

# Person Tracking and Identification based on Features from Depth sensors

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# Background

- It is getting popular to use camera to identify and track people
  - The information can be used as big data.
- In case of Osaka station city in 2014.
  - take photograph people's face
  - **It was criticized very much.**

朝日新聞 2014年1月6日 朝刊 1ページ 大阪本

## 大阪駅ビル顔で追跡

4月から実験

JR大阪駅の駅ビル「大阪ステーションシティ」(大阪市北区)で通行人の顔をカメラ約90台で撮影し、その特徴を登録して同一人物を自動的に追跡する実験が4月から始まる。顔認証技術の精度を確かめるのが狙いで、データは個人が識別できない処理をしようとして、JR西日本に提供されるという。不特定多数の人を撮影しデータを収集する行為に、専門家はプライバシー侵害への懸念を示している。▼31面「こっそり収集」

大阪ステーションシティの地下通路にはすでに顔認証用カメラが設置されている

### カメラ90台 行動把握

総務省所管の独立行政法人「情報通信研究機構」(東京都小金井市)がJR(東京都市小倉井市)がJR西日本とステーションシティを運営する「大阪ターミナルビル」の協力を得て、2年間実施する。

実験では、各カメラで3分四方に約100人の顔を瞬時に撮影する。両人「情報通信研究機構」幅など100カ所程人の顔の特徴を抽出、一定のIDを与えて登録のカメラが同じ特徴を識別すると、人物と判断して追跡できる仕組みだ。

JR大阪駅ビルでの顔認証実験の流れ

顔の映像は消去

カメラ(約)90台で通行人を撮影

1階通路 広場 地下通路

映像 映像

JR大阪駅ビルの一室

顔の映像から100程度の特徴点(●)を抽出。個人の特徴点をまとめてID番号で管理

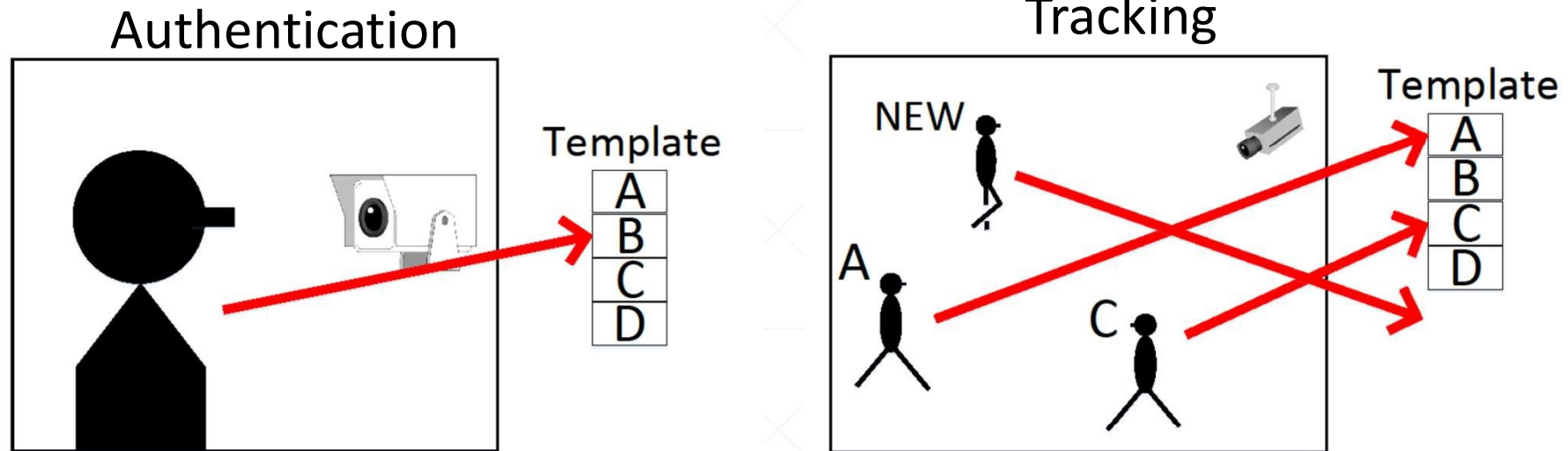
特徴のデータ

情報通信研究機構

人の流れや滞留状況を分析。統計データに加工して蓄積

Asahi Newspaper 6/Jan/2014

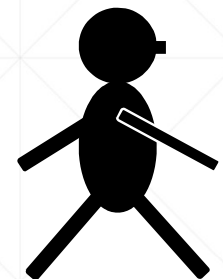
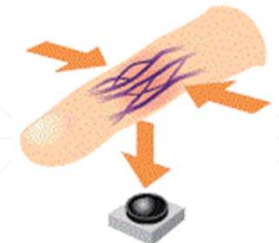
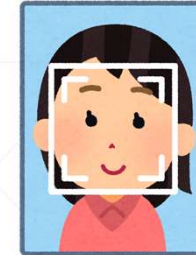
# Difference between Authentication and Tracking



	Authentication	Tracking
application	prove that I am proper user	analyse movement
<b>target</b>	<b>cooperative</b>	<b>noncooperative</b>
desired accuracy	high	low
matching	1: n	m: n
<b>privacy care</b>	<b>unnecessary</b>	<b>necessary</b>
threat	pretend to be proper user	recognized to other person

# Various biometrics

	suitable for authentication	suitable for identification
face	✓	✓
vein	✓	—
fingerprint	✓	—
<b>gait</b>	—	✓



