



Institut et hôpital neurologiques de Montréal  
Montreal Neurological Institute and Hospital

# Machine Learning

# Machine Learning

- Automatically find patterns in data
- Create useful representations
- Supervised vs. unsupervised

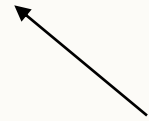
# Regression

Linear regression:

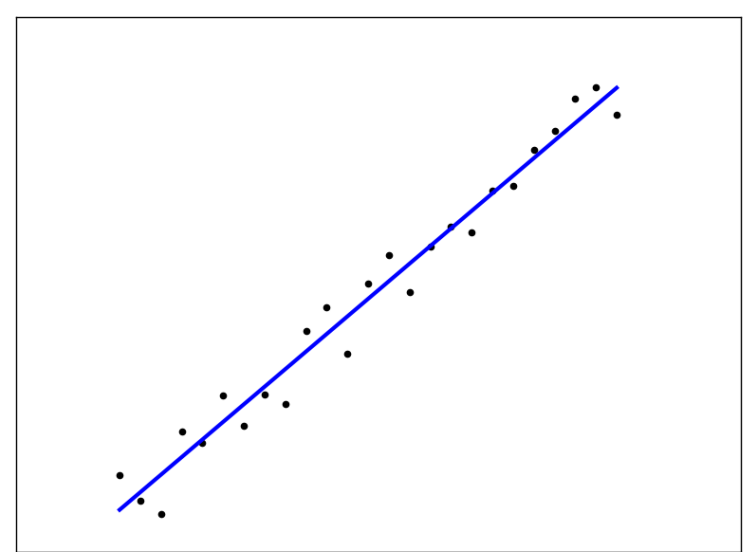
$$y = ax + b$$



output

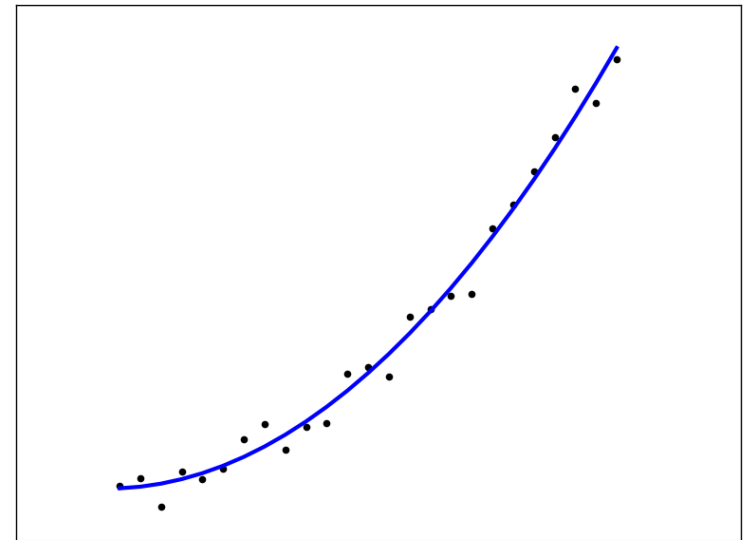


input data



Polynomial regression:

