



PROJECT: CHARACTER RECOGNITION

EQ2341:PATTERN RECOGNITION AND MACHINE LEARNING

GROUP 15

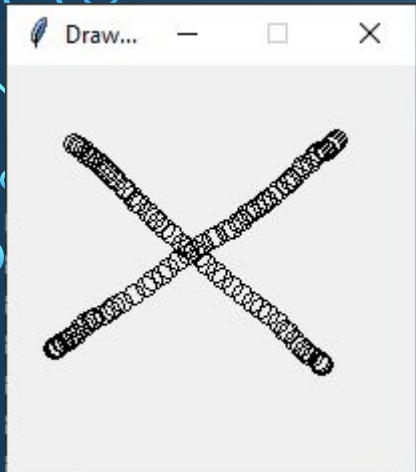
JONAS CEDERBERG:

Information and Network Engineering Msc.- Information Engineering Track

SERKAN ARDA YILAL:

Information and Network Engineering Msc.- Multimedia Processing and Analysis Track

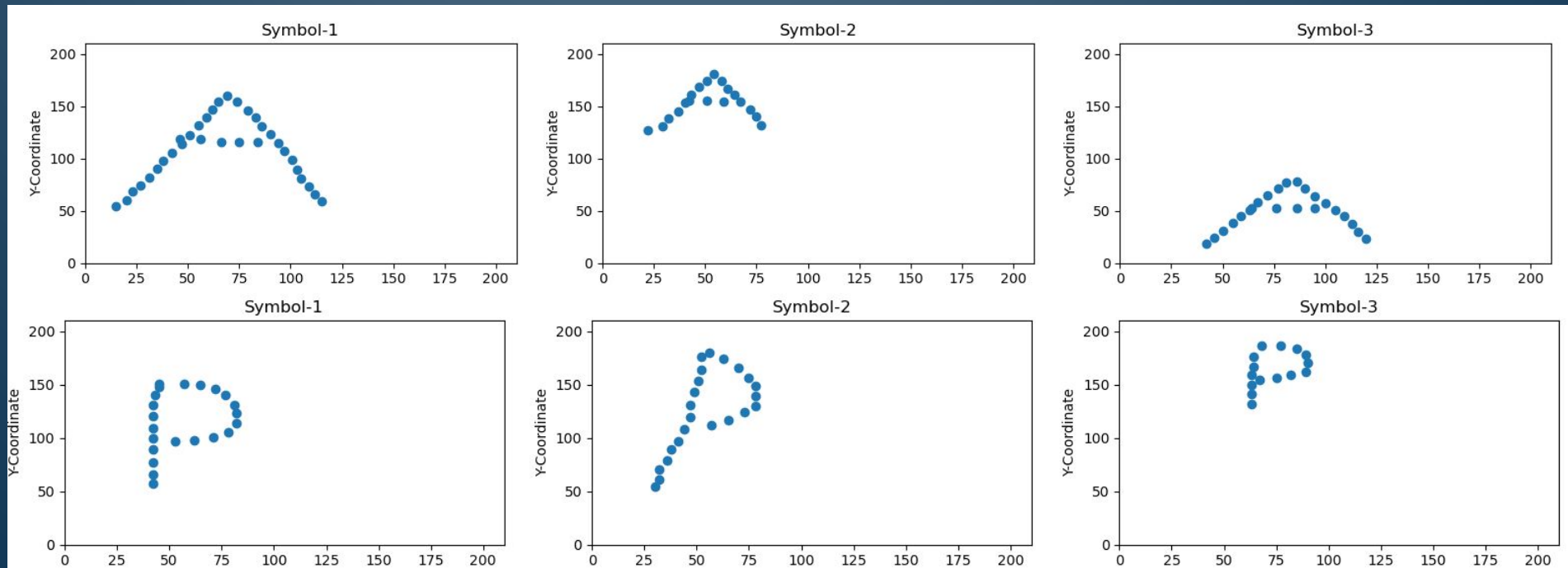
Application and Data



Characters that we have used in the project for training and classification:

[A, C, K, P, X, T, +, N, V, 4]

