



# Walking Style Authentication (WSA)

Group 5:

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# Overview

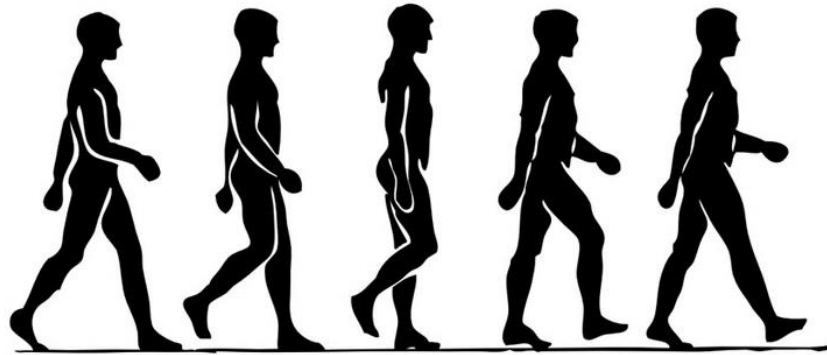
- Idea
- Approaches
  - Data Collecting & Processing
  - Linear Regression and SVM
    - Related Works
    - Results
- Future Works





# Idea

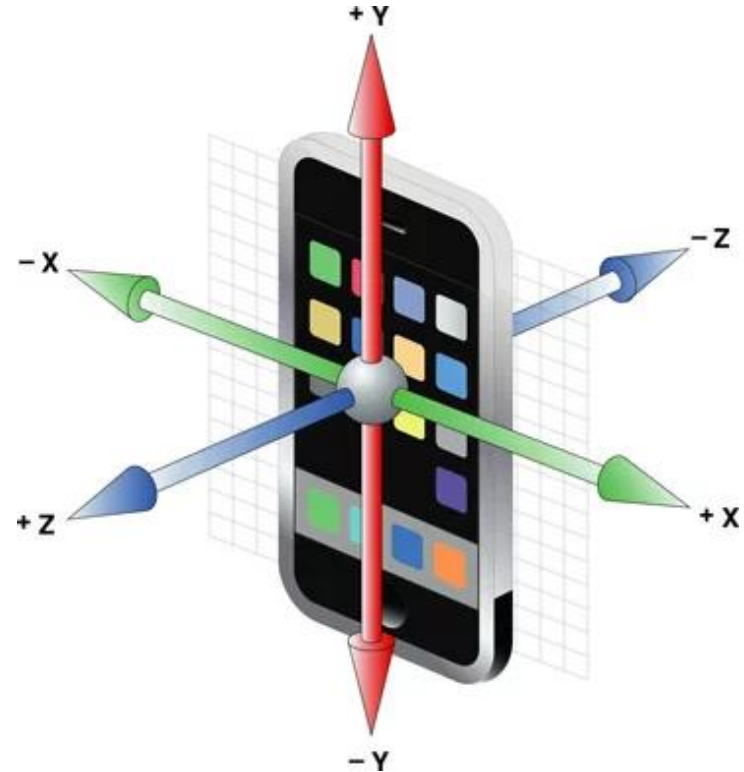
- A new method of biometric authentication based on unique walking style of each individual.