$$y = ax^2 + bx + c$$

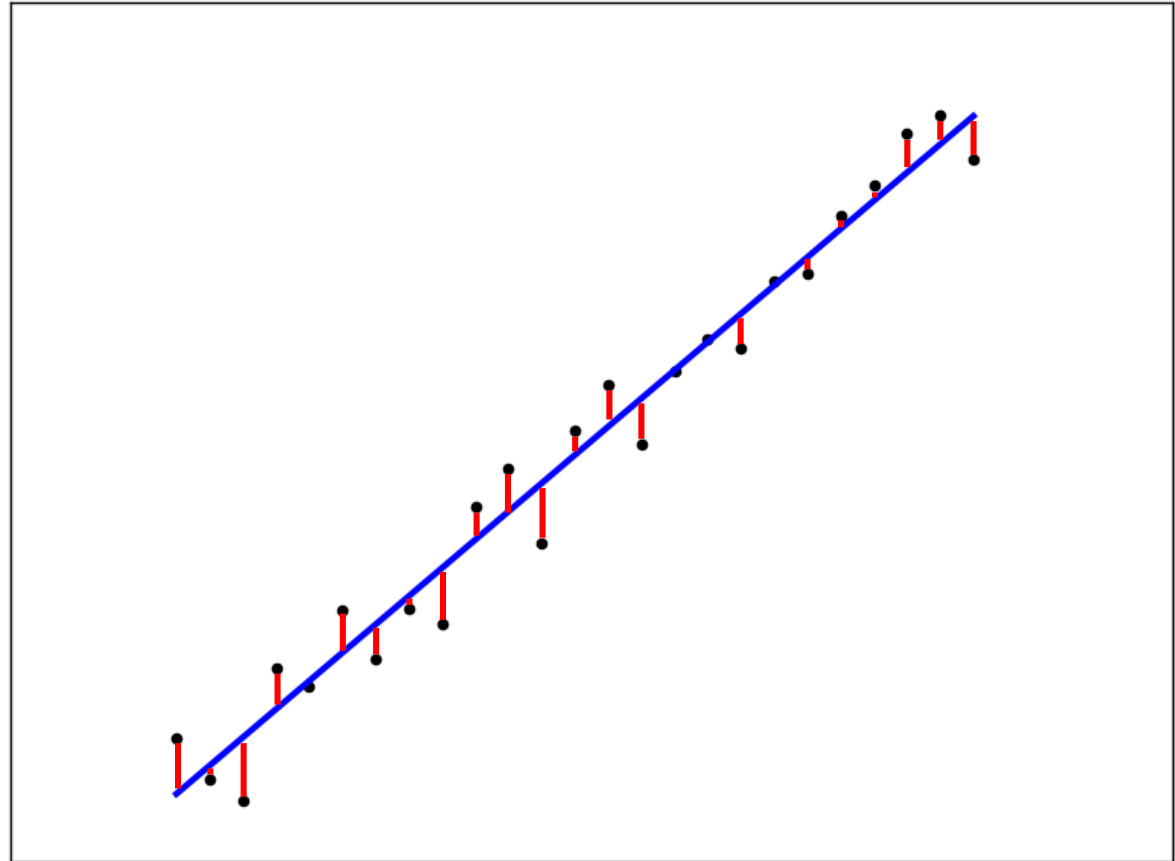


# Regression

Mean Squared Error

$$\frac{1}{N} \sum (y - (ax + b))^2$$

- +/- error same effect
- Penalizes very wrong predictions