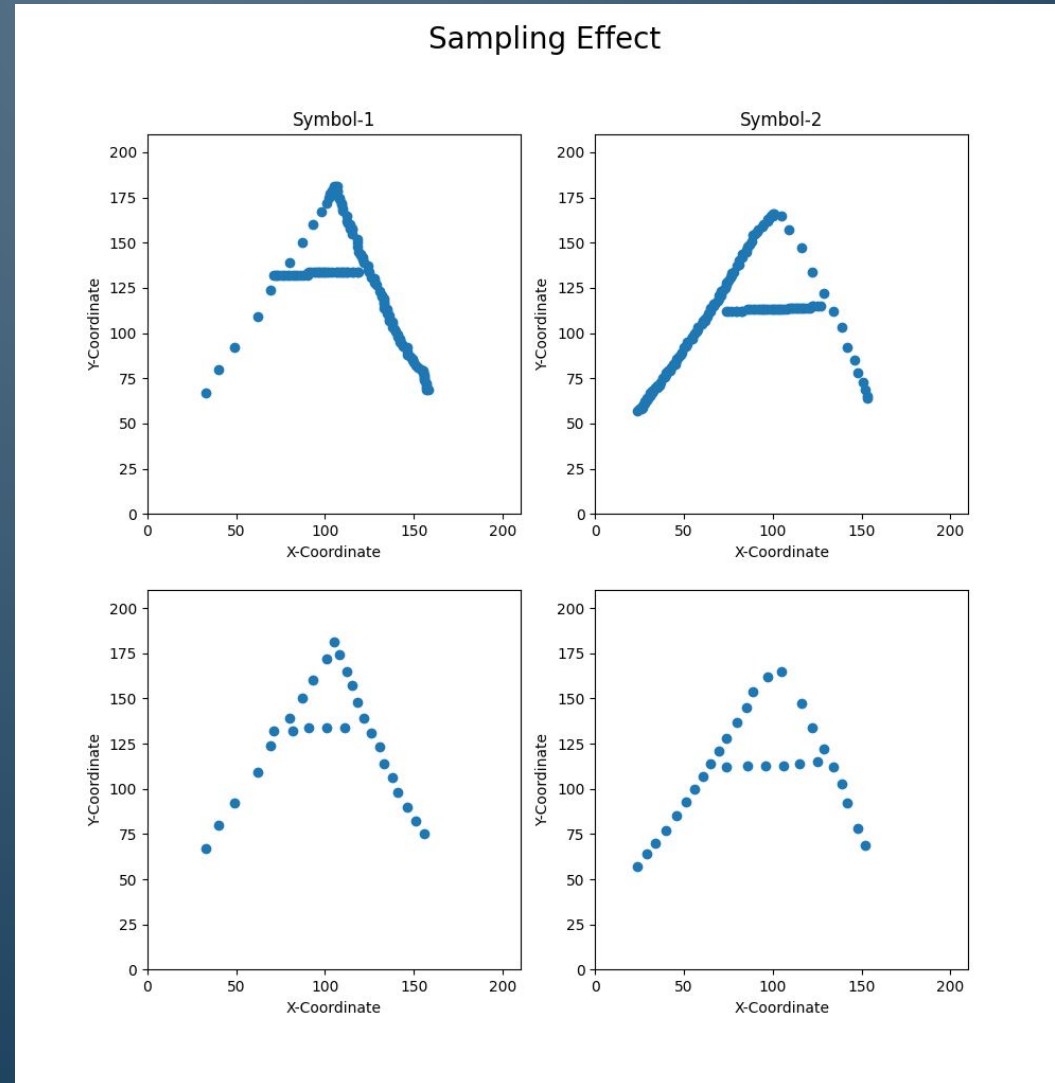
Examples:



