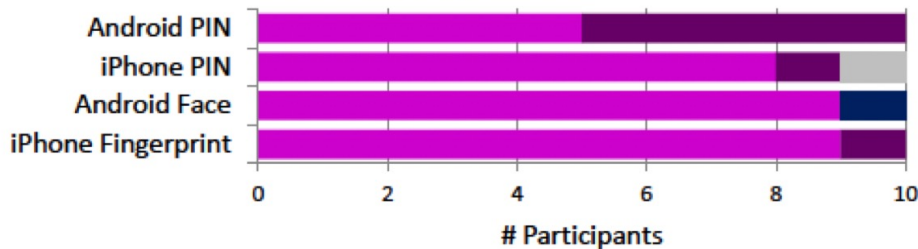
- Fingerprints (introduced to iPhone 5S in 2013)
- Facial Recognition (introduced to Android 4.0 in 2011, to iPhone X in 2017)
- PIN

In-person
Within subjects
n = 10

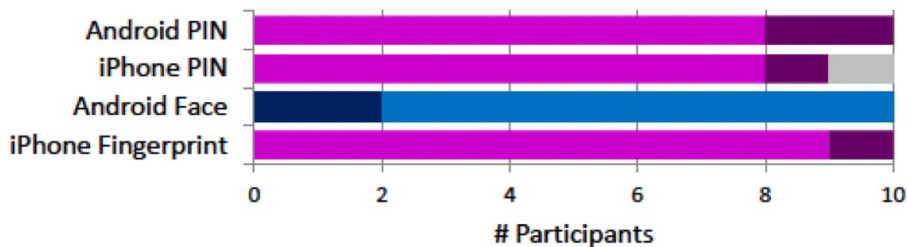
Online study
Survey
n = 198

Perceived Ease of Use

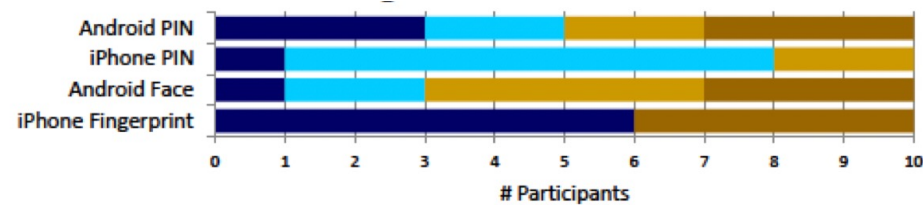
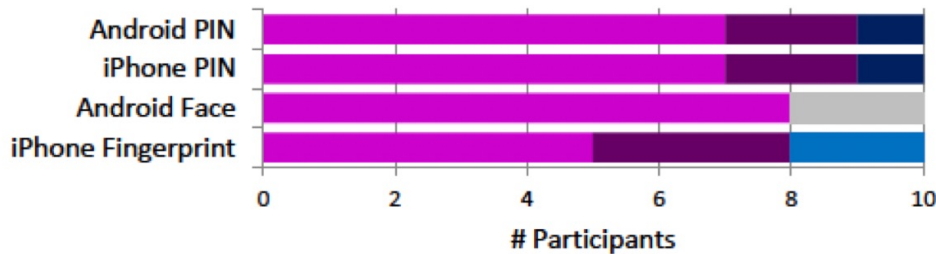
Sitting



Sitting (Dark)



Walking (bag)



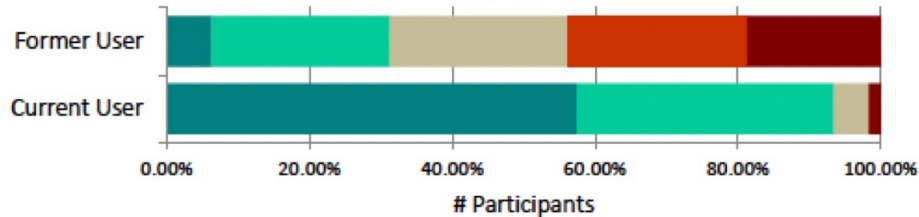
■ Rank 1 (Most Favorite) ■ Rank 2 ■ Rank 3 ■ Rank 4 (Least Favorite)