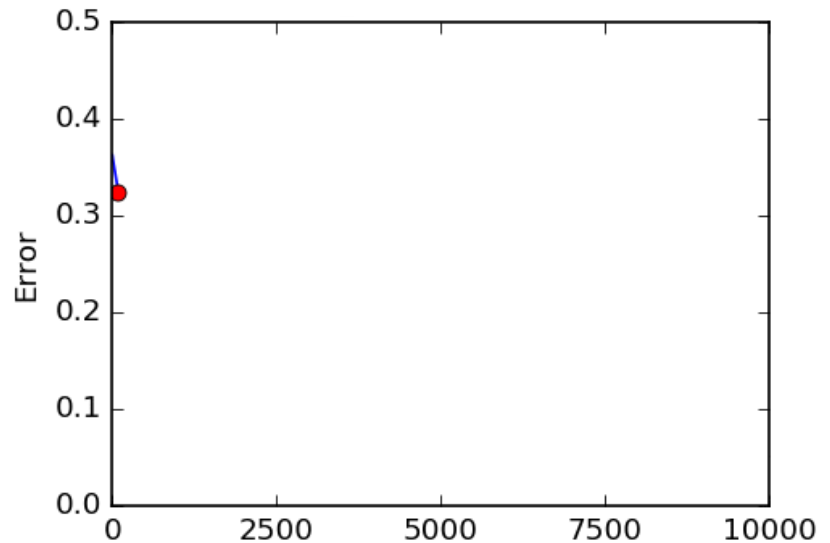
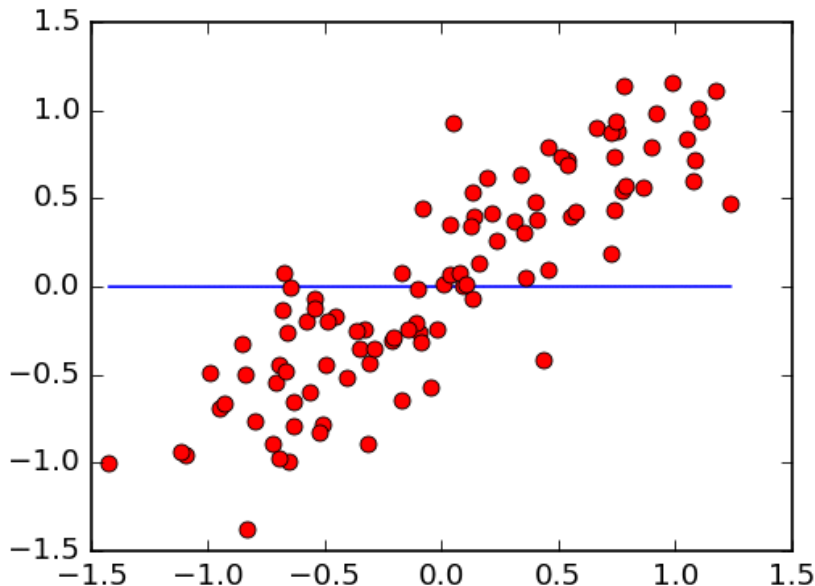


# Gradient Descent

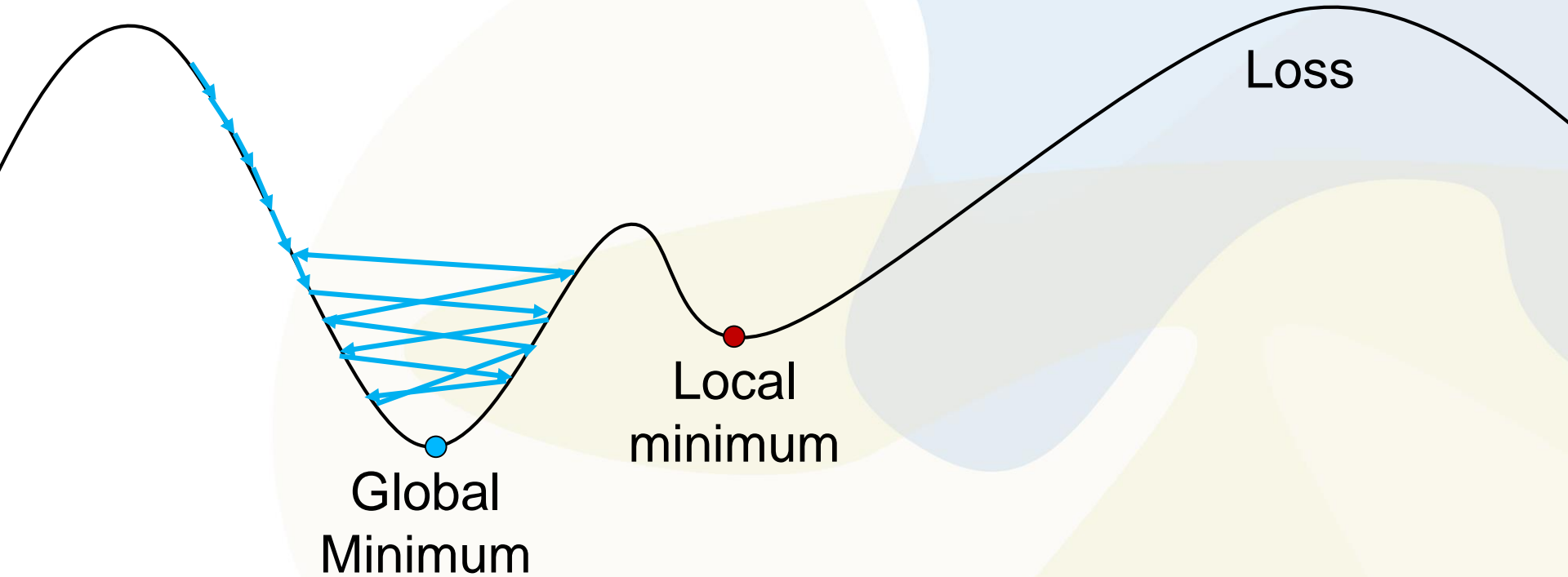
Initialize parameters ( $a$ ,  $b$ ) randomly