Feature Extraction

1) Sampling of Drawings

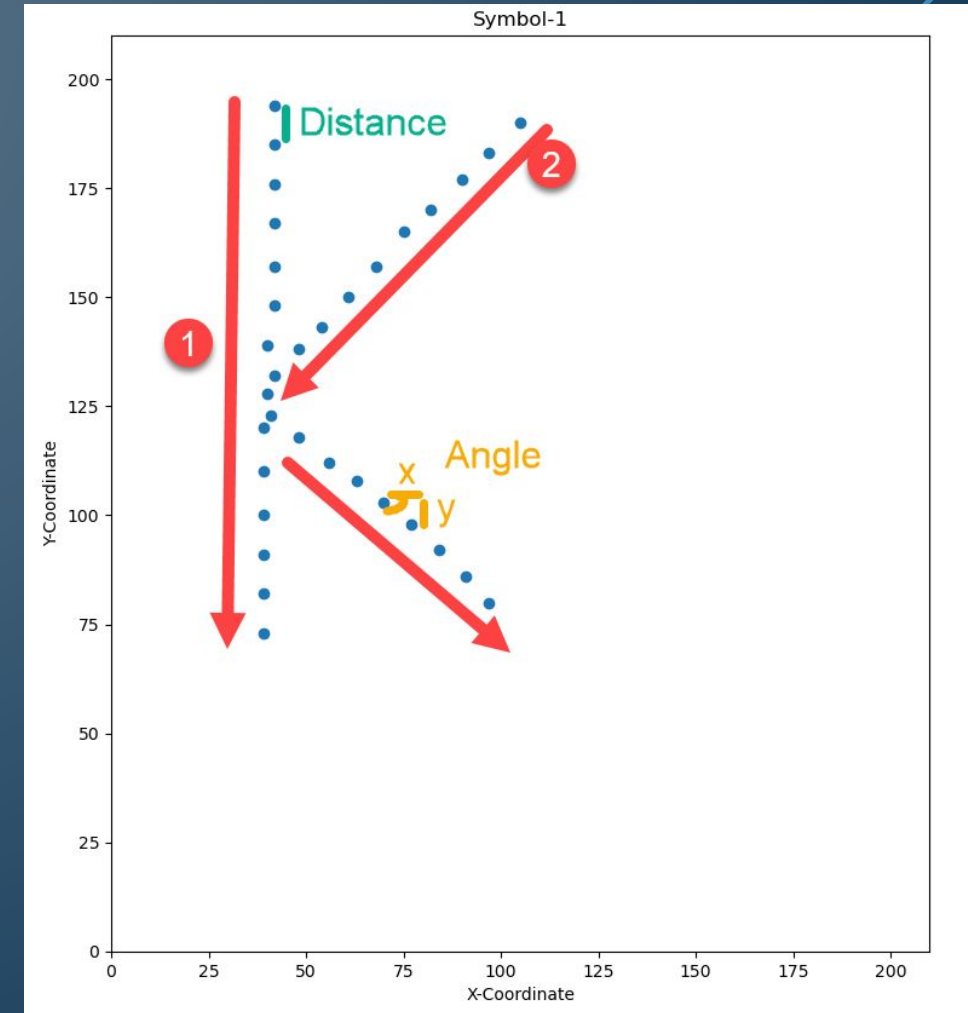
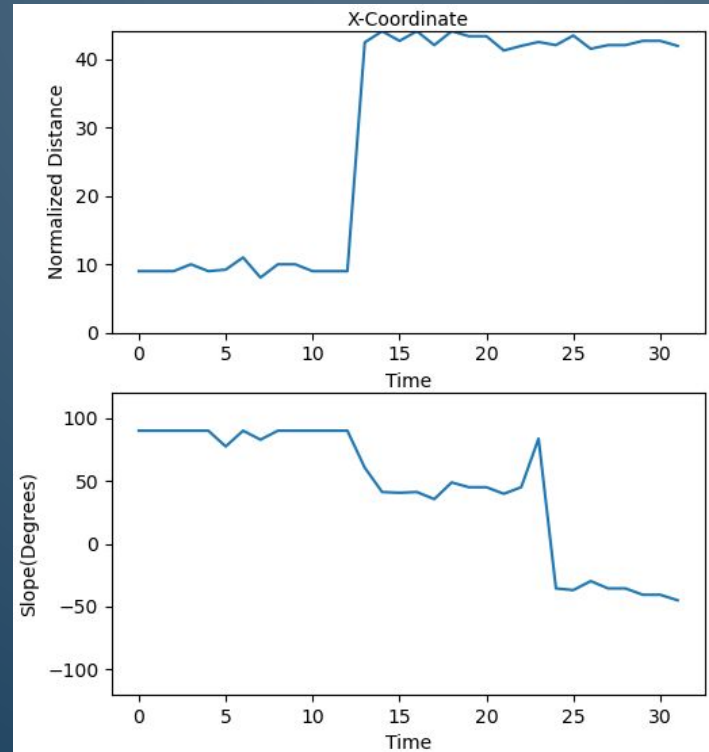
- Decreases Sensitivity against speed
- More consistent extraction



