

# Mathematical Foundations for Computer Vision and Machine Learning

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# Assignment 09

## Jupyter Notebook

- Create a new notebook for Python 3
- Include your name and the student ID in the notebook
- Write python 3 codes for the given assignment
- Try to separate the codes into meaningful blocks
- Write a comment for each block of codes
- Plot the important intermediate results
- Write a short description for each graphical result
- Use LaTeX for mathematical comments in the notebook
- Save the notebook file as [assignment09.ipynb](#)
- Download the notebook as a PDF file [assignment09.pdf](#)

# Assignment 09

## github

- Start a project or a directory for the [assignment09](#)
- Include the link to the giuhub for the assignment in the notebook
- Upload the notebook [assignment09.ipynb](#) to the github after the deadline (Note that your github project is visible to public)

# Assignment 09

## Submission to *eclass*

- Submit the PDF file [assignment09.pdf](#) to *eclass*
- Deadline is 11:59 pm on next Thursday. No extension
- Score ranges from 0 to 5

# Assignment 09

## Score Table

- The results should be correct
- The codes should be written in a modulated way
- The comment should be made for each block of the codes
- The important intermediate results should be presented
- The link to the github project should be included

# Assignment 09

## Build a binary classifier

- Define a linear bi-partitioning function  $\tilde{f}$  to classify digit '0' against all the other digits '1', '2', '3', '4', '5', '6', '7', '8', '9' using the **training data** at MNIST dataset
- Define the classifier  $\hat{f}(x) = \text{sign}(\tilde{f}(x))$  using the sign function:

$$\text{sign}(x) = \begin{cases} +1 & \text{if } x \geq 0 \\ -1 & \text{if } x < 0 \end{cases}$$

- Evaluate the performance of the classifier  $\hat{f}$  using the **testing data** at MNIST dataset based on TP(True Positive), FP(False Positive), TN(True Negative) and FN(False Negative)

# Assignment 09

## Build a binary classifier

- Let  $x = (x_1, x_2, \dots, x_{784})$  be a vector that represent an image of the size  $28 \times 28$  (vectorised by column-wise)
- Let  $f_i$  be a feature function such tat  $f_i : \mathbb{R}^{784} \rightarrow \mathbb{R}$ :

$$f_i(x) = r_i^T x, \quad r_i \sim \mathcal{N}(0, \sigma), \quad r_i \in \mathbb{R}^{784}$$

where  $r_i$  denotes a random vector drawn from a normal distribution. (function: `numpy.random.normal`)

- The partitioning function  $\tilde{f} : \mathbb{R}^{784} \rightarrow \mathbb{R}$  is defined by:

$$\tilde{f}(x; \theta) = \theta_1 f_1(x) + \theta_2 f_2(x) + \dots + \theta_p f_p(x)$$

where  $\theta = (\theta_1, \theta_2, \dots, \theta_p)$  denotes the model parameters

# Assignment 09

## Essential Visualisation

- Try with varying the number of parameters  $p$  with the standard deviation  $\sigma = 1$  of the random feature vector  $r$
- Present the best  $F_1$  score among the results with different number of parameters  $p$
- Plot the average image ( $28 \times 28$ ) of True Positive
- Plot the average image ( $28 \times 28$ ) of False Positive
- Plot the average image ( $28 \times 28$ ) of True Negative
- Plot the average image ( $28 \times 28$ ) of False Negative



# Assignment 09

$$F_1 \text{ score} = 2 \cdot \frac{\text{precision} \cdot \text{recall}}{\text{precision} + \text{recall}}$$