Iterate between:

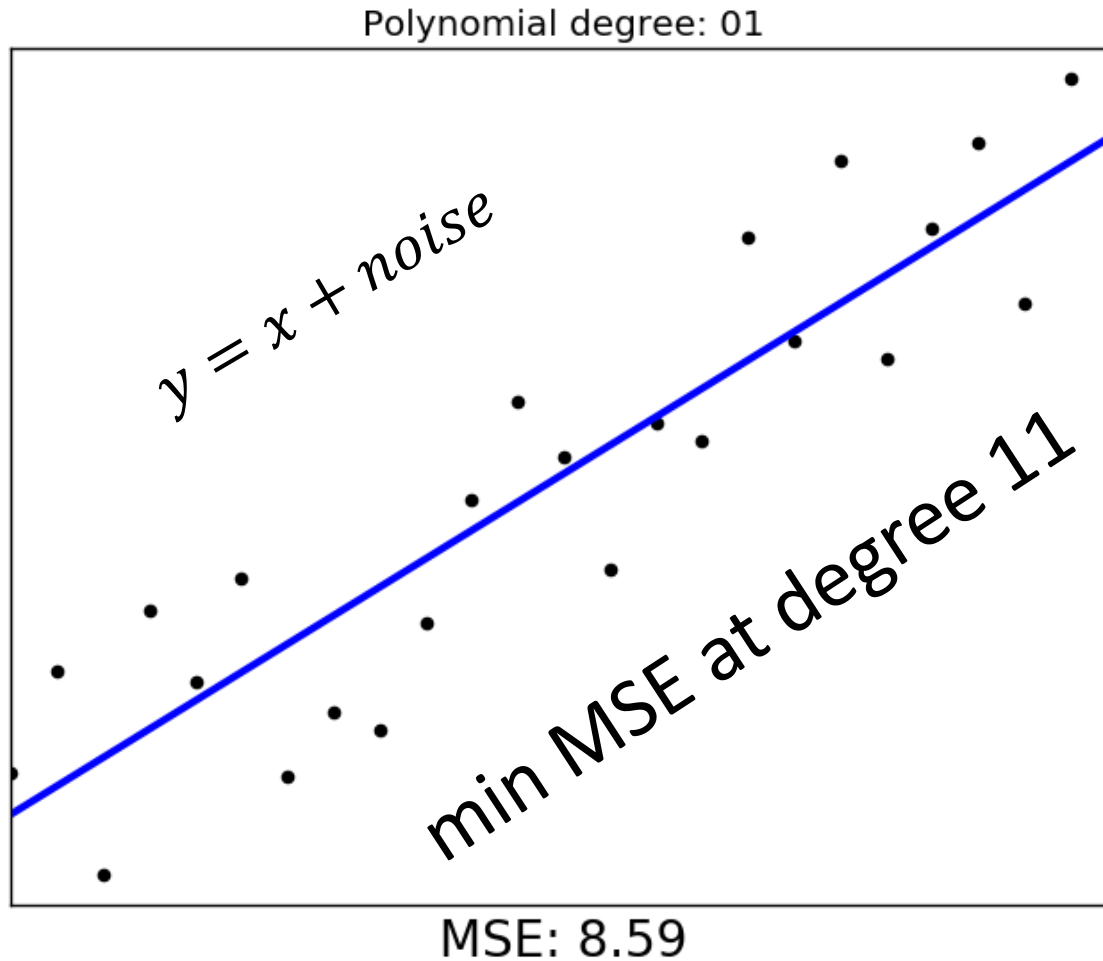
1. Computing **loss** (mean squared error)
2. Updating parameters in direction of **gradient**



