Supervised Dimensionality Reduction

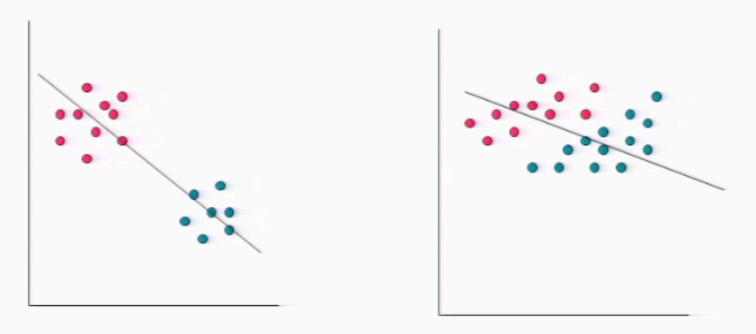
Supervised Dimensionality Reduction

- Neural nets: learn hidden layer representation, designed to optimize network prediction accuracy
- PCA: unsupervised, minimize reconstruction error
 - but sometimes people use PCA to re-represent original data before classification (to reduce dimension, to reduce overfitting)
- Fisher Linear Discriminant
 - like PCA, learns a linear projection of the data
 - but supervised: it uses labels to choose projection

Fisher Linear Discriminant

 A method for projecting data into lower dimension to hopefully improve classification

We'll consider 2-class case



Project data onto vector that connects class means?

Fisher Linear Discriminant



Project data onto one dimension, to help classification

$$y = \mathbf{w}^T \mathbf{x}$$

Define class means:
$$\mathbf{m}_i = \frac{1}{N_i} \sum_{n \in C_i} \mathbf{x}^n$$

Could choose w according to: $\arg\max_{\mathbf{w}}\mathbf{w}^T(\mathbf{m_2}-\mathbf{m_1})$

Instead, Fisher Linear Discriminant chooses: $\arg\max_{\mathbf{w}} \frac{(m_2-m_1)^2}{s_1^2+s_2^2}$

$$m_i \equiv \mathbf{w}^T \mathbf{m}_i$$
 $s_i^2 \equiv \sum_{n \in C_i} (x^n - m_i)^2$