

# Biometrics Introduction

By

Hafez Barghouthi

# Definition

”Biometric Technologies” are  
**automated** methods  
of verifying or recognizing the identity of a **living**  
**person** based on  
a **physiological**  
or **behavioural** characteristic

# Definition Explaining

- Automated
  - Different from human identification
- Living person
  - Single persons, no groups
  - Alive not dead (just JOKING)😊

# Definition Explaining

- Physiological biometrics
  - Fingerprint, Iris, Face, Hand
- Behavioural biometrics
  - Signature, Gait, Voice

# History - 1

- Dates back to ancient Egypt
- Anthropometry (bodily measurements):
  - Adolphe Quetelet (1871), Belgian mathematician
  - Alphonse Bertillon (1880's), French policeman
- Fingerprints and palmprints
  - Used already by Babylonian kings
  - Jan Evangelista Purkinje, Czech studying sweat glands
  - Juan Vucetich, Argentinian policeman, first to take fingerprints in ink
  - Francis Galton, Edward Henry: Galton-Henry system for classification

# History - 2

- Fingerprints and facials, 1880's, Henry Faulds, William Herschel and Francis Galton
- fingerprint recognition on current form, 1960's
- Hand geometry, 1970's
- Retinal, signature and face verification, 1980's
- Iris recognition, 1990's
- Newer and newer: gait, keystroke dynamics, mouse movement, cardiac sounds, brain waves

# Positive / Negative

- Positive recognition
  - To prevent multiple people from using the same identity
- Negative recognition
  - To prevent one person from using multiple identities

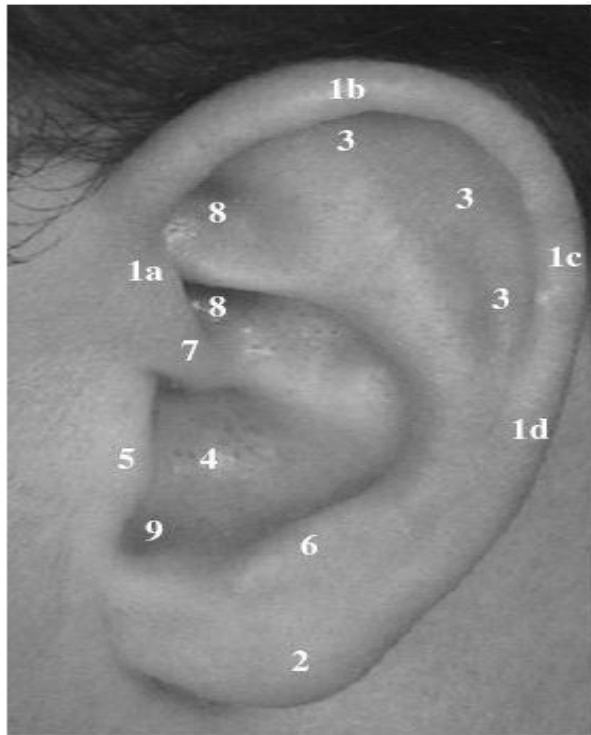
# Physiological / Behavioural

- Physiological:
  - Physical features "unchangeably" attached to a person
  - E.g. fingerprint, DNA, and face
- Behavioural:
  - Behaviour that is very specific to a person
  - E.g. signature, gait, and voice

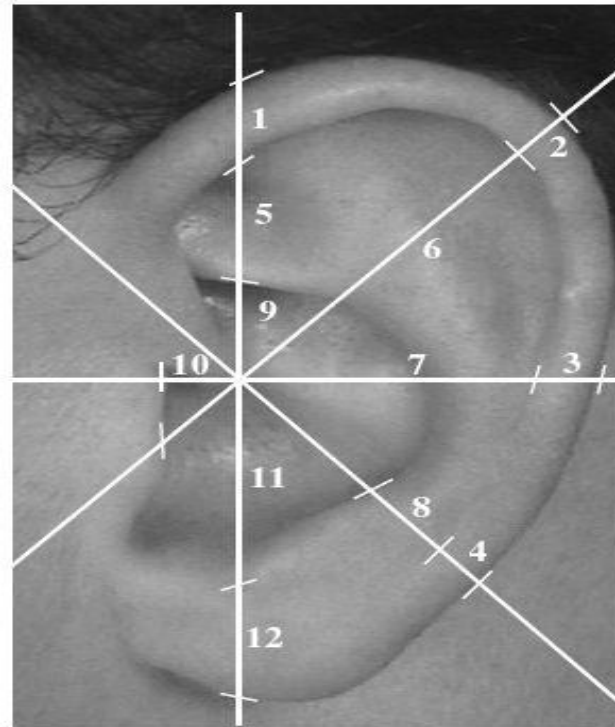


# Examples - Ear

- Shape of ear can be used for authentication



(a) Anatomy.