# Gradient Descent



# Regression

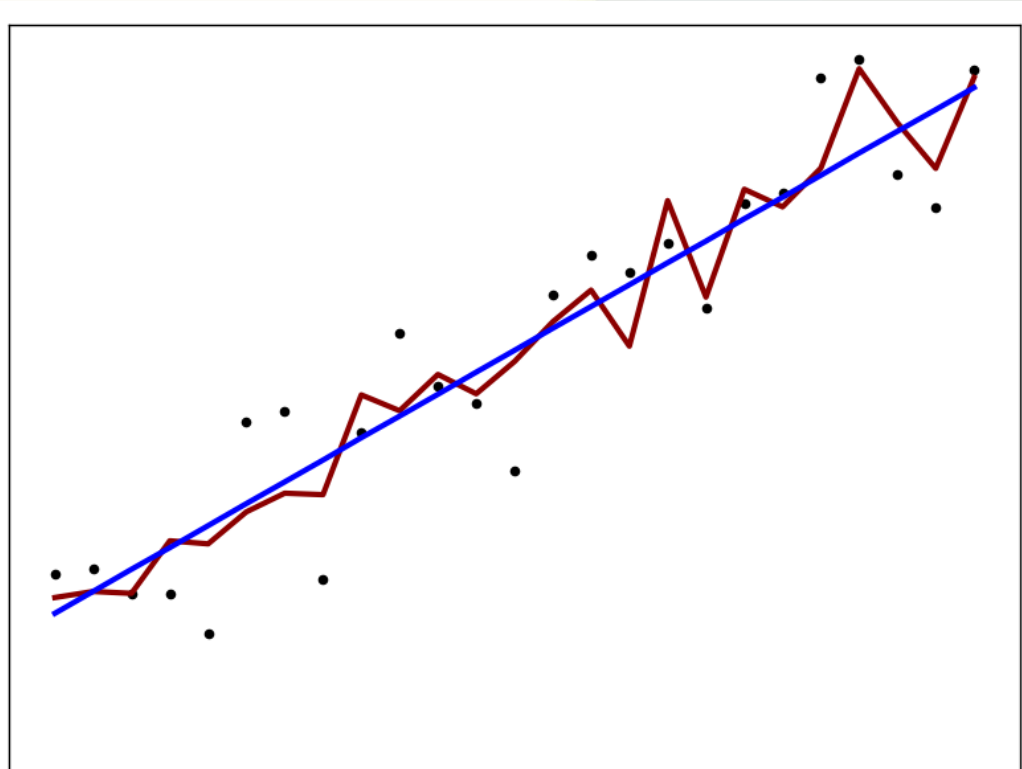


# Regularization

## Lasso

Linear regression:

$$y = ax_1 + \cancel{bx_2} + \cancel{cx_3} + \cancel{dx_4} + \cancel{ex_5} + \cancel{fx_6} + g$$