# Motion Sensors

- step counter sensor
- linear acceleration sensor



# Approach Flow Chart

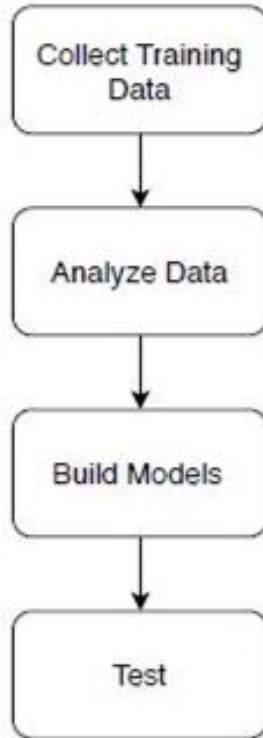


Figure 1. System Initialization

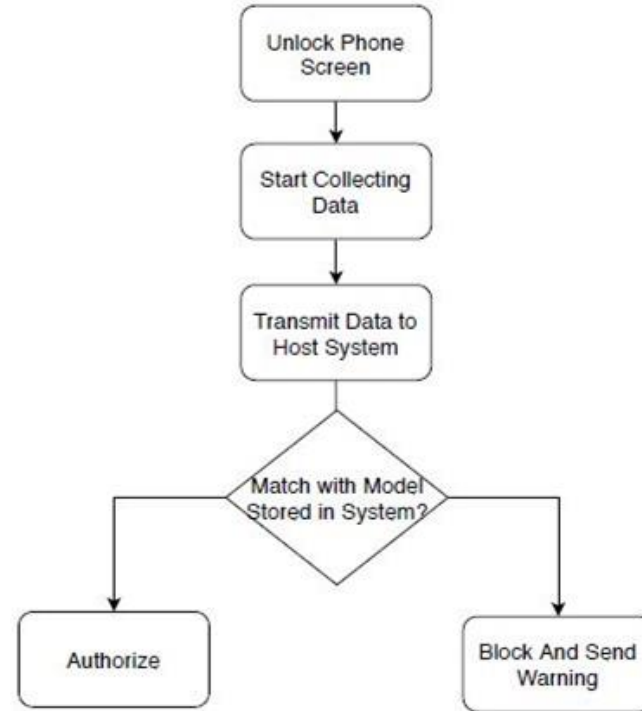
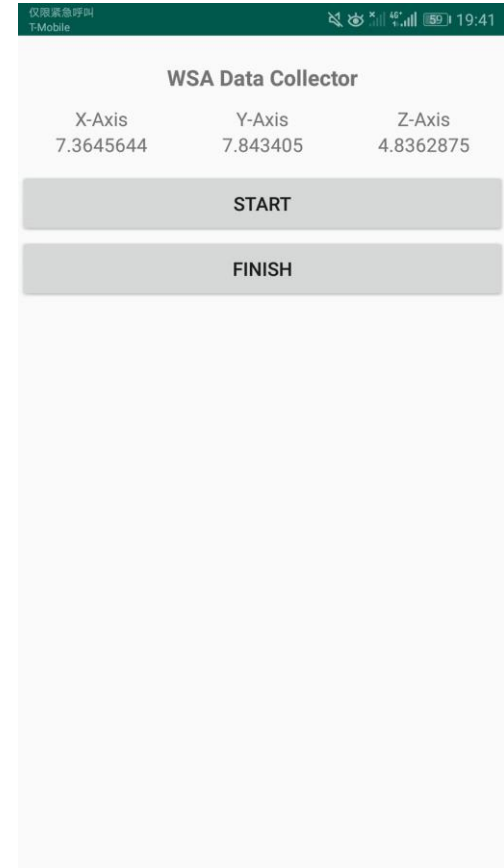


