MACHINE LEARNING BITS F464

ASSIGNMENT 1

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Assignment 1A: Fischer's Linear Discriminant

Model Description

Fisher Linear Discriminant technique is used to project the Higher Dimensional data to a line which preserves direction useful for data classification.

The three main steps involved are:

- 1. The first step is to calculate the separability between different classes (between-class variances)
- 2. The second step is to calculate the distance between the mean and the samples of each class.
- 3. The third step is to construct the lower dimensional space which minimizes the variance and maximizes the Mean distance between the classes.

Model implementation

- Aim is to maximise $\frac{(M_1 M_2)^2}{s1^2 + s2^2}$ where M1 and M2 are the data mean in 3D space and s1² and s2² are corresponding variances
- Solving the optimisation problem by Legrange multiplier, to find the weights

$$\circ \quad \omega \propto S_W^{-1}(M_1 \ - \ M_2)$$

 Project the 3 dimensional points to a single dimension and then visualise their Normal Distribution

$$O N_1(x) = \frac{1}{\sqrt{2\pi\sigma_1^2}} exp\{\frac{-(x-\mu_1)^2}{2\sigma_1^2}\} \forall x \in C_1$$

$$O N_2(x) = \frac{1}{\sqrt{2\pi\sigma_2^2}} exp\{\frac{-(x-\mu_2)^2}{2\sigma_2^2}\} \forall x \in C_2$$

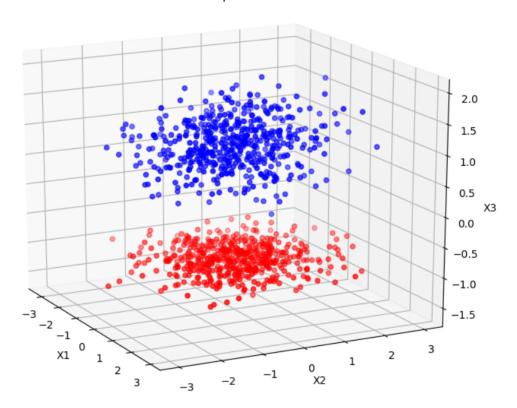
- Finding the intersection of these distributions
 - Solving the Quadratic Equation

$$\left(\frac{1}{\sigma_{2}^{2}} - \frac{1}{\sigma_{1}^{2}}\right)x^{2} + 2\left(\frac{-\mu_{2}}{\sigma_{2}^{2}} + \frac{-\mu_{1}}{\sigma_{1}^{2}}\right)x + \left(\frac{\mu_{2}^{2}}{\sigma_{2}^{2}} - \frac{\mu_{1}^{2}}{\sigma_{1}^{2}} + \log_{e}\left(\frac{\sigma_{2}^{2}}{\sigma_{1}^{2}}\right) = 0$$

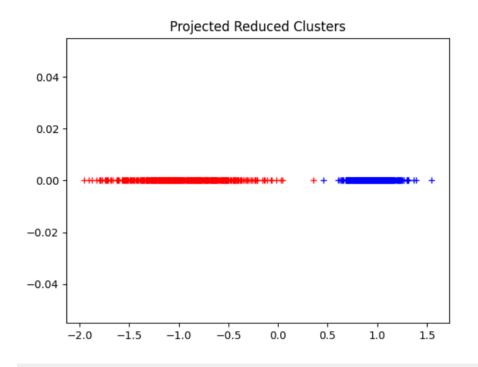
- And hence plotting the Discriminating Hyperplane by projecting this threshold value back High Dimensional Space.
- Estimating the accuracy of Classification

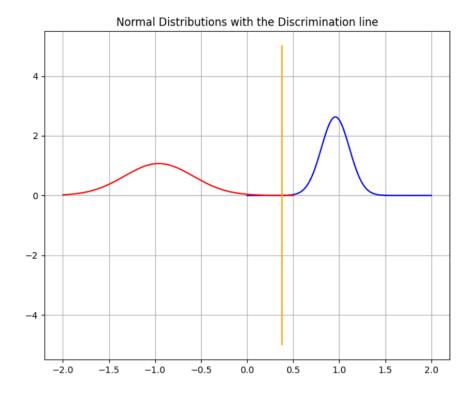
3D Plot of Data

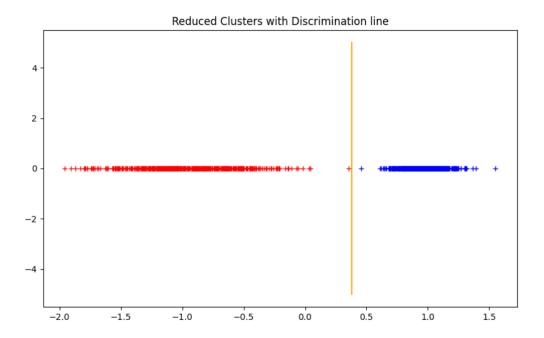
3D Scatter plot of Data



Plot of Reduced Clusters



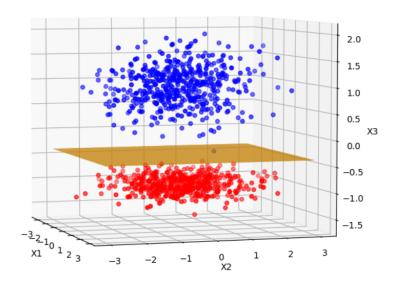




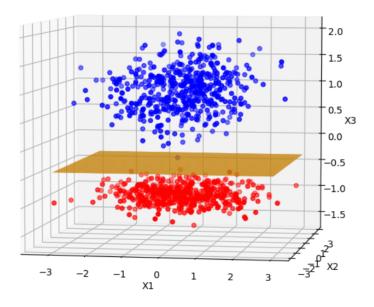
- Unit Vector = $-4.06021104e 04x_1 + 1.41373466e 04e 04x_2 9.99999908x_3$
- Threshold value = 0.3784587887994166
- Accuracy = 100 %, since there are no Misclassified points.

Plot of Discriminating Hyperplane

3D plot with Discrimination Hyperplane



3D plot with Discrimination Hyperplane



Major Limitations

- LDA technique is very useful for discriminating between different linearly separable classes. However, if the classes are non-linearly separable, LDA cannot find a lower dimensional space.
- For very high dimensional Classification tasks, with low number of training points, the model fails to give a good accuracy.