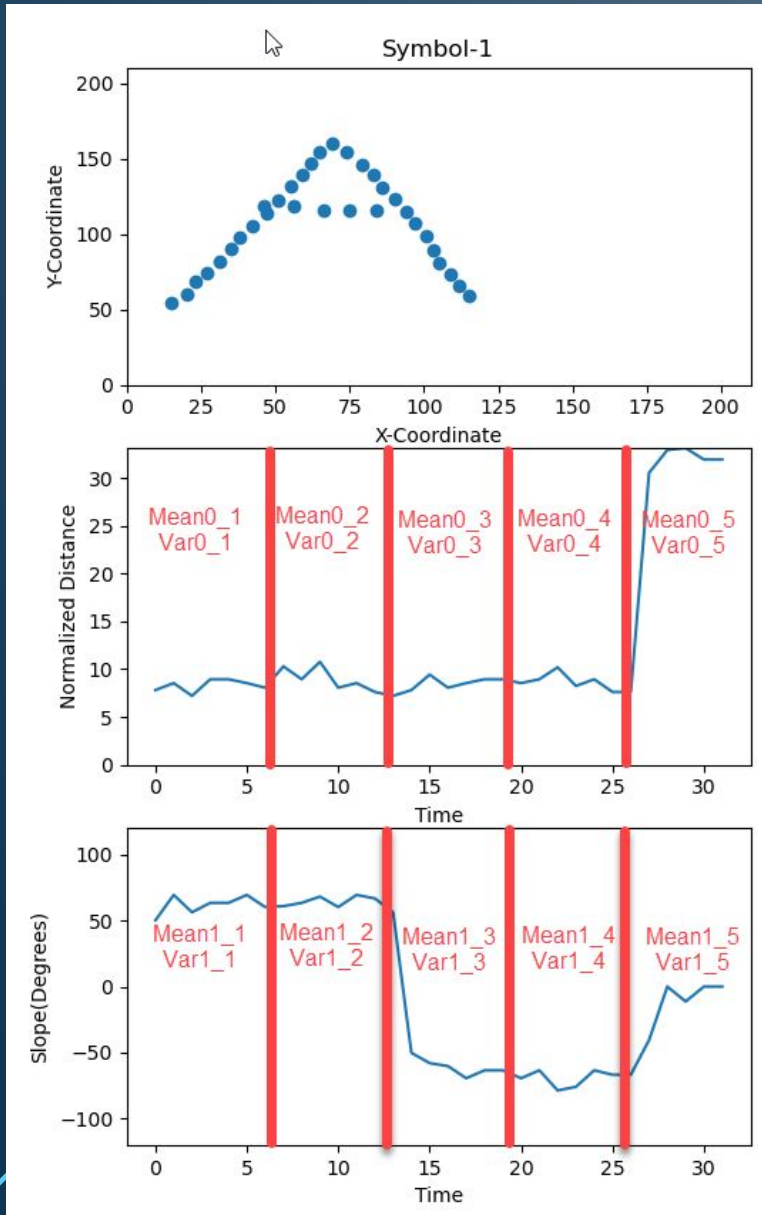
Feature Extraction

2) Feature Types

- Feature 1: Distances
-Continuous Vectors
- Feature 2: Angle
-Continuous Vectors



HMM Design



Number of States = 5

$x = 0.1 / (\text{Number of States} - 1)$

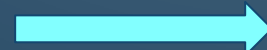
$y = 0.1 / (\text{Number of States} - 2)$

$$q = \begin{bmatrix} 0.9 & x & x & x & x \end{bmatrix}$$

$A =$

$$\begin{bmatrix} 0.8 & 0.1 & y & y & y \\ y & 0.8 & 0.1 & y & y \\ y & y & 0.8 & 0.1 & y \\ y & y & y & 0.8 & 0.1 \\ x & x & x & x & 0.9 \end{bmatrix}$$