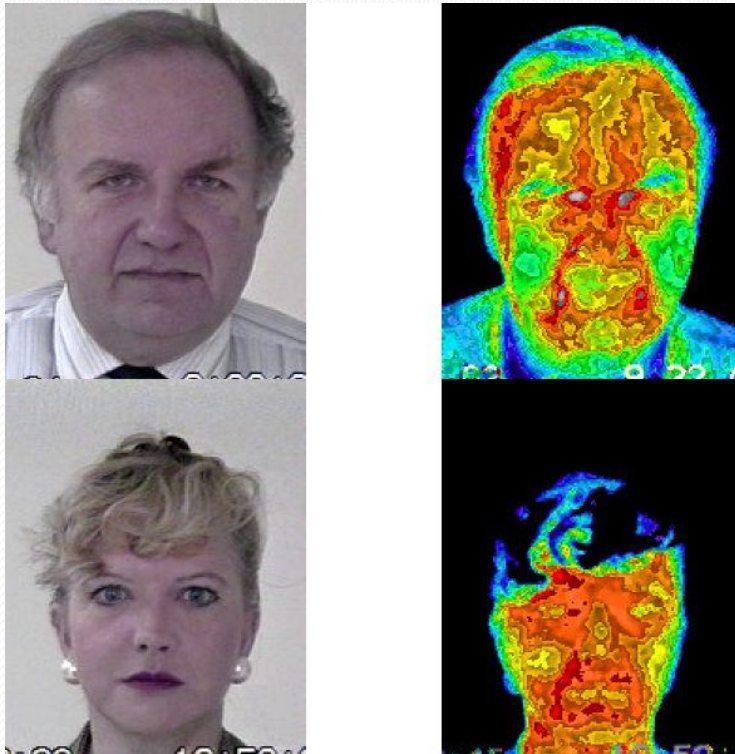
(b) Measurements.