■ Very Easy ■ Easy ■ Neutral ■ Difficult ■ Very Difficult

In-person
Within subjects
n = 10

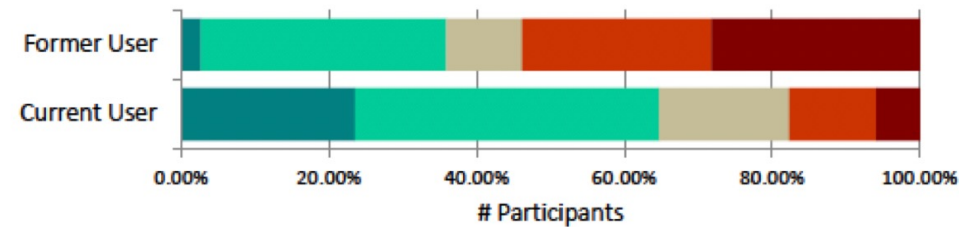
Comparing Biometrics

Convenience of Fingerprint Unlock vs. PIN



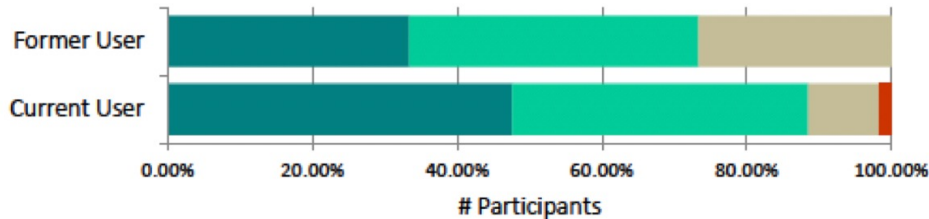
■ A lot more ■ A little more ■ Equally ■ A little less ■ A lot less

Convenience of Face Unlock vs. PIN



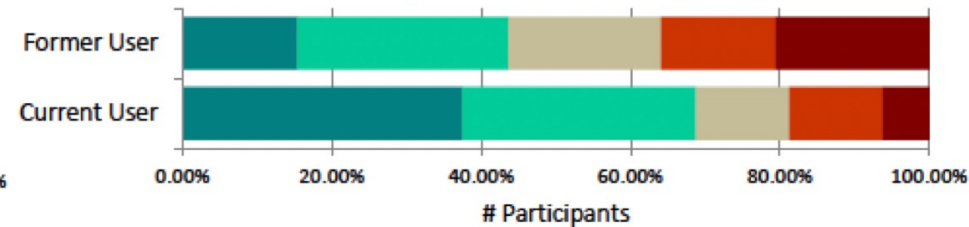
■ A lot more ■ A little more ■ Equally ■ A little less ■ A lot less

Security of Fingerprint Unlock vs. PIN



■ A lot more ■ A little more ■ Equally ■ A little less ■ A lot less

Security of Face Unlock vs. PIN



■ A lot more ■ A little more ■ Equally ■ A little less ■ A lot less

Online study
Survey
n = 198

Biometric attributes as verifiers

Requirements:

- Easy to measure
- Identifier
- Small variation over time and measurement
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- Difficult to spoof

Biometric	Accuracy
Face	Low
Voice	Medium
Fingerprint	High
Iris	High
Palm vein	High

Privacy concerns

- Humans might have concerns about **measurements** (have photo taken, parts of body scanned)
- Humans might not want to **disclose attributes** during enrollment (SSN, political party)
- Humans might not want action bound to their **identity** (buying medication)
- Humans might not want their actions **linked** to other actions, exposing them to inference about what they thought were unrelated activities.

Privacy and biometrics

- Biometrics can **violate intrinsic privacy** by requiring submission to bodily contact or measurement
 - Fear of germs
 - Religious prohibitions
- Biometrics can **violate informational privacy**
 - Biometric identifiers might effectively become a standard, universal identifier, enabling linking

Biometric Phone Authentication

- Fingerprints (introduced to iPhone 5S in 2013)
- Facial Recognition (introduced to Android 4.0 in 2011, to iPhone X in 2017)

Online study
Survey
n = 383

Why people (don't) use biometrics

	Touch ID	Face Unlock
Reason Activated	Usability (70%)	Security (44%)
	Security (39%)	Curiosity (22%)
	Emotion (13%)	Usability (17%)
Reason Deactivated	Usability (47%)	Usability (36%)
	Emotion (18%)	Reliability (29%)
	Reliability (18%)	External (29%)
Reason Never Activated	Usability (38%)	Ignorance (27%)
	Misconception (38%)	No need (24%)
	Trust (2 people)	Reliability (23%)

Privacy and Trust were rarely mentioned

Biometric attributes as verifiers

Requirements:

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Biometric	Easy to Measure	Accuracy	User Acceptance
Face	High	Low	High
Voice	High	Medium	High
Fingerprint	Medium	High	Low(?)
Iris	Medium	High	Medium
Palm vein	High	High	Medium

Spoofing

- Active adversary fools sensor with artificial object
- Solution:
 - better sensors
 - better biometrics
 - multi-factor authentication

Gummy Bear Attack



Face ID Attack



Exercise: Evaluating Biometrics

Consider the use of voice authentication as a biometric. With voice authentication, the human is asked to say a specific passphrase and their response compared to a recorded voice print by a machine learning system.

1. What are potential advantages of this biometric?
2. What are potential disadvantages of this biometric?
3. Would you recommend this biometric for unlocking phones?

Biometrics