Figure 2. Authorization Process  
in Real Life



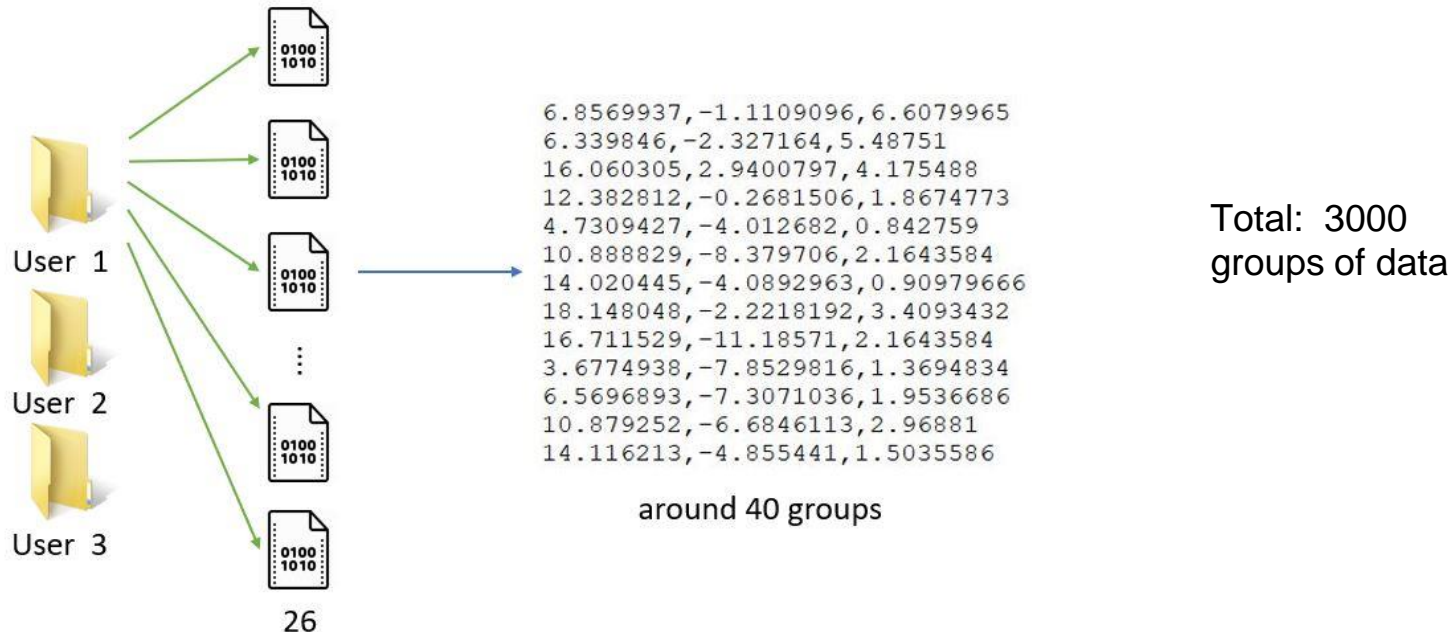
# Approach - Data Collecting

- Designed an android App using Android Studio to collect linear acceleration from x, y, and z three dimensions.
- Save the output to the external storage on the phone.
- Transmit data from phone to computer for future processing.



## Approach - Data Collecting (cont'd)

- Data collected from object walking within 10 meters.







## Approach - Data Processing

- Wrote Python programs to integrate data and add labels to the data for future training and testing
- Labelling for linear regression example:

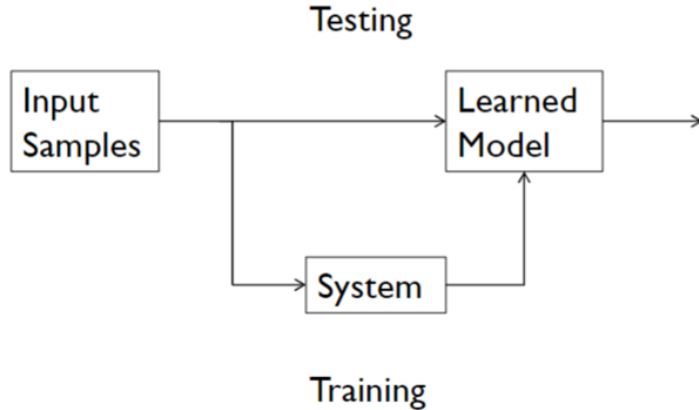
```
6.8569937,-1.1109096,6.6079965  
6.339846,-2.327164,5.48751  
16.060305,2.9400797,4.175488  
12.382812,-0.2681506,1.8674773  
4.7309427,-4.012682,0.842759  
10.888829,-8.379706,2.1643584  
14.020445,-4.0892963,0.90979666  
18.148048,-2.2218192,3.4093432  
16.711529,-11.18571,2.1643584  
3.6774938,-7.8529816,1.3694834  
6.5696893,-7.3071036,1.9536686  
10.879252,-6.6846113,2.96881  
14.116213,-4.855441,1.5035586
```



```
6.8569937,-1.1109096,6.6079965,0  
6.339846,-2.327164,5.48751,0  
16.060305,2.9400797,4.175488,0  
12.382812,-0.2681506,1.8674773,0  
4.7309427,-4.012682,0.842759,0  
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10.879252,-6.6846113,2.96881,0  
14.116213,-4.855441,1.5035586,0
```



# Approach - Related Works



- **Supervised learning** (  $\{x_n \in R^d, y_n \in R\}_{n=1}^N$  )
  - Prediction
  - Classification (discrete labels), Regression (real values)
- **Unsupervised learning** (  $\{x_n \in R^d\}_{n=1}^N$  )
  - Clustering
  - Probability distribution estimation
  - Finding association (in features)
  - Dimension reduction
- **Semi-supervised learning**
- **Reinforcement learning**
  - Decision making (robot, chess machine)