- gait

1. Very long range.
2. Accuracy is not so high → It has high privacy.
3. Less sensitive information than others.

# Objective

**We aim to develop a privacy-friendly person tracking system based on gait.**

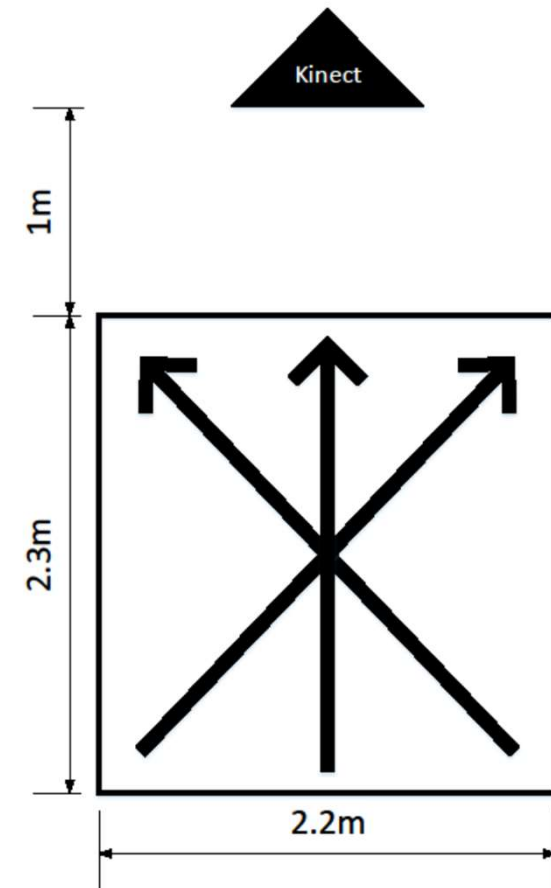
# Outline of Proposed System

1. Data Capture
2. Define Features
3. Preprocessing / Postprocessing
4. Tracking

# 1. Data Capture

- We observed walking subjects.
- Subjects walked twice along three arrows.

	Value
Term	August 2017
Number of Subjects	10
Number of Walking per Subjects	6

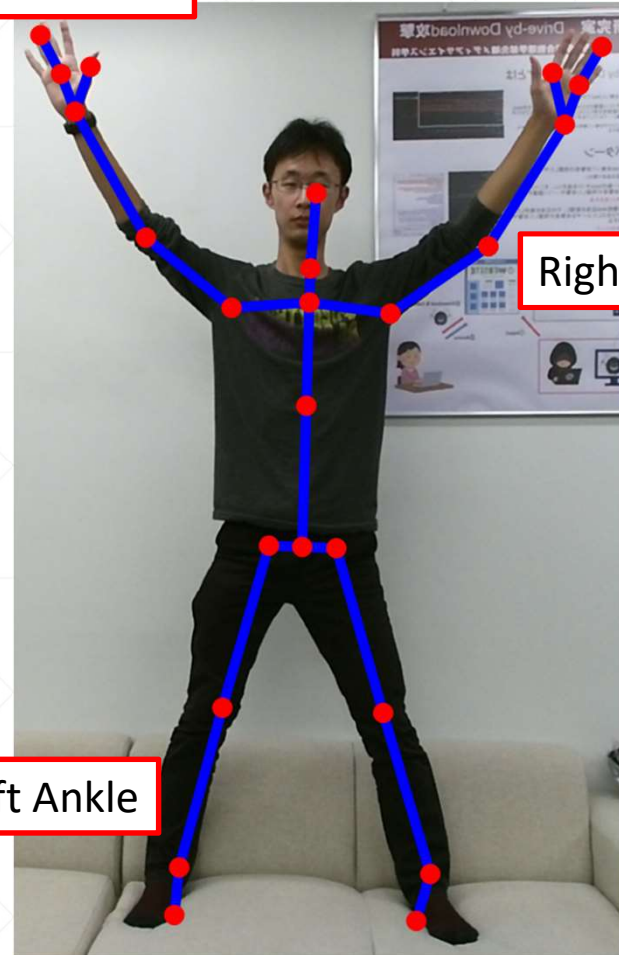


## 2. Skeleton Data

- Microsoft Kinect V2
- We capture three-dimensional coordinates of 25 joints called skeleton data