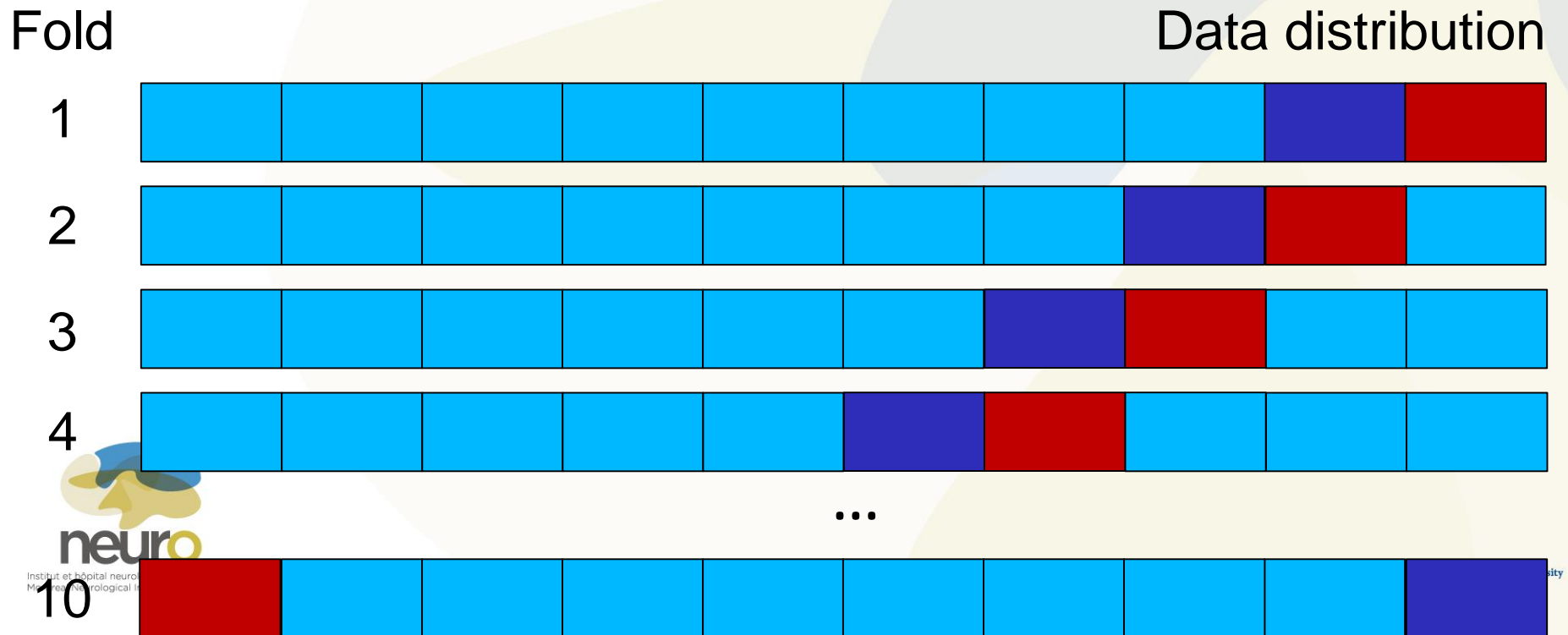


# Regularization

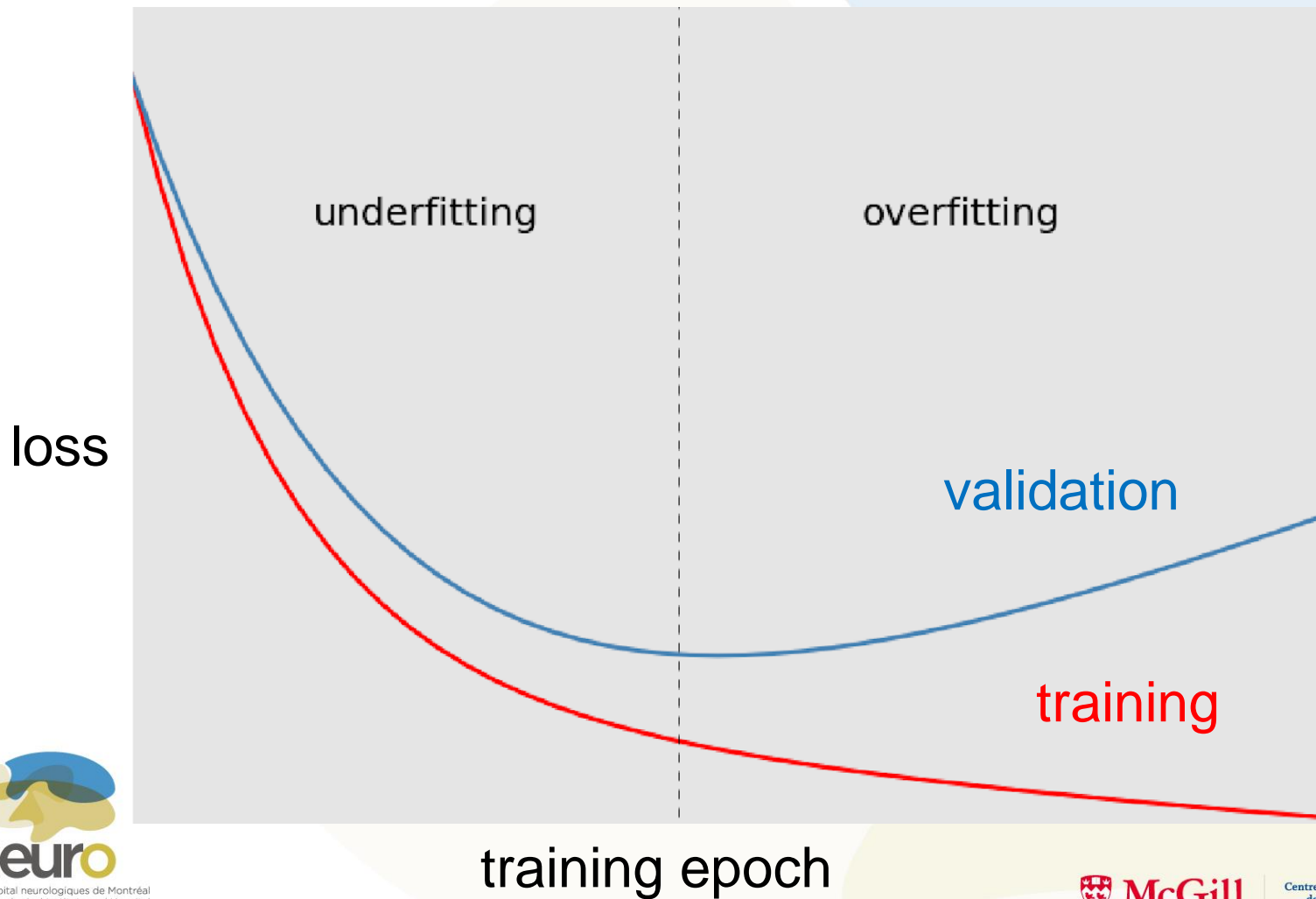
- Constrain parameters:
  - To be sparse (L1/Lasso)
  - To be small (L2/ridge)
- For neural networks, stop training early

# Cross-Validation

- Train model parameters on **training** set
- Choose hyper-parameters with **validation** set
- Report error on **test** set