# Examples - Face

- Used by humans
- Many different techniques available

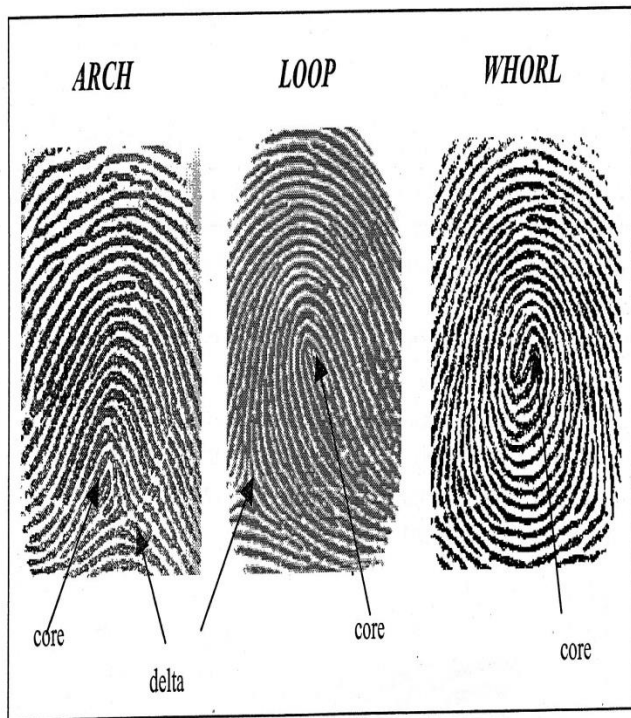
# Examples - Thermograms

- Facial, hand, hand vein


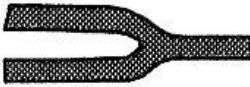







# Examples - Fingerprint

- Global features

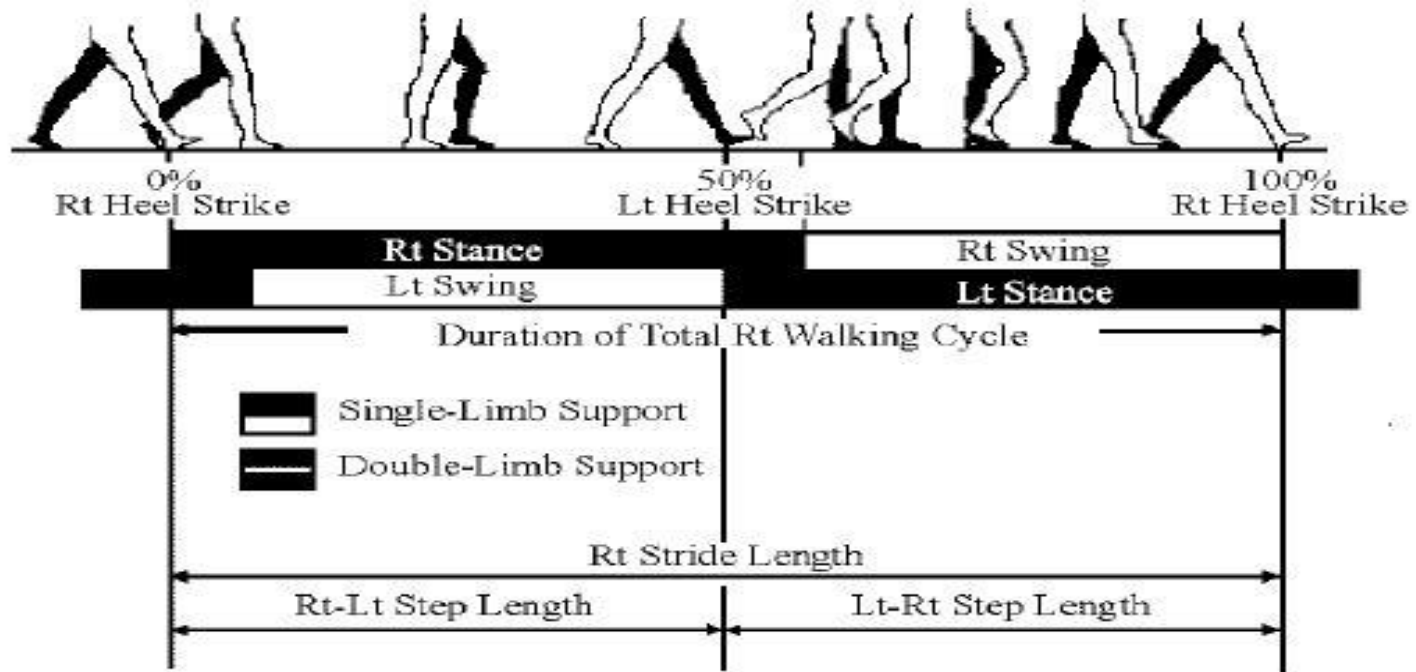


## Local features

|   |                   |
|---|-------------------|
|     | Termination       |
|     | Bifurcation       |
|     | Lake              |
|    | Independent ridge |
|  | Point or island   |
|   | Spur              |
|   | Crossover         |