Mean



Covariance

multigaussD

B

HMM Model

Training process

A > 20 Training Samples + 10 Test Samples
C > 20 Training Samples + 10 Test Samples
K > 20 Training Samples + 10 Test Samples
P > 20 Training Samples + 10 Test Samples
X > 20 Training Samples + 10 Test Samples
T > 20 Training Samples + 10 Test Samples
+ > 20 Training Samples + 10 Test Samples
N > 20 Training Samples + 10 Test Samples
V > 20 Training Samples + 10 Test Samples
4 > 20 Training Samples + 10 Test Samples

of training iteration = 12

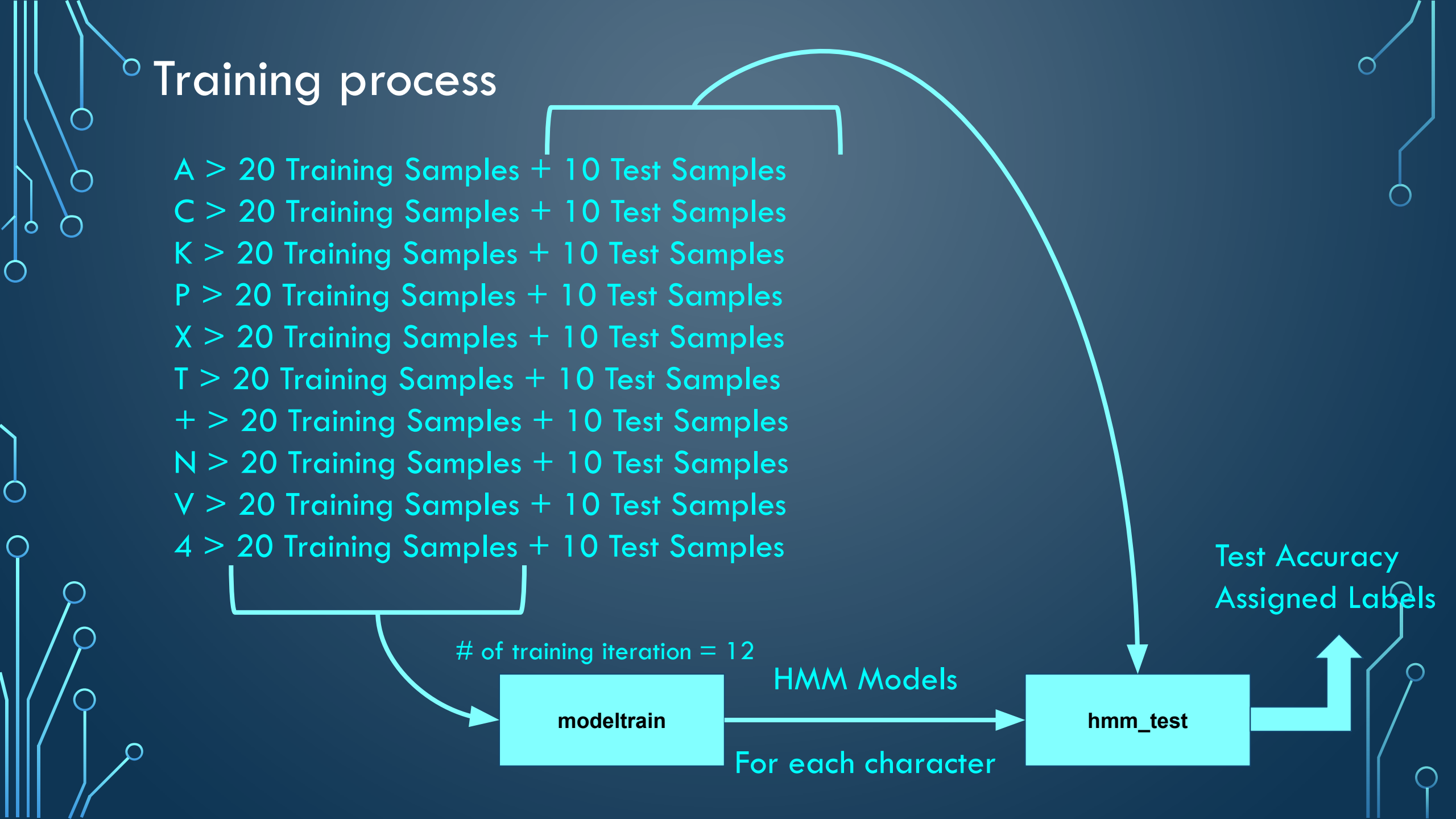
modeltrain

HMM Models

For each character

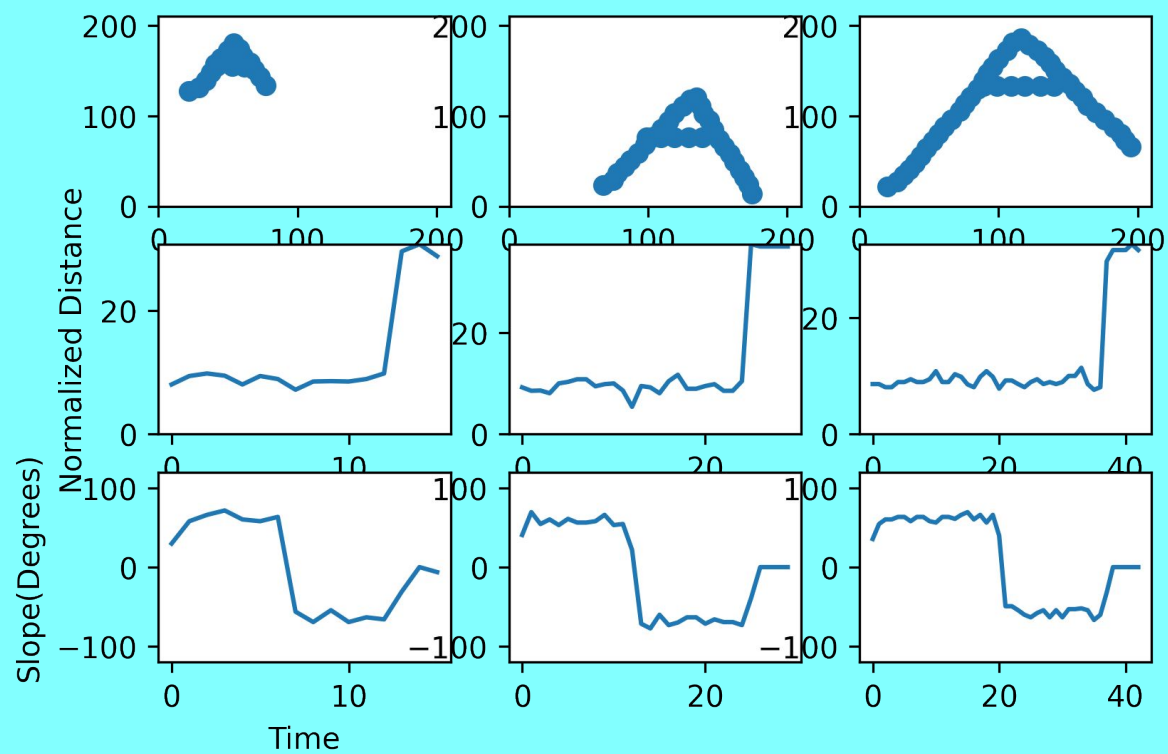
hmm_test

Test Accuracy
Assigned Labels

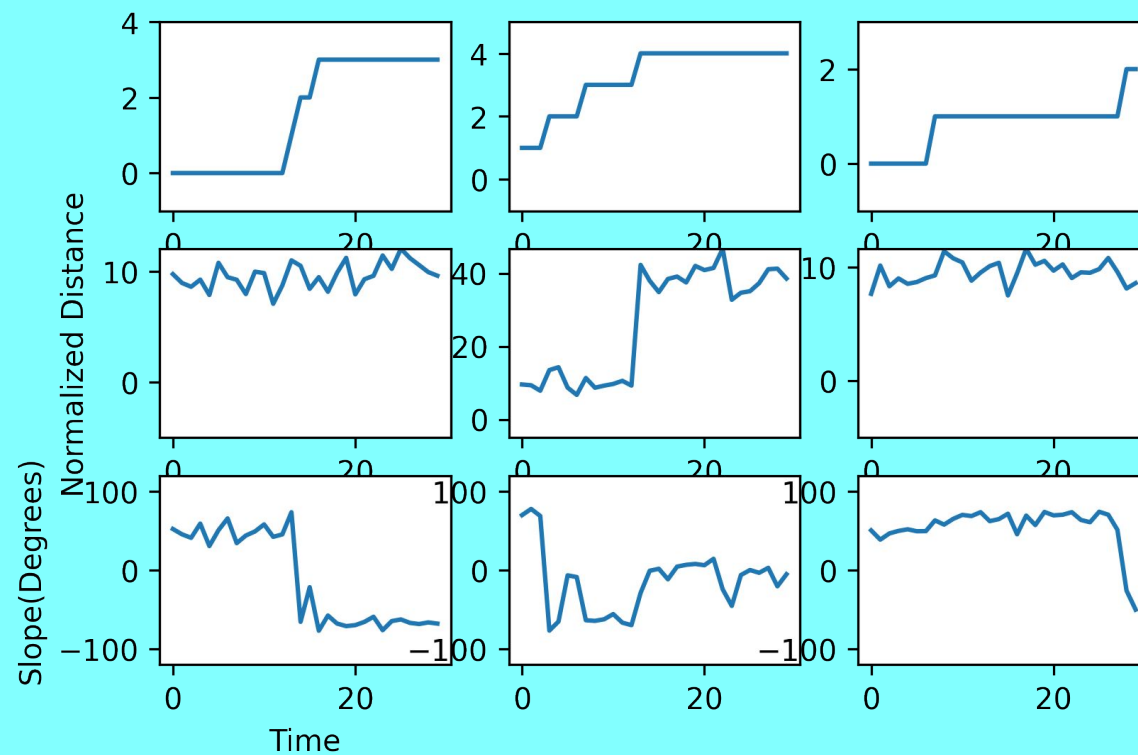


Training sequences

Training characters visualized with features A



Random sequences from HMM model of A



Classification results

Classification Accuracy of Test Samples of Character A: 100%

Classification Accuracy of Test Samples of Character C: 100%