Tip of Left Hand

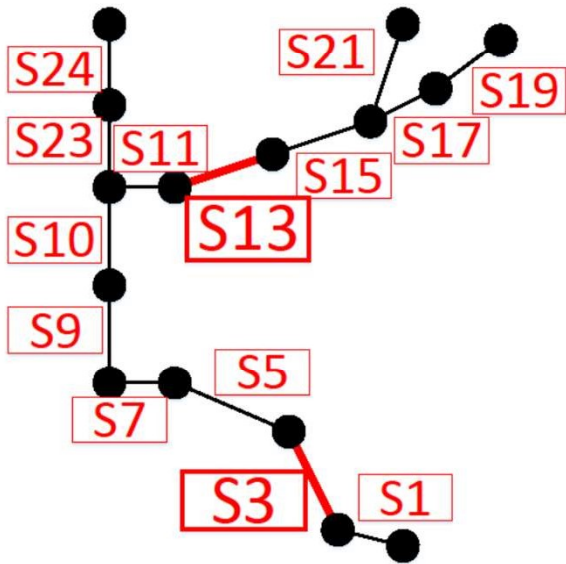


Right Elbow

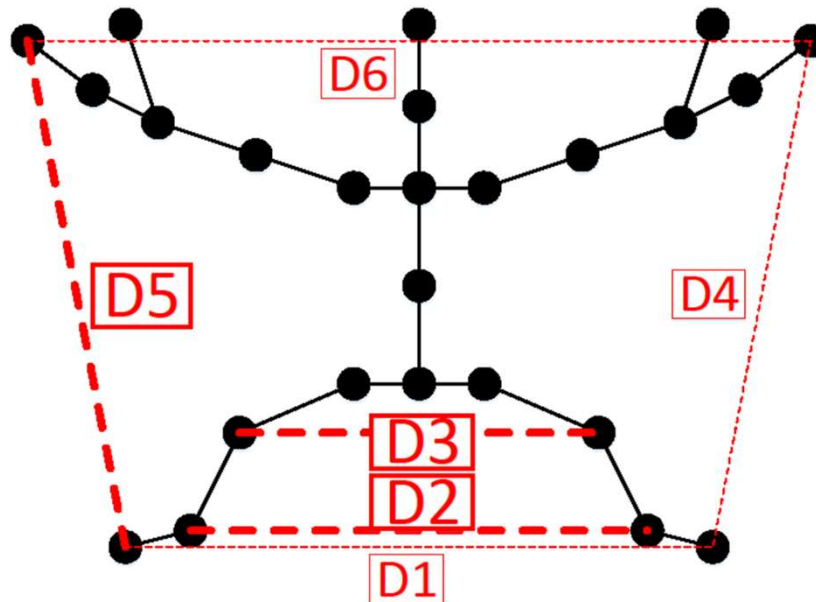
Left Ankle



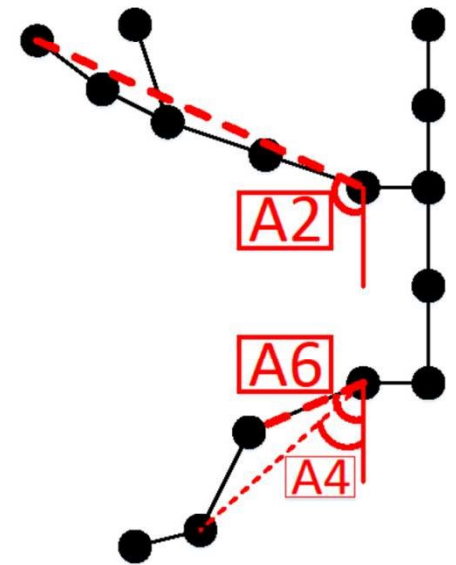
## 2. Define Features



Static Distances  
S1~S24



Dynamic Distances  
D1~D6



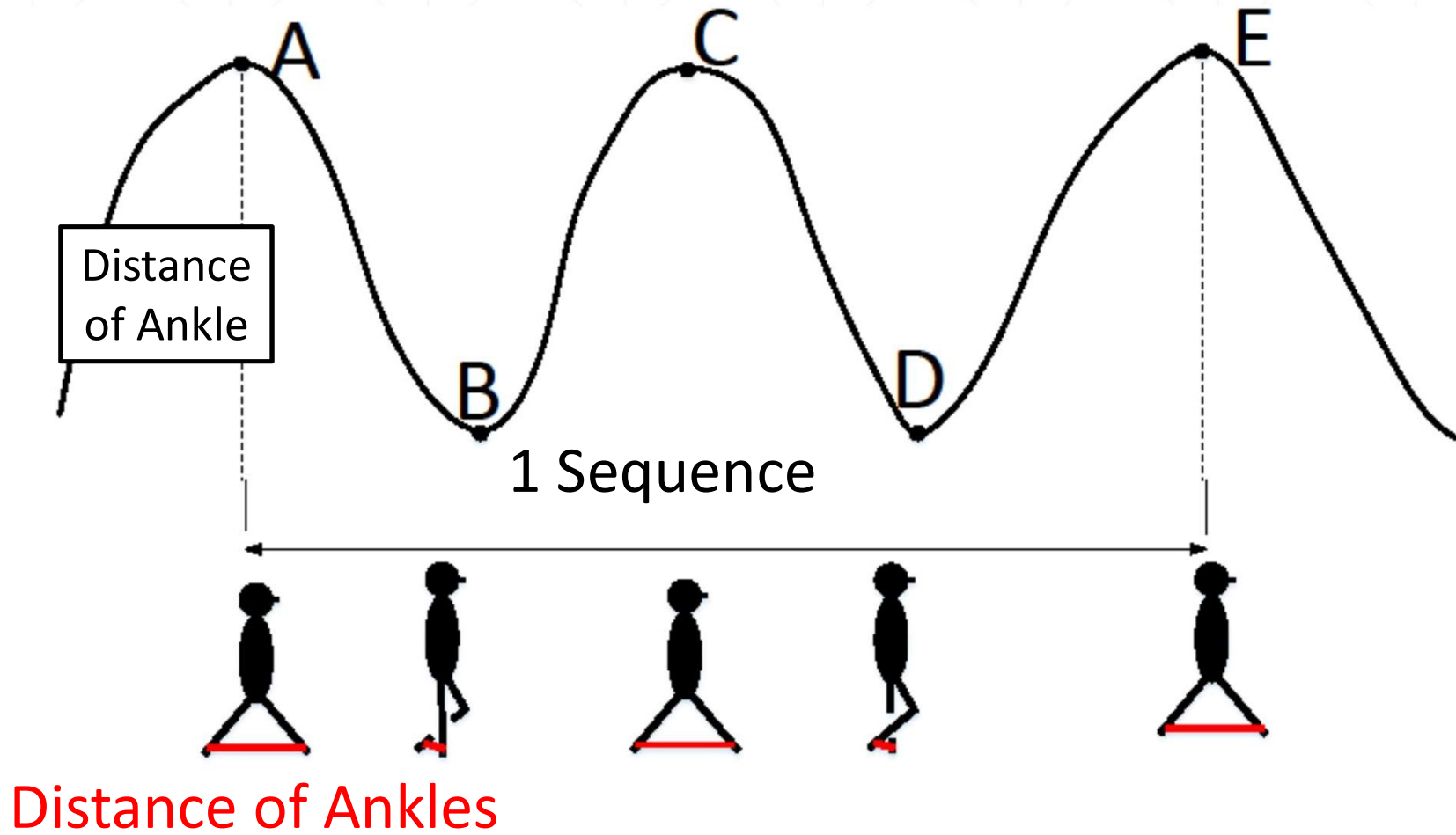
