# Session 2 Recognizing Handwritten Digits

Computer Vision Group IIT Madras

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### Outline

- Feature Extraction
  - Observing MNIST dataset
  - Saving features to a file
- Training a classifier
  - Support Vector Machines
  - Implementing an SVM
- Testing the classifier
  - Using the classifier on new images
  - Evaluation Measure
- Scope for improvement

# Observing MNIST dataset

Feature Extraction

### Training set

Unzip the .zip file which has been provided to you. We'll use contents of the extracted 'training' folder to train our classifier.

### Test set

Unzip the .zip provided to you. We'll use the contents of the extracted 'test' folder to test the performance of our classifier.

### Observe the folders labeled 0 and 1

Each folder has images of a particular handwritten digit.

#### Feature Extraction

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### CSV format

Traverse through each image in the row-major form and store the values seperated by a comma. Each line in the file will correspond to features from a single image.

### Example

A CSV form of five  $28 \times 28$  images will have 5 lines, with each line containing  $(28 \times 28 - 1)$  commas.

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### **CSV** format

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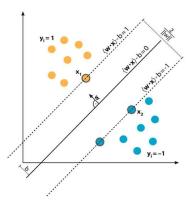
### Example

A CSV form of five  $28 \times 28$  images will have 5 lines, with each line containing ( $28 \times 28$  - 1) commas.

 You should now have two files, namely train.csv and test.csv which contain data corresponding to the training and test datasets.

# Support Vector Machines

Training a Classifier



- They find an optimal seperation between classes.
- OpenCV has inbuilt functions to implement this classfier.

# Implementing an SVM

Training a classifier

Hands on

# Using the classifier on new images

Testing the classifier

Hands on

### Evaluation Measure - Misclassification rate

Testing the classifier

Since its a classification task (image is being classified as one of 10 digits), misclassification rate could be used as a criterion for evaluating the performance of the classifier.

### Other performance measures

- Precision
- Recall

# Scope for improvement

• Feature Extraction?

# Scope for improvement

- Feature Extraction?
- Reducing the number of features?

# Scope for improvement

- Feature Extraction?
- Reducing the number of features?
- Better classifier?

# Summary

### Today's session

We successfully built a handwritten gesture recongition. We also learnt about support vector machines.

### Tomorrow's session

- Segmenting out digits using the classfier we built today.
- We used cropped images to train our classifier today. What if there
  are many digits in the image? How do we automatically find out the
  parts of the image which contain digits?