#### E9 205 Machine Learning for Signal Processing

**Dimensionality Reduction - II** 

30-08-2017

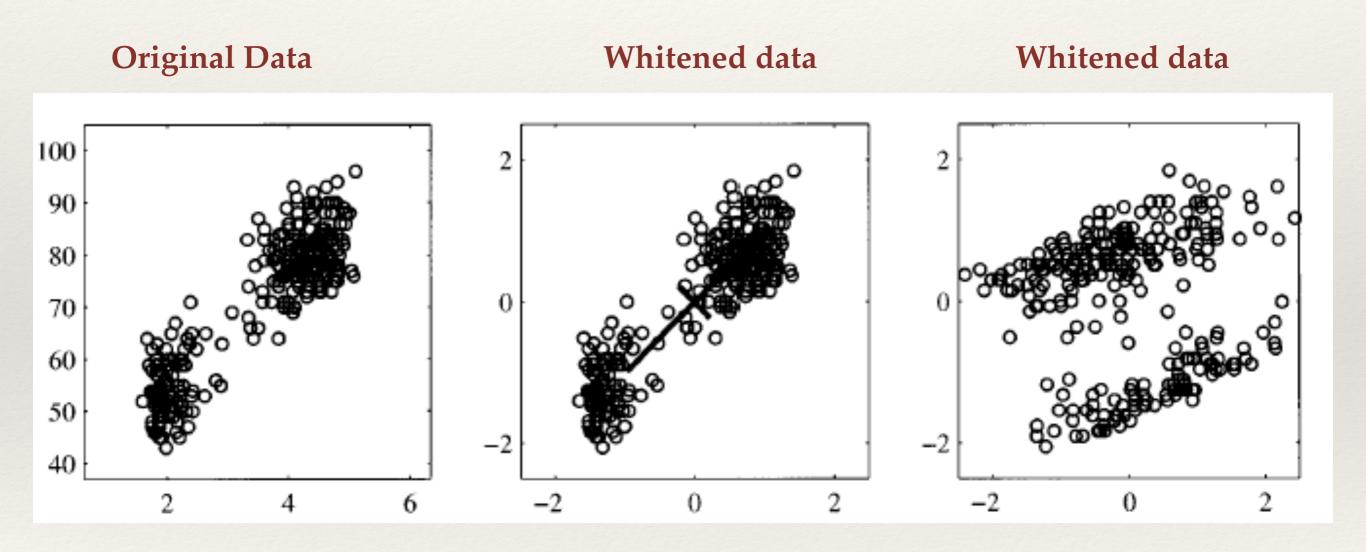
Instructor - Sriram Ganapathy (<a href="mailto:sriram@ee.iisc.ernet.in">sriram@ee.iisc.ernet.in</a>)

Teaching Assistant - Aravind Illa (aravindece77@gmail.com).



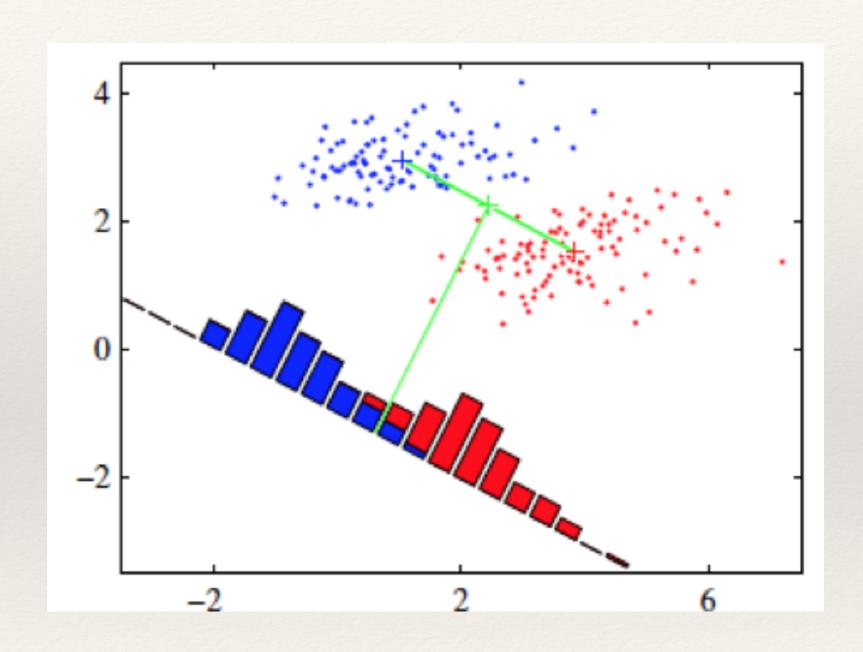


# Whitening the Data



PRML - C. Bishop (Sec. 12.1)

### With Only the Within Class Factor



### Linear Discriminant Analysis

Find a linear transform  $f(\mathbf{x}) = \mathbf{w}^T \mathbf{x}$  with a criterion which maximizes the class separation

 Maximize the between class distance in the projected space while minimizing the within class covariance

$$J = \frac{\mathbf{w}^T \mathbf{S}_b \mathbf{w}}{\mathbf{w}^T \mathbf{S}_w \mathbf{w}}$$