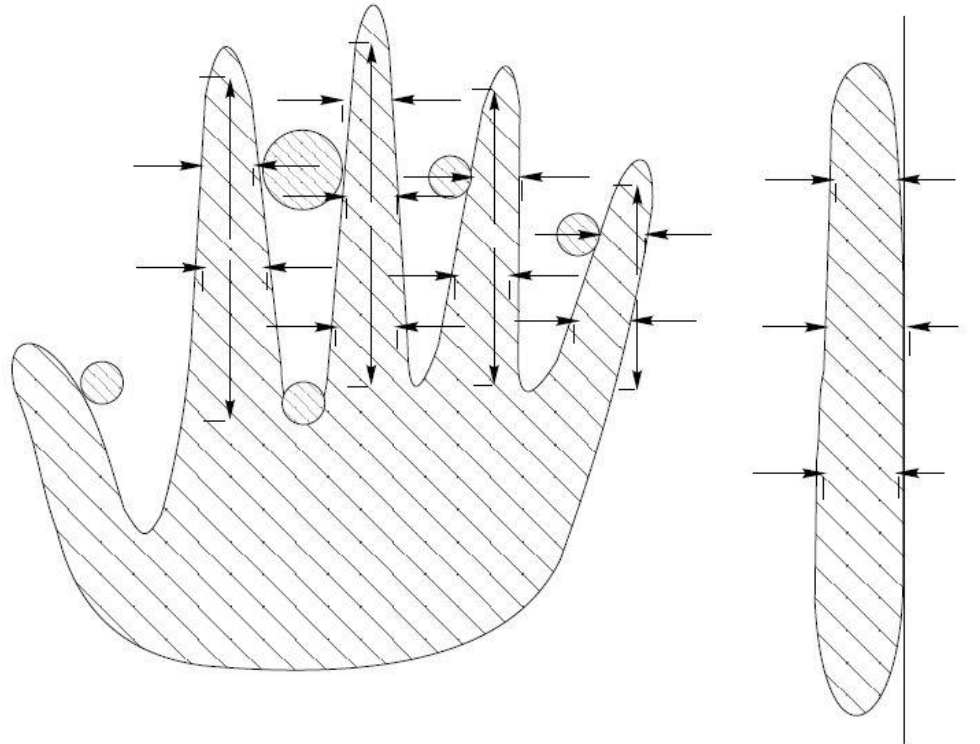
# Examples - Gait

- "Great Juno comes; I know her by her gait" from "The Tempest" by Shakespeare



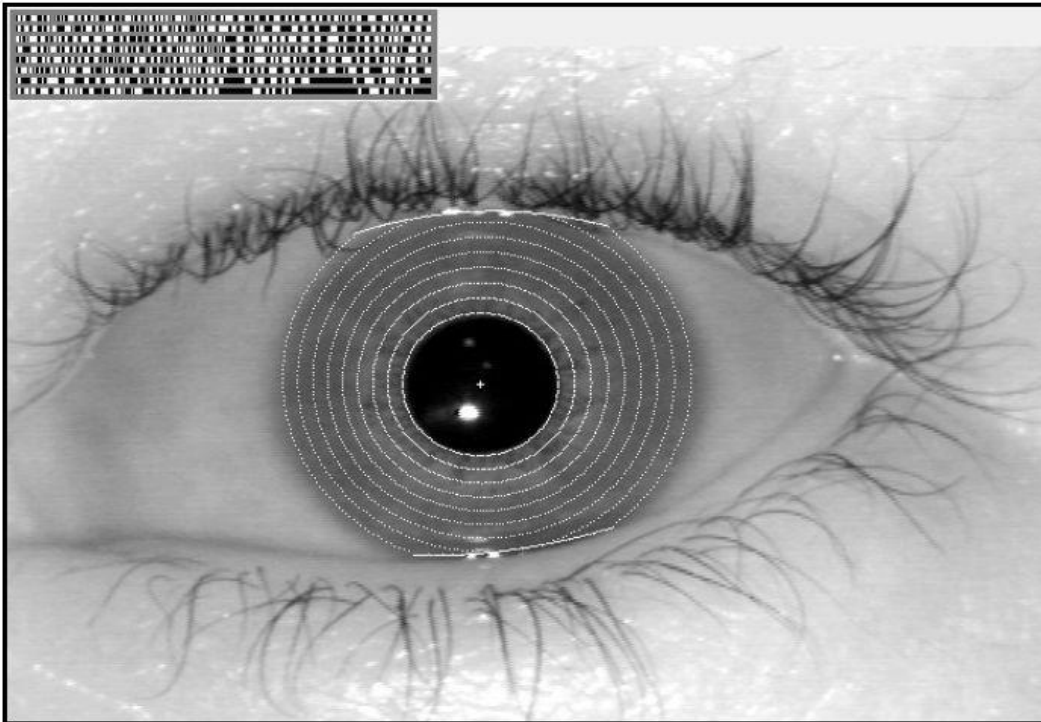
# Examples - Geometry

- Hand and finger geometry



# Examples - Iris

- Remains unchanged after 2 years
- Iris code.