Dynamic Angles  
A1~A6

- There are too many candidates (total: 36)

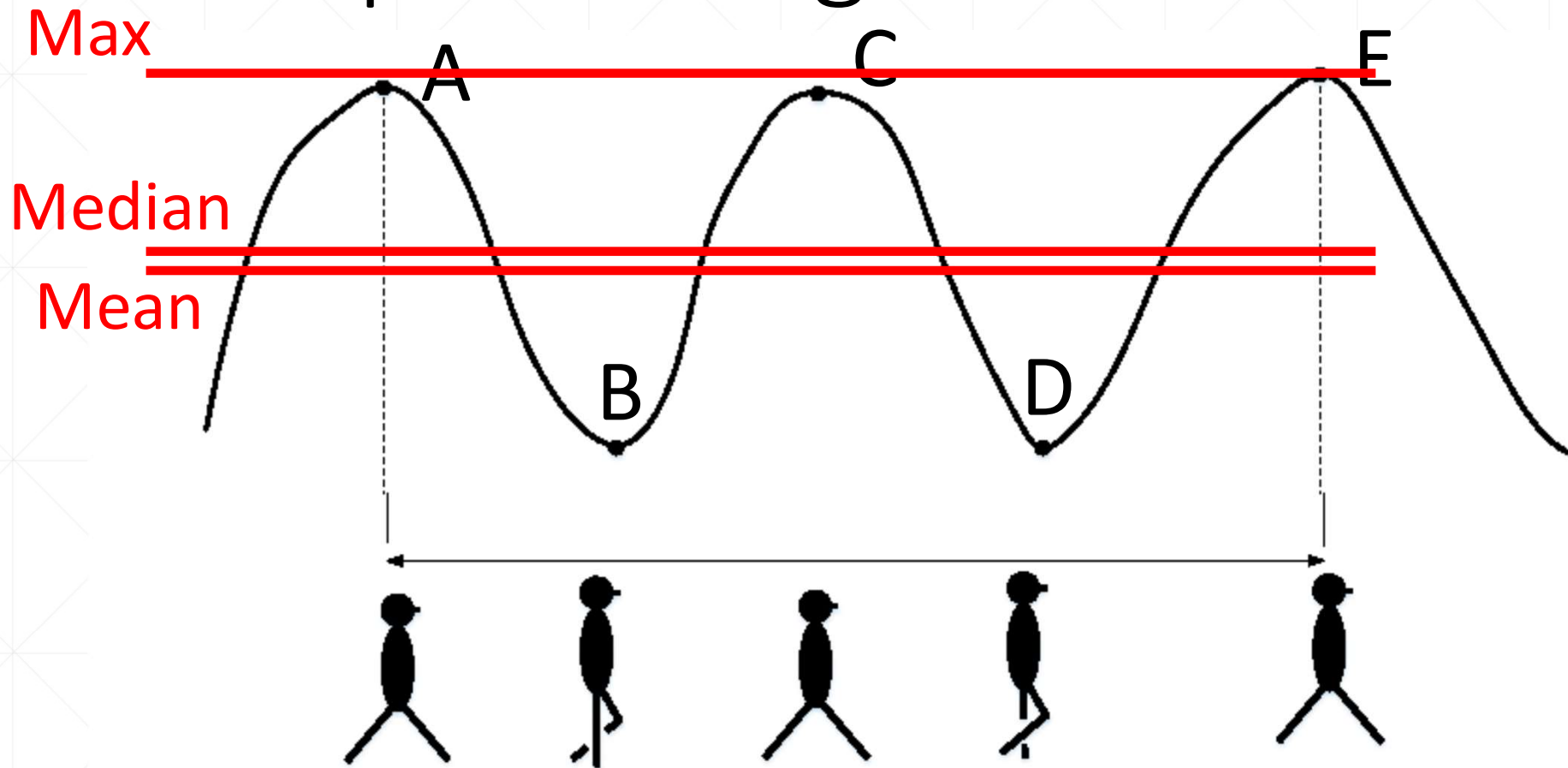
# Research Question

1. How much does a feature **differ** from person to person?
2. How **stable** a feature is in same person?
3. How much accuracy is improved by combining several features.