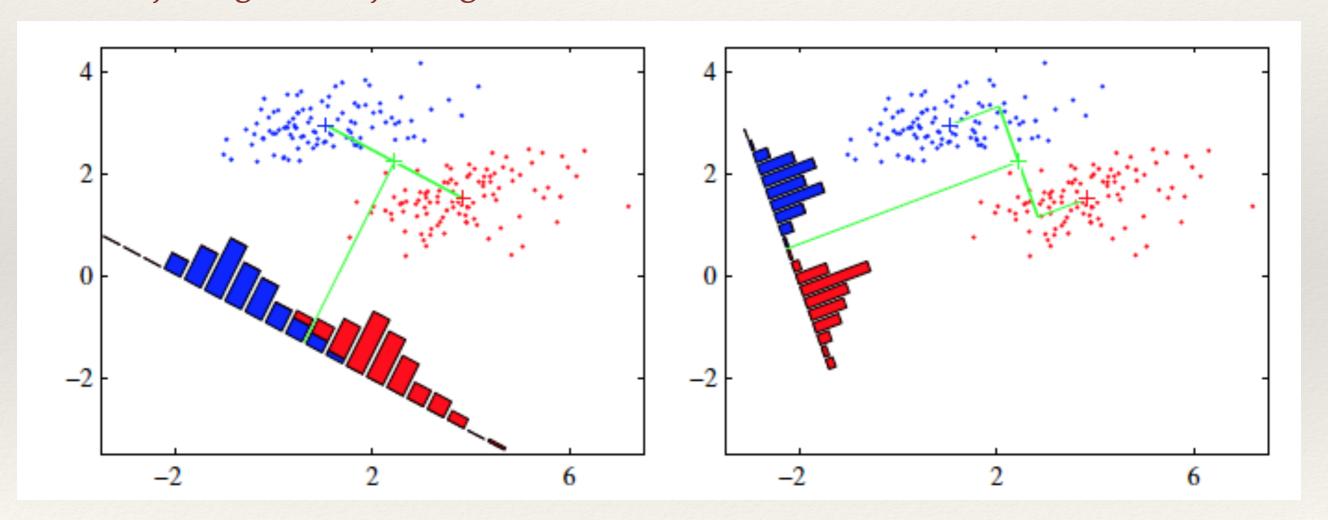
$$oldsymbol{S}_b = \sum_{k=1}^K N_k (\mathbf{m}_k - oldsymbol{m}) (\mathbf{m}_k - oldsymbol{m})^T \quad oldsymbol{S}_w = \sum_{k=1}^K \sum_{n \in C_k} (\mathbf{x}_n - oldsymbol{m}_k) (\mathbf{x}_n - oldsymbol{m}_k)^T$$

- \* Generalized Eigenvalue problem
- \* Eigenvectors of  $S_w^{-1}S_b$

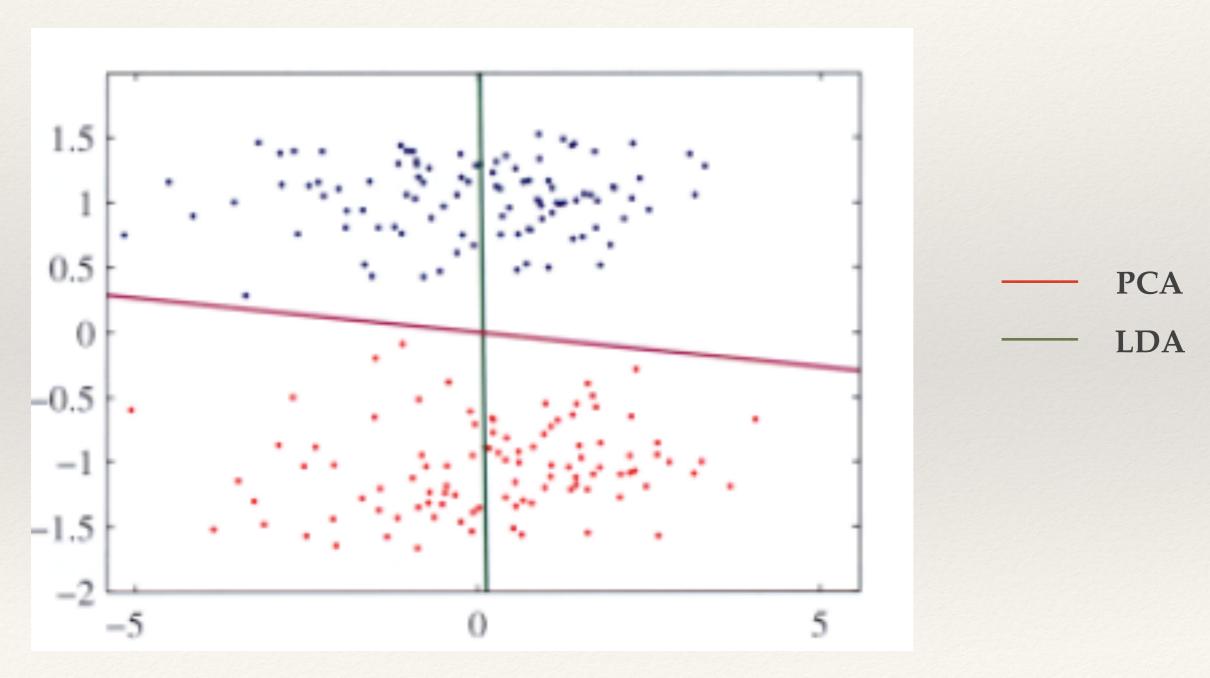
## Linear Discriminant Analysis

#### Projecting on line joining means

#### Fisher Discriminant



#### PCA versus LDA



PRML - C. Bishop (Sec. 4.1.4, Sec. 4.1.6)