# Examples - Keystroke

- Typical way of typing
- Combinations of keys
- Speed, force and press-down

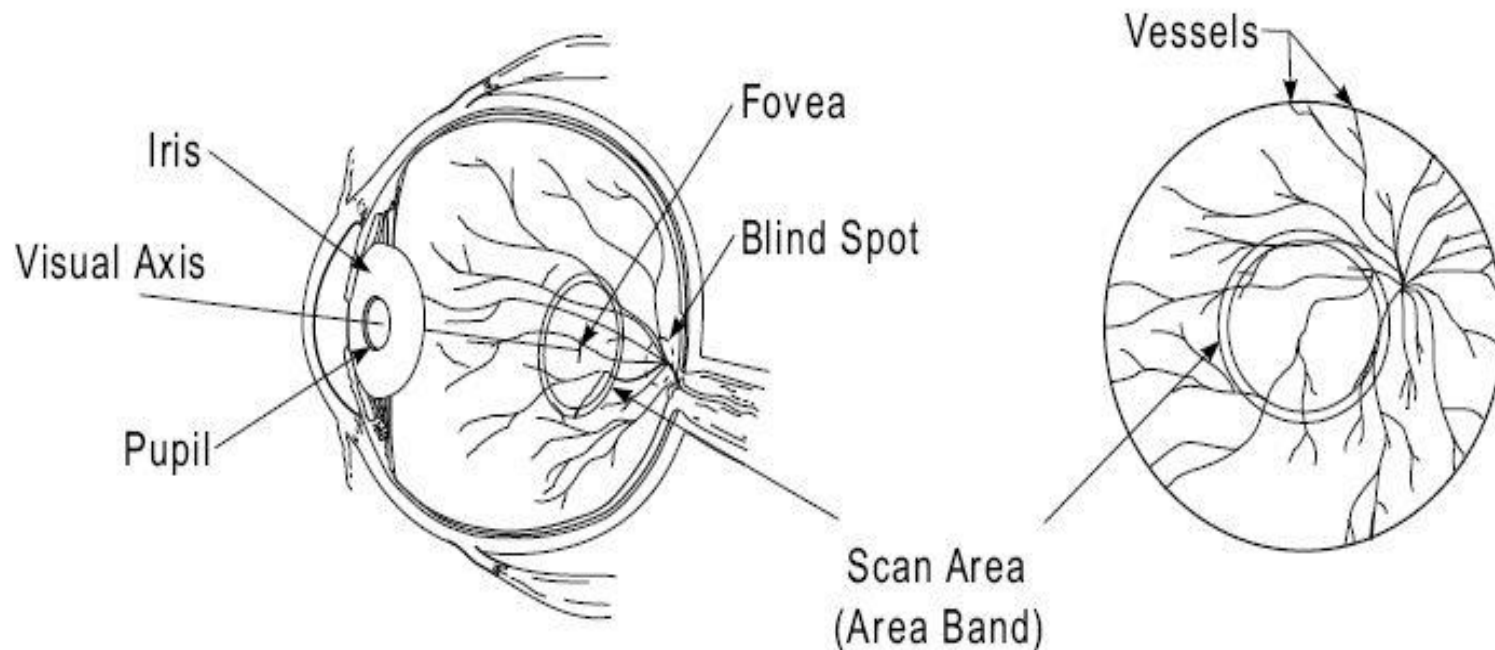


# Examples - Odor

- Used by humans
- Many problems

# Examples – Retinal Scan

- Supposed to be the most secure biometric
- Not user friendly



# Characteristics - overview

- Universality
- Distinctiveness
- Permanence
- Collectability
- Performance
- Acceptability
- Circumvention

# Characteristic - Universality

- Each person should have the characteristic
  - Failure to Enroll Rate (FER)

# Distinctiveness

- Different persons should have different biometric properties
  - False Match Rate (FMR)

# Characteristic – Permanence

- The characteristic should be sufficiently invariant over a period of time
  - False Non-Match Rate (FNMR)

# Characteristic – Collectability

- The biometric property should be easy to collect (electronically) and to quantify

# Characteristic – Performance

- This refers to the achievable recognition accuracy and speed
  - False Non Match Rate (FNMR)
  - Failure to Capture Rate (FCR)



# Characteristic – Acceptability

- To which extent are people willing to accept the use of a specific biometric

# Characteristic – Circumvention

- Reflects how easy it is to fool the system
  - False Match Rate (FMR)

# Application Environments

- Overt vs. covert
- Habituated vs. non-habituated
- Attended vs. non-attended
- Standard vs. non-standard
- Public vs. private
- Open vs. closed

# Overt vs. covert

- Overt:
  - User is aware that the biometric feature is being measured (e.g. finger on a fingerprint reader)
- Covert:
  - User is unaware that the biometric feature is being measured (e.g. face recognition)