# 3. Preprocessing



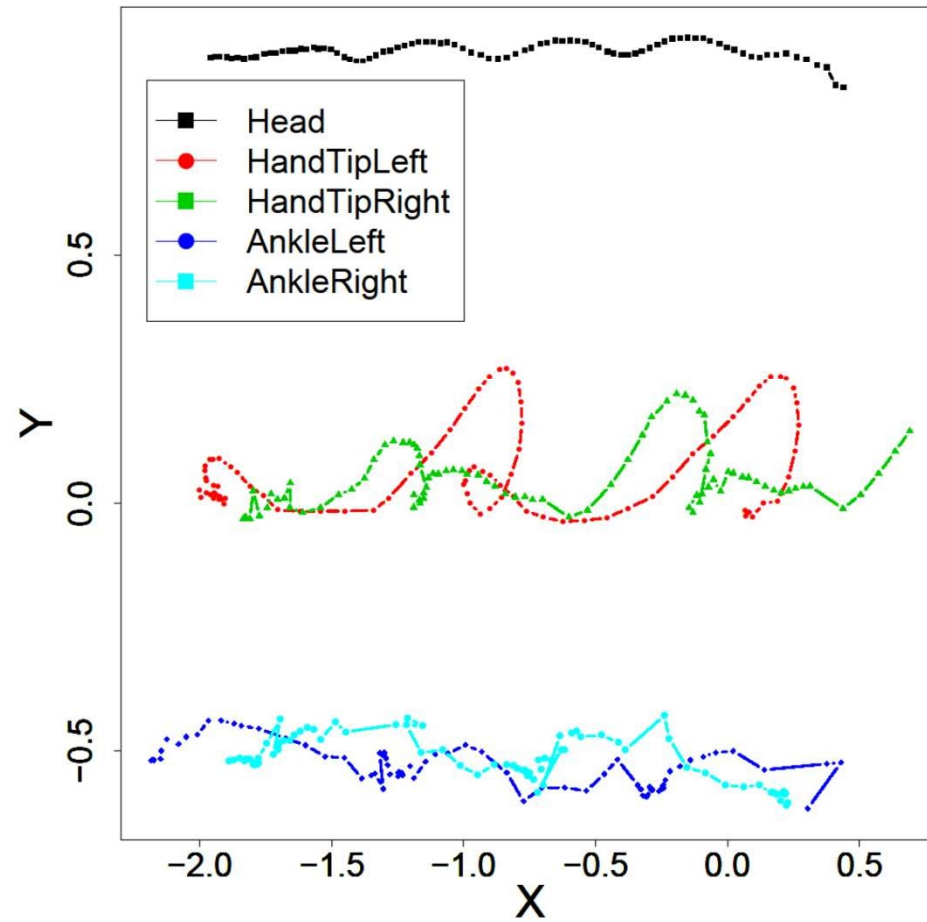
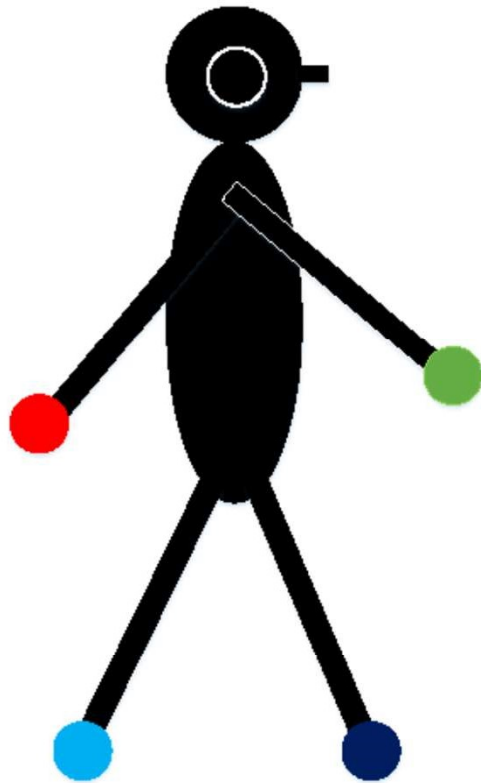
# 3. Postprocessing



# 4. Tracking

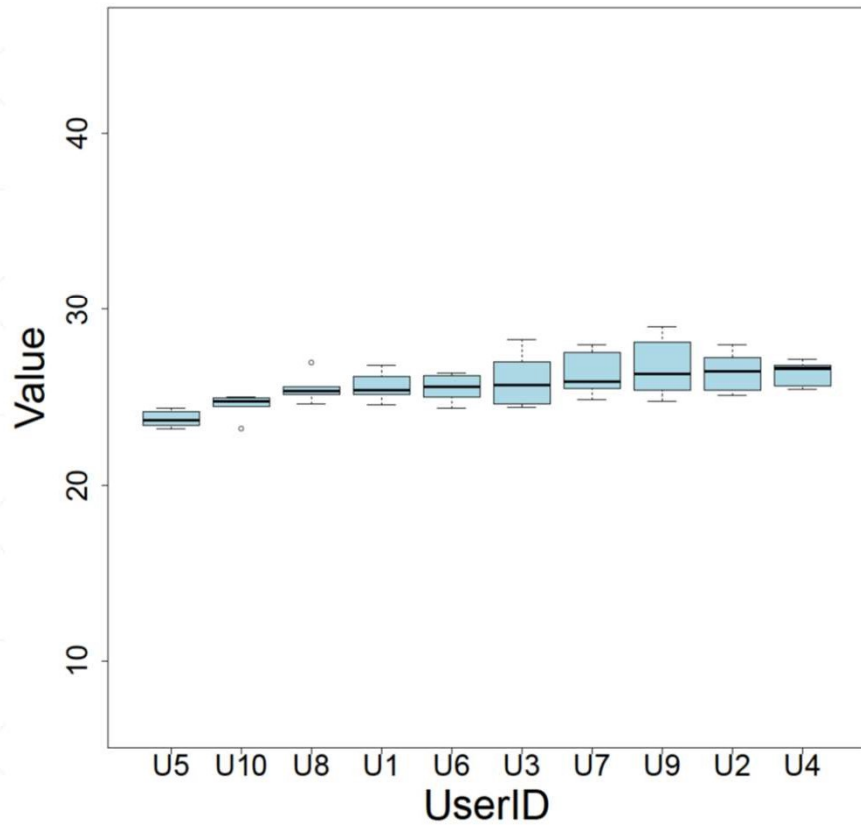
- $f_{i,k}$  is a user  $i$ 's  $k$ th feature.
  - $\theta$  is threshold. If compare  $f_{i,k}$  and  $f_{j,k'}$ ,
- $same(i, j) = \begin{cases} T & \text{if } |f_{i,k} - f_{j,k'}| \leq \theta \\ F & \text{otherwise} \end{cases}$