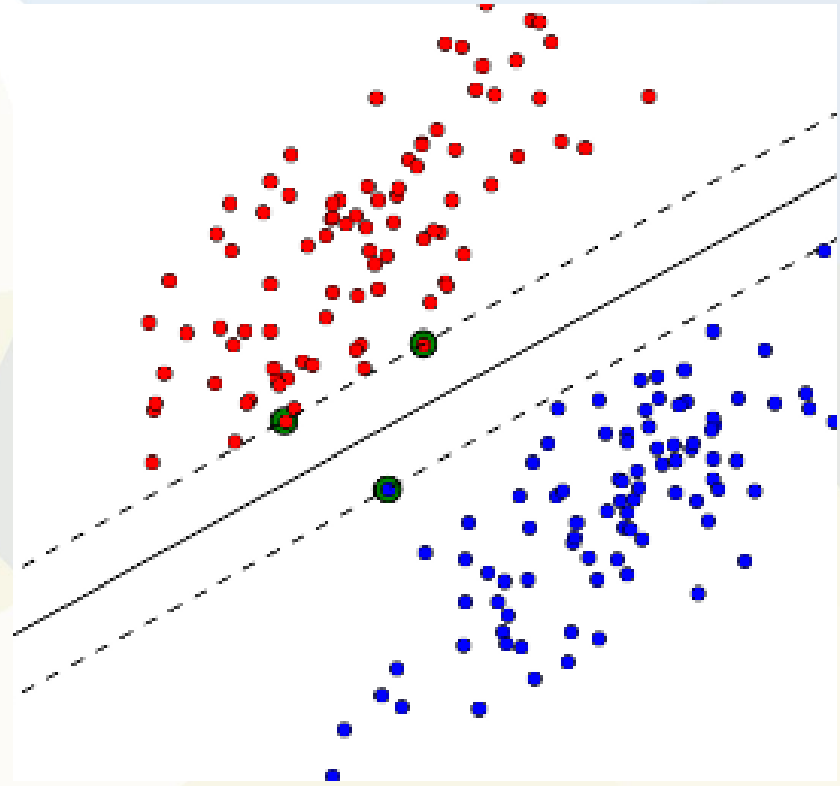


# Overfitting



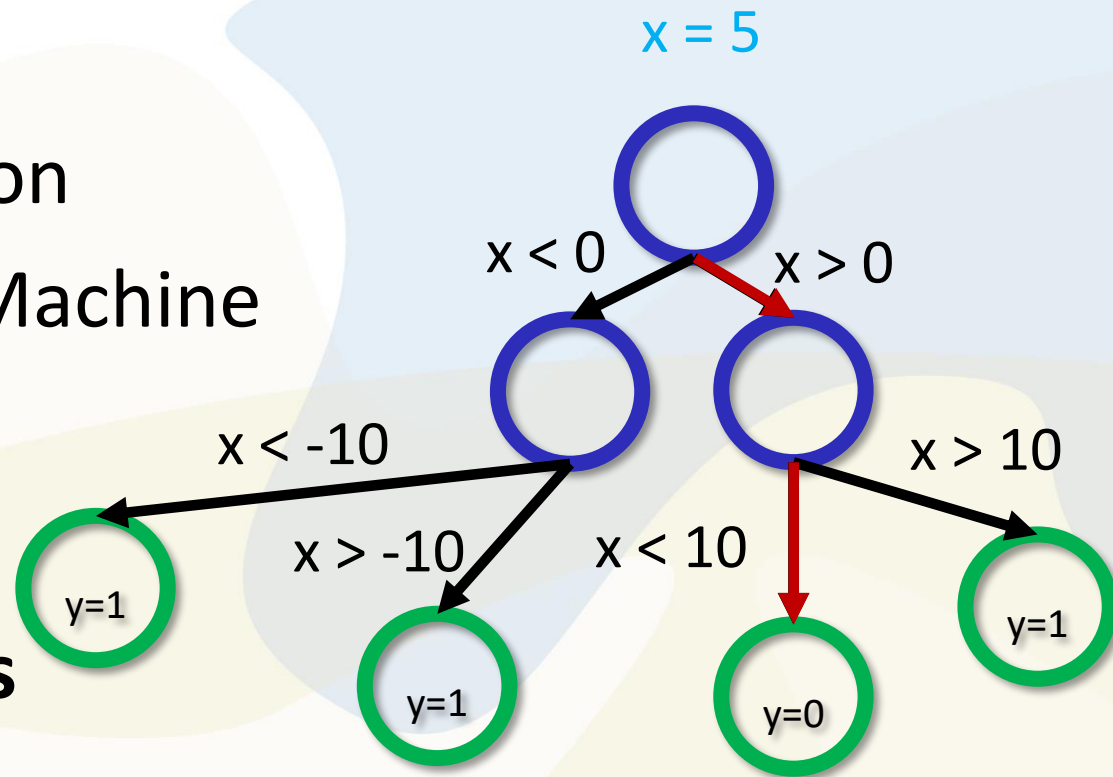
# Classification

- Logistic Regression
- Support Vector Machine



# Classification