# Habituated vs. non-habituated

- Habituated:
  - System is used on a daily basis (e.g. to have access to the PC at work)
- Non-habituated:
  - System is used irregularly (e.g. to access a personal safe in a bank)

# Attended vs. non-attended

- Attended:
  - Use is observed and guided by system management (e.g. access to a building)
- Non-attended:
  - No observation or (regular) help is provided (e.g. access to PC)

# Standard vs. non-standard

- Standard:
  - System is in a static environment with controlled conditions (e.g. fixed lighting and background for face recognition)
- Non-standard:
  - System in a dynamic environment (e.g. background noise for voice recognition)

# Public vs. private

- Public:
  - “Anybody” can use the system (e.g. voice recognition for bank transfers via phone)
- Private:
  - Only employees can use the system (e.g. access to a factory or office building)



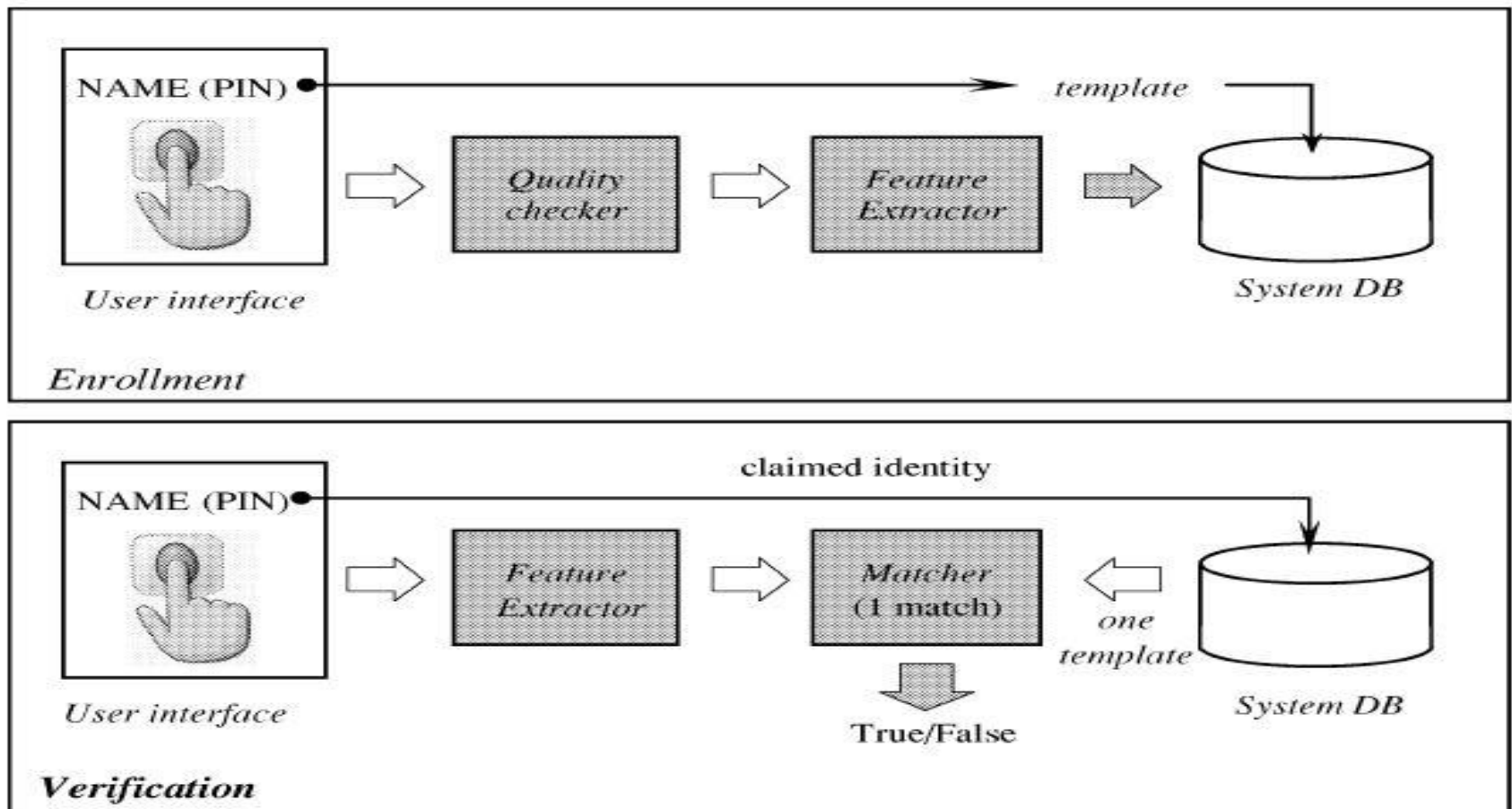
# Open vs. closed

- Open:
  - System can interact with other (biometric) system (e.g. biometric passport)
- Closed:
  - System is stand-alone and no information is shared (e.g. systems to access classified information)