# Sample of Captured Data

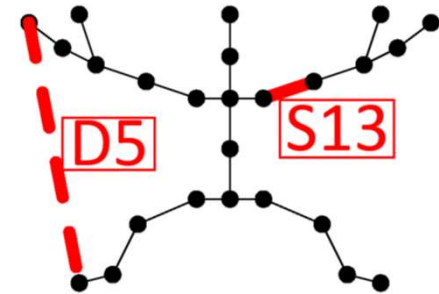
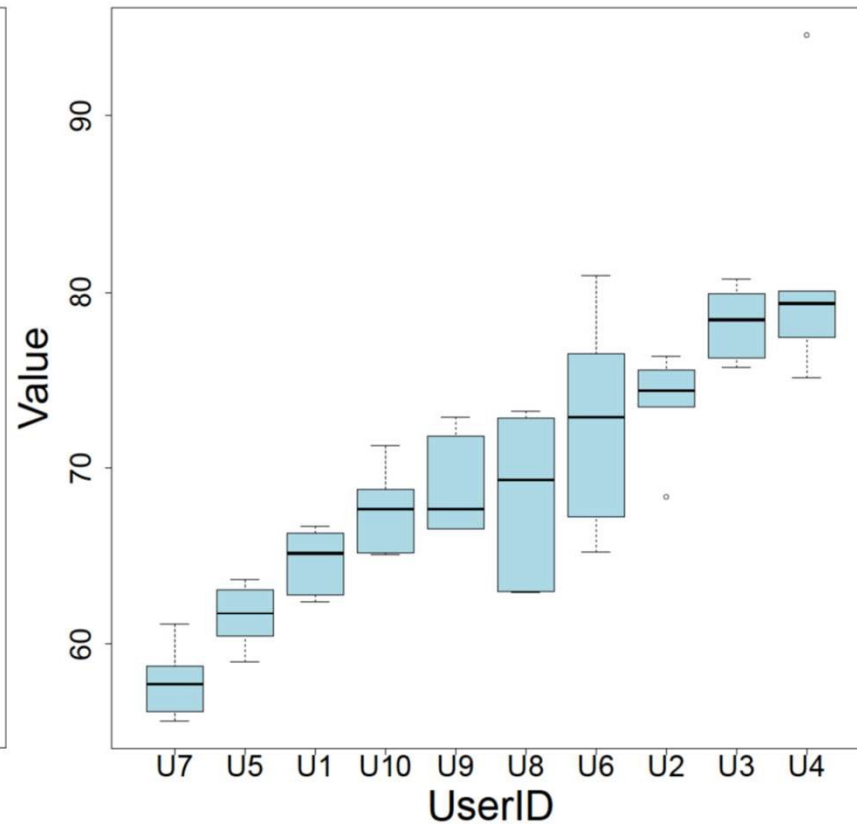