# Approach - Linear Regression

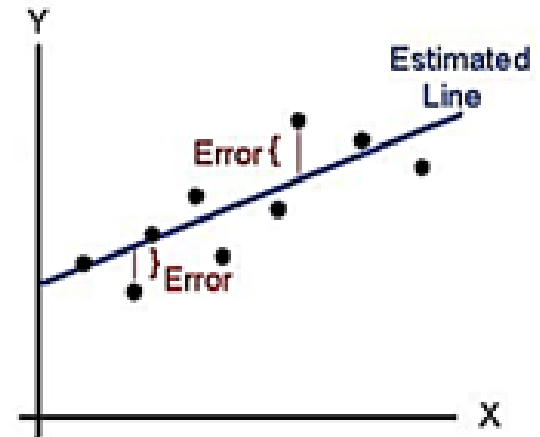
Estimated  
(or predicted)  
Y value for  
observation i

Estimate of  
the regression  
intercept

Estimate of the  
regression slope

Value of X for  
observation i

$$\hat{Y}_i = b_0 + b_1 X_i$$





# Approach - Linear Regression (Multiple Variables)

```
x = [[ 6.8569937  -1.1109096   6.6079965 ]
 [ 6.339846   -2.327164    5.48751   ]
 [ 16.060305    2.9400797   4.175488   ]
 [ 12.382812   -0.2681506   1.8674773   ]
 [ 4.7309427   -4.012682    0.842759   ]
 [ 10.888829   -8.379706    2.1643584   ]
 [ 14.020445   -4.0892963   0.90979666 ]
 [ 18.148048   -2.2218192   3.4093432   ]
 [ 16.711529  -11.18571    2.1643584   ]
 [ 3.6774938   -7.8529816    1.3694834  ]]
```

$$h_{\theta}(x) = \theta_0 + \theta_1 x_1 + \theta_2 x_2 + \dots + \theta_n x_n$$

$$h_{\theta}(x) = \theta^T X$$



# Approach - Linear Regression (Multiple Variables)

**Cost Function (MSE):**

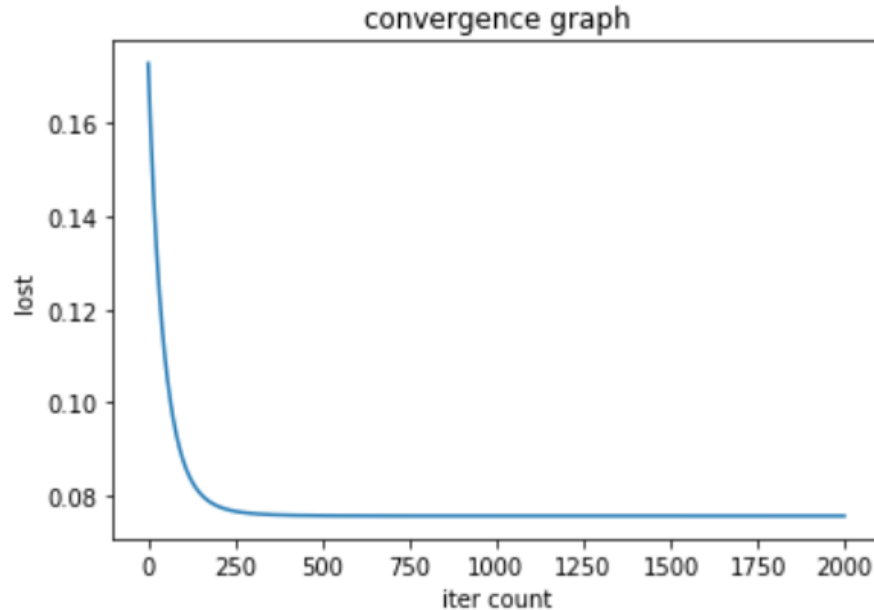
$$J(\theta_0, \theta_1 \dots \theta_n) = \frac{1}{2m} \sum_{i=1}^m \left( h_{\theta}(x^{(i)}) - y^{(i)} \right)^2$$

**Gradient Descent:**

$$\theta_j := \theta_j - \alpha \frac{1}{m} \sum_{i=1}^m ((h_{\theta}(x^{(i)}) - y^{(i)}) \cdot x_j^{(i)})$$

$\alpha$ : Learning rate

# Approach - Linear Regression (Multiple Variables)



As the count of iterations increases,  
the lost decreases.