# Biometrical Systems

- A biometrical systems consists of 2 modules:
  - Enrollment module
    - Template created and stored in database
  - Authentication module
    - Checked against stored template

# Biometrical Systems



# Errors

- False Non-Match Rate (FNMR)
- False Match Rate (FMR)
- False Rejection Rate (FRR) (used wrongly in literature). USE (FNMR) instead
- False Acceptance Rate (FAR) used wrongly in literature. USE (FMR) instead
- Failure to Enroll Rate (FER)
- Failure to Capture Rate (FCR)

# Hypotheses and decisions

- $H_0$  : input biometric does **not** belong to the same person as the template biometric
- $H_1$  : input biometric does belong to the same person as the template biometric
- $D_0$  : Person is **not** who he claims to be
- $D_1$  : Person is who he claims to be

# False Match Rate (FMR)

- Probability that a false claimed identity is not recognized as false
- Also called *Type I Error*
- Probability that  $D_1$  is decided, given that  $H_0$  is true:
  - $\text{Prob}( D_1 | H_0 )$
- Depends on a threshold  $t$

# False Non-Match Rate (FNMR)

- Probability that a correctly claimed identity is not recognized as true
- Also called *Type II Error*
- Probability that  $D_o$  is decided, given that  $H_1$  is true:
  - $\text{Prob}( D_o | H_1 )$
- Depends on a threshold  $t$

# Failure to Enroll Rate (FER)

- Probability that a person cannot enroll in the biometric system
- Person doesn't have biometric feature
- Person has poor quality biometric feature
- Trade-off between FMR/FNMR and FER



# Failure to Capture Rate (FCR)

- Probability of failure to capture the biometric feature when trying to authenticate
- Bad capturing conditions
  - Too dark for face recognition
  - Dirty fingerprint reader
  - Background noise for voice recognition

# Equal Error Rate (EER)

- EER is the point where FMR and FNMR are equal

# Distance metrics - 1

- In biometrics we need to compare extracted features that will differ a bit every time they are measured
- Need a way to compare extracted features
- "Inter person" distance must be large
- "Intra person" distance must be small

# Distance metrics - 2

- We want to know how far 2 sequences  $\mathbf{x}$  and  $\mathbf{y}$  are apart or how close together they are.
- Let  $\mathbf{x} = (x_1, x_2, \dots, x_n)$
- Let  $\mathbf{y} = (y_1, y_2, \dots, y_n)$
- Assume  $\mathbf{x}$  can be compared to  $\mathbf{y}$

# Absolute Distance

- Sum the absolute differences between each of the components of  $\mathbf{x}$  and  $\mathbf{y}$
- $d_1(\mathbf{x}, \mathbf{y}) = \sum |x_i - y_i|$
- Extremely easy to calculate

# Euclidean Distance

- Sum the squares of the differences between each of the components of  $\mathbf{x}$  and  $\mathbf{y}$
- $d_2(\mathbf{x}, \mathbf{y}) = \sqrt{\left[ \sum (x_i - y_i)^2 \right]}$
- Also easy to calculate

# Maximum Difference Distance

- The distance between  $\mathbf{x}$  and  $\mathbf{y}$  is defined as the maximum absolute difference of its components
- $d_3(\mathbf{x}, \mathbf{y}) = \max |x_i - y_i|$
- Extremely easy to calculate

# More distance metrics?

- Many more distance metrics possible
- Sometimes first a mathematical transformation of the data is needed
- Not all parts of the data need to be taken into account



# Threshold

- Features are extracted from biometric characteristic
- Features are compared to template
- Distance metric gives distance  $d$
- Use of threshold  $t$
- $d \leq t$ : authentication OK
- $d > t$ : authentication NOT OK