# Distribution of $\mu(S_{13}), \mu(D_5)$ of all users

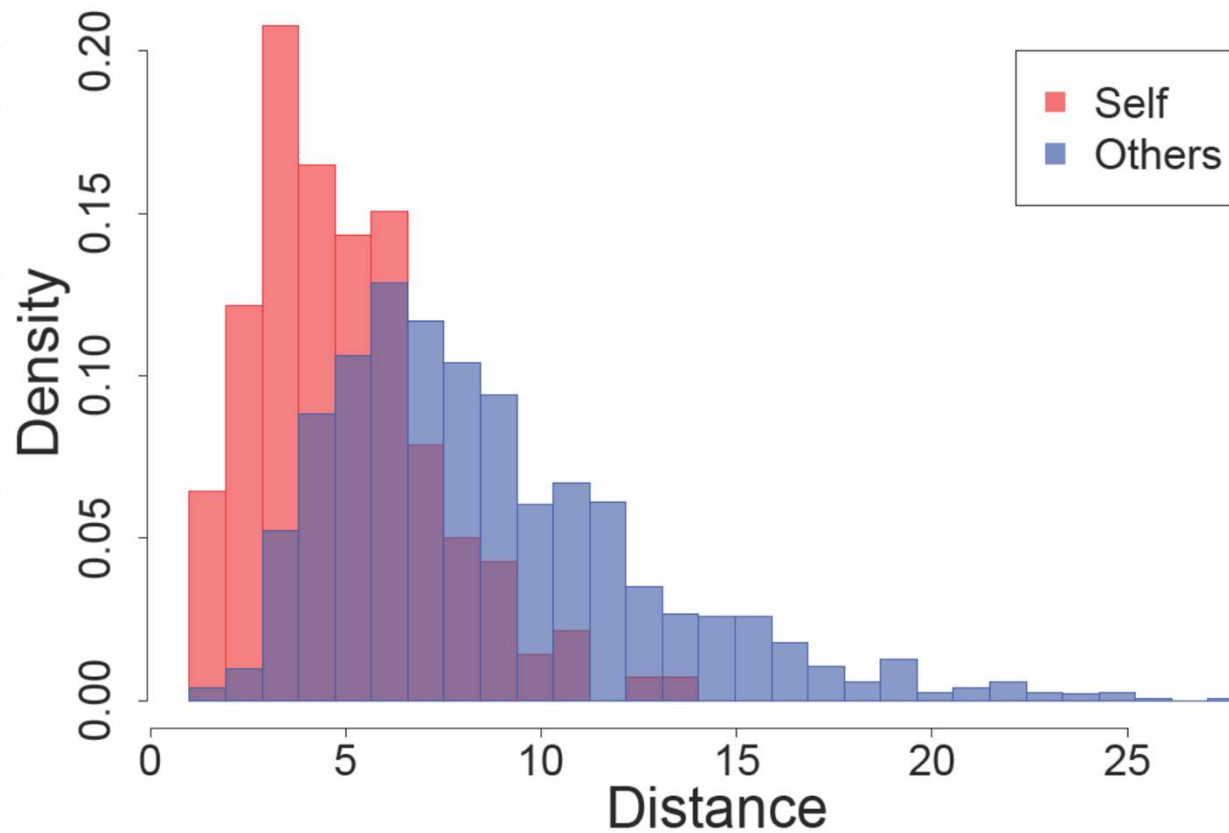
$\mu(S_{13})$



$\mu(D_5)$

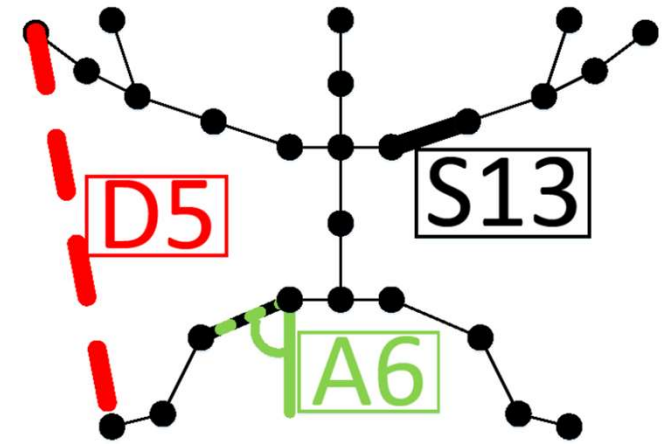
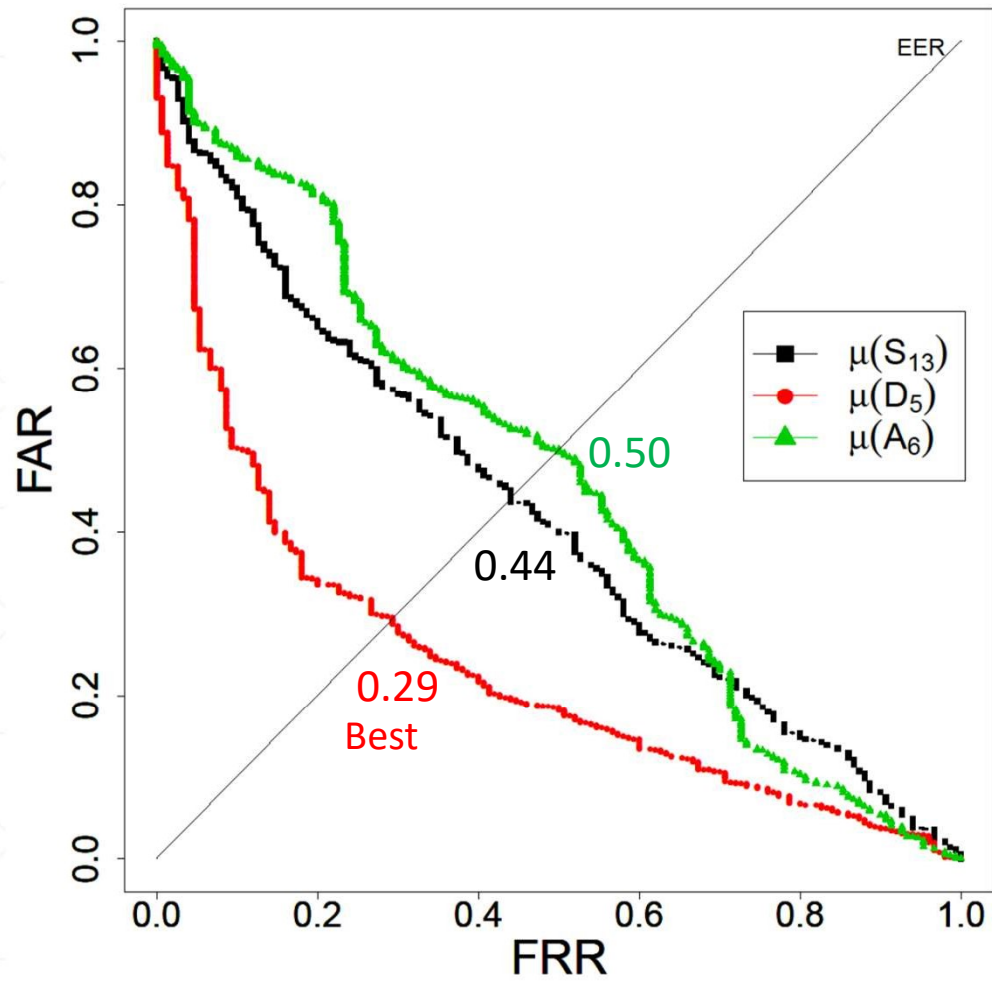