The accuracy is about 75%.



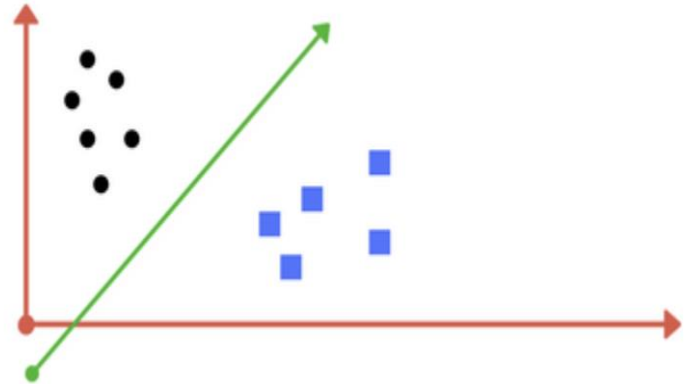
## Approach - SVM (Cont'd)

- Support Vector Machine (SVM)

SVM is a supervised learning algorithm. Given labeled training data, it would establish a learned model and discriminatively divide data into two parts.

- Realization

With SVM, the accuracy of authentication has been calculated and plotted.





## Approach - SVM (Cont'd)

### ☐ Data processing

- ☐ In the form of  $[x_1, y_1, z_1, x_2, y_2, z_2, \dots, x_n, y_n, z_n, \text{step\_count}]$  for each line.
- ☐ Attach label 1 to people with authorization and label 0 to others.
- ☐ Create four file.txt separately for label 0, label 1, data of label 0 and data of label 1.

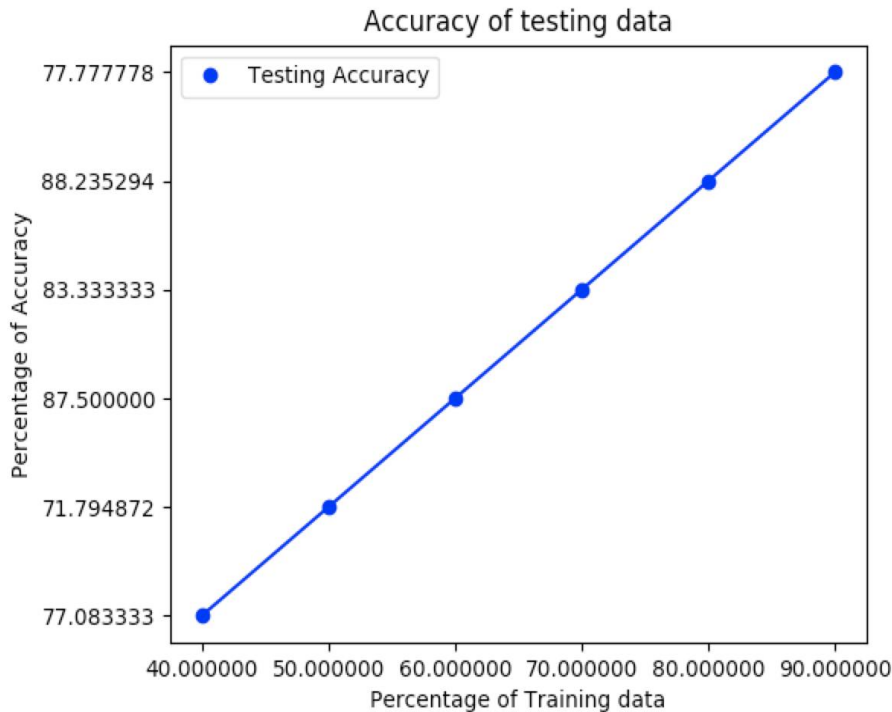
### ☐ Training and Testing

- ☐ Set parameters for SVM and run with input.
- ☐ Divide each file for training and testing with certain percentage. Then mix all the label files and mix all the data files.
- ☐ Change the percentage of training data and testing data to obtain accuracy.





## Approach - SVM (Cont'd)



Result:

Improve the accuracy of Linear Regression Algorithm, with 88.2% highest.



# Future Works

- Improve accuracy
  - Expand the amount of data for training
  - Try other algorithms
- Transfer data
  - Design an APP which can realize that transferring data from android to system automatically once finishing recording



# Questions?



Thank you!