# Example - Distance scores

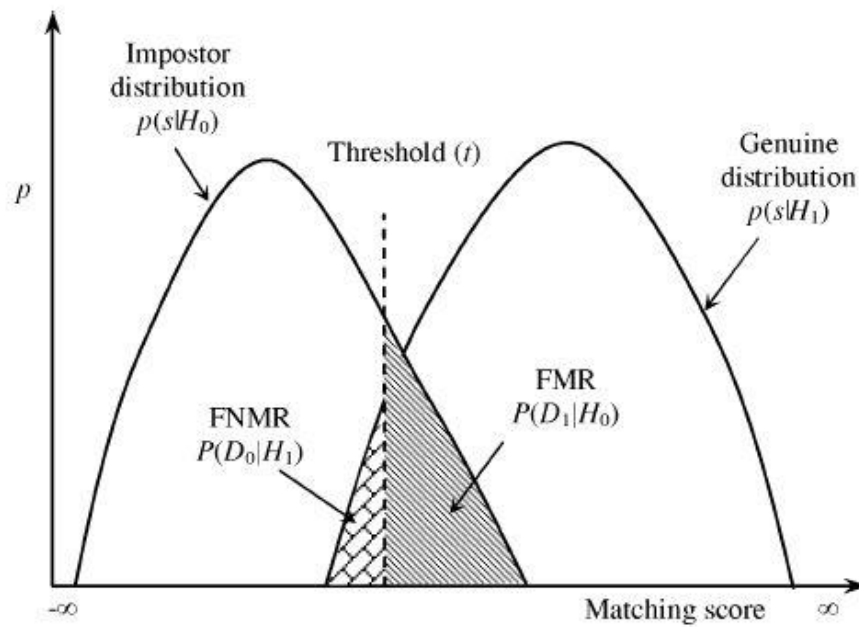
|        | Templ 1      | Templ 2      | Templ 3      | Templ 4      | Templ 5      |
|--------|--------------|--------------|--------------|--------------|--------------|
| Test 1 | <b>0,182</b> | 0,588        | 0,435        | 0,208        | 0,909        |
| Test 2 | 0,323        | <b>0,213</b> | 0,286        | 0,476        | 0,244        |
| Test 3 | 0,909        | 0,625        | <b>0,147</b> | 0,476        | 1,111        |
| Test 4 | 0,238        | 0,294        | 0,476        | <b>0,256</b> | 0,526        |
| Test 5 | 0,588        | 0,454        | 1,250        | 0,526        | <b>0,130</b> |

# Example – FNMR/FMR

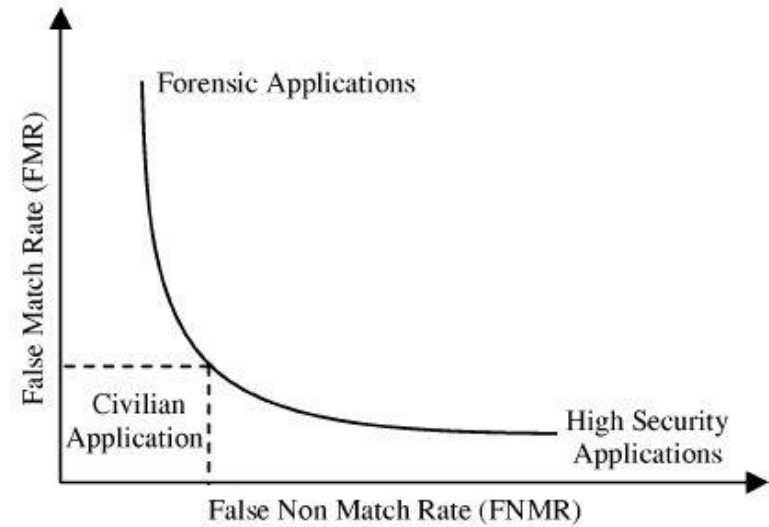
- If  $t=0.256$  we see that
  - $(\text{FNMR}, \text{FMR}) = ( 0/5 , 3/20 )$
- If  $t=0.213$  we see that
  - $(\text{FNMR}, \text{FMR}) = ( 1/5 , 1/20 )$
- If  $t=0.212$  we see that
  - $(\text{FNMR}, \text{FMR}) = ( 2/5 , 1/20 )$
- If  $t=0.207$  we see that
  - $(\text{FNMR}, \text{FMR}) = ( 2/5 , 0/20 )$

# ROC Curve

- ROC: Receiver Operating Characteristic



(a)



(b)