# Distance between myself and with others when combine features



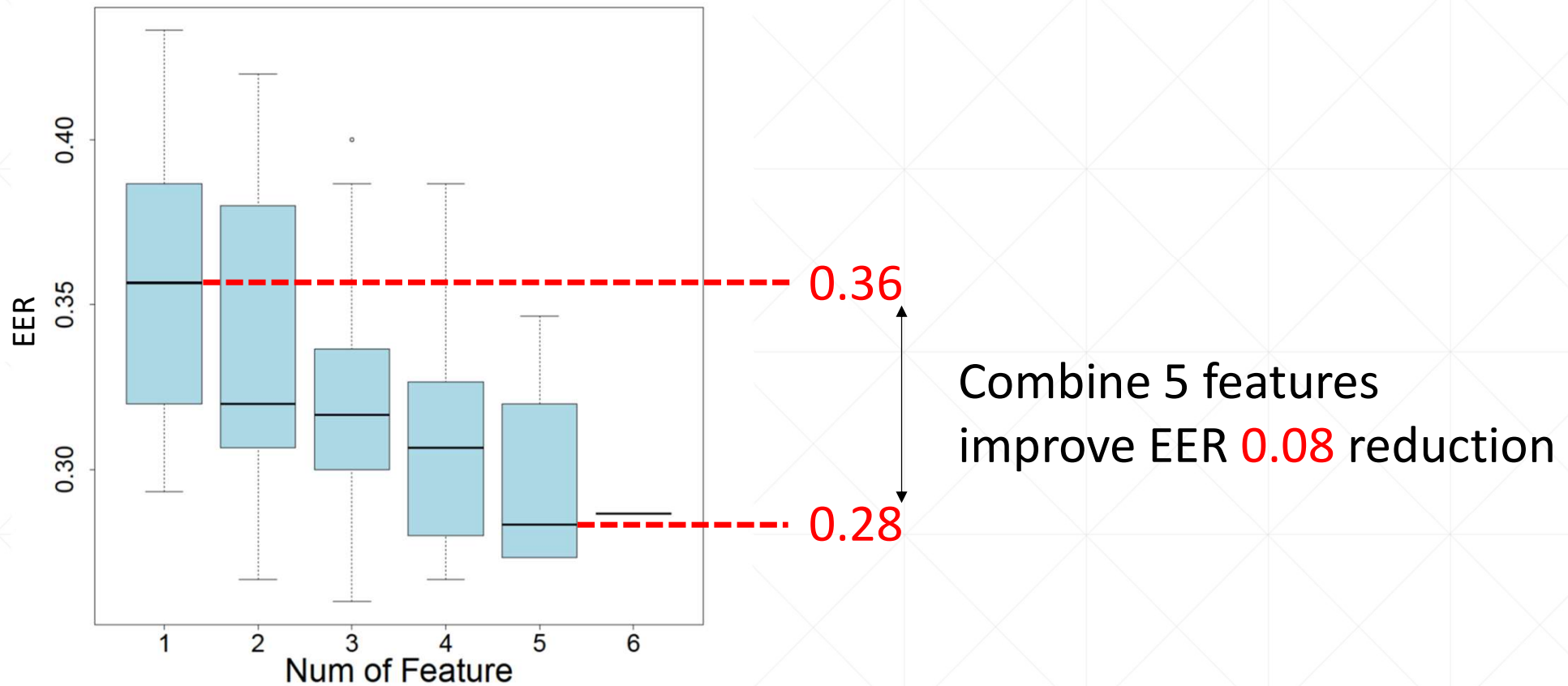


# Sample of Features



# EER when combine features

(Max of dynamic distance)



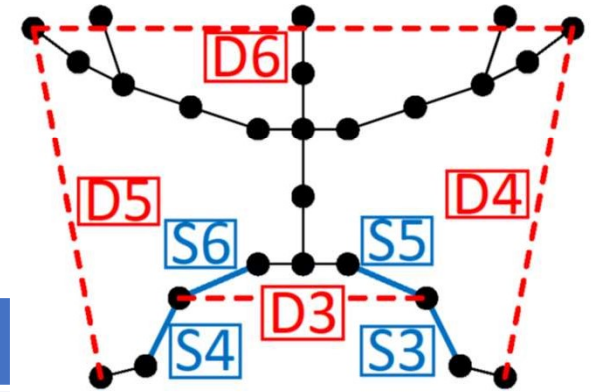
# Top5 & Worst5 in EER

Top5

Features	EER
$\mu(S_3), \mu(S_4), \mu(S_5), \mu(S_6)$	0.23
$\mu(S_2), \mu(S_3), \mu(S_4), \mu(S_6)$	0.24
$\mu(D_4), \mu(D_6)$	0.25
$\mu(D_3), \mu(D_5)$	0.25
$\mu(S_3), \mu(S_6)$	0.26

Worst5

Features	EER
$\max(S_7)$	0.55
$\text{median}(S_7)$	0.52
$\mu(S_2), \mu(S_7)$	0.51
$\mu(A_6)$	0.50
$\mu(S_2)$	0.49



# Summary and Future Work

- Summary

- In this work, We proposed a new gait tracking method and evaluated it.
  1. In single feature,  $D_5$ (RightHand-LeftHand) is best.(EER=0.29)
  2. In case of combined,  $S_{3,4,5,6}$ (leg length) is best.(EER=0.23)
  3. In case of combined, EER can be improved with 5 features, as 0.08.

- Future Work

- To find more efficient identification method.