Classification Accuracy of Test Samples of Character K: 90%

Classification Accuracy of Test Samples of Character P: 50%

Classification Accuracy of Test Samples of Character X: 70%

Classification Accuracy of Test Samples of Character T: 0%

Classification Accuracy of Test Samples of Character +: 30%

Classification Accuracy of Test Samples of Character N: 90%

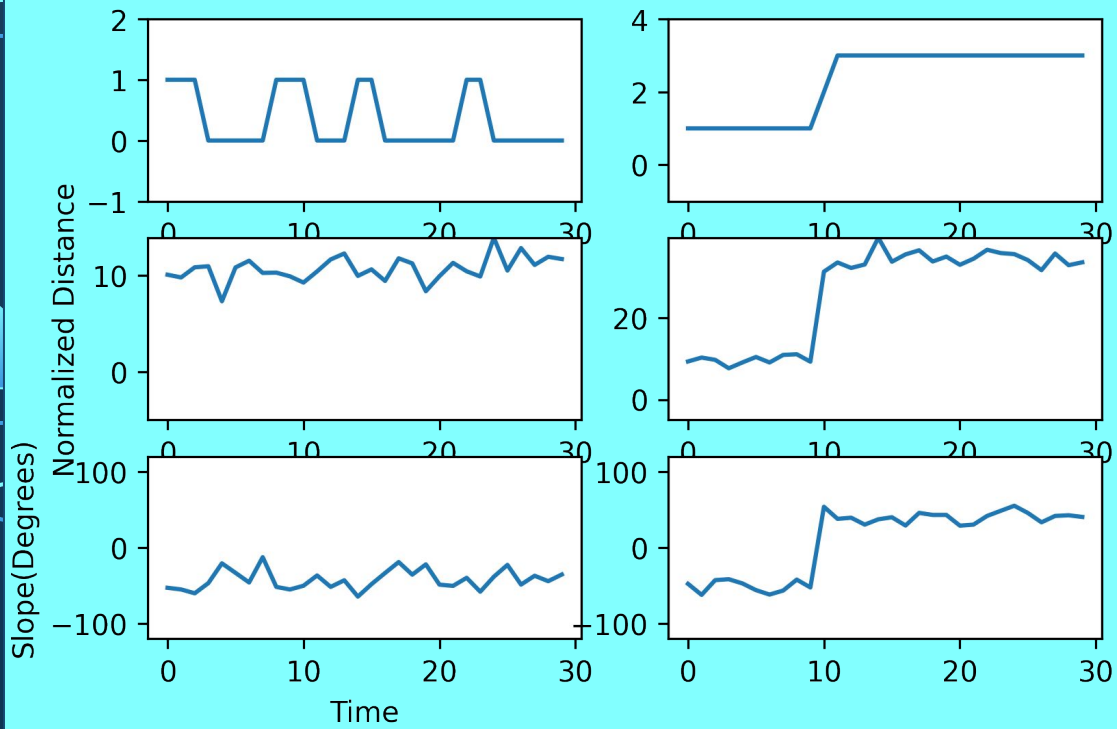
Classification Accuracy of Test Samples of Character V: 10%

Classification Accuracy of Test Samples of Character 4: 80%

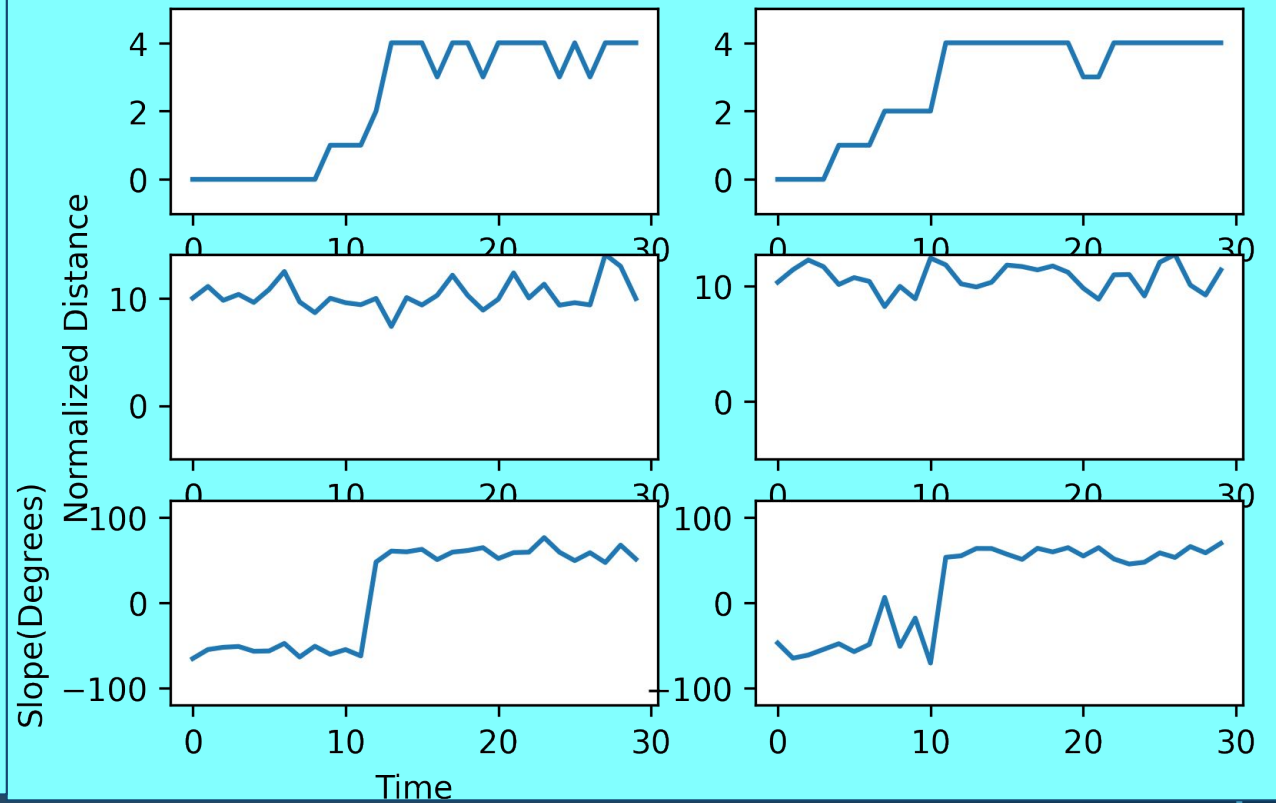
Common misclassifications

V: ['X', 'X', 'X', 'X', 'X', 'X', 'X', 'X', 'X', 'V']
T: ['P', 'N', 'P', 'P', 'P', 'V', 'P', 'P', 'P', 'V']
+: ['V', '+', 'P', 'P', '+', 'P', '+', 'N', 'V', 'P']

Random sequences from HMM model of X



Random sequences from HMM model of V



Conclusions

Strengths and weaknesses

- Half of the character classifications have accuracy higher than 80 %
- Robust against character scalings and positions
- Features are not unique enough
- Number of states is not adaptive for each class

Improvables

- More features can be extracted (Centroid of character)
- Angle feature can be stabilized
- Adaptive number of states can be implemented

Lessons

- Classification
- Start with less class to get rid of problems earlier
- Be sure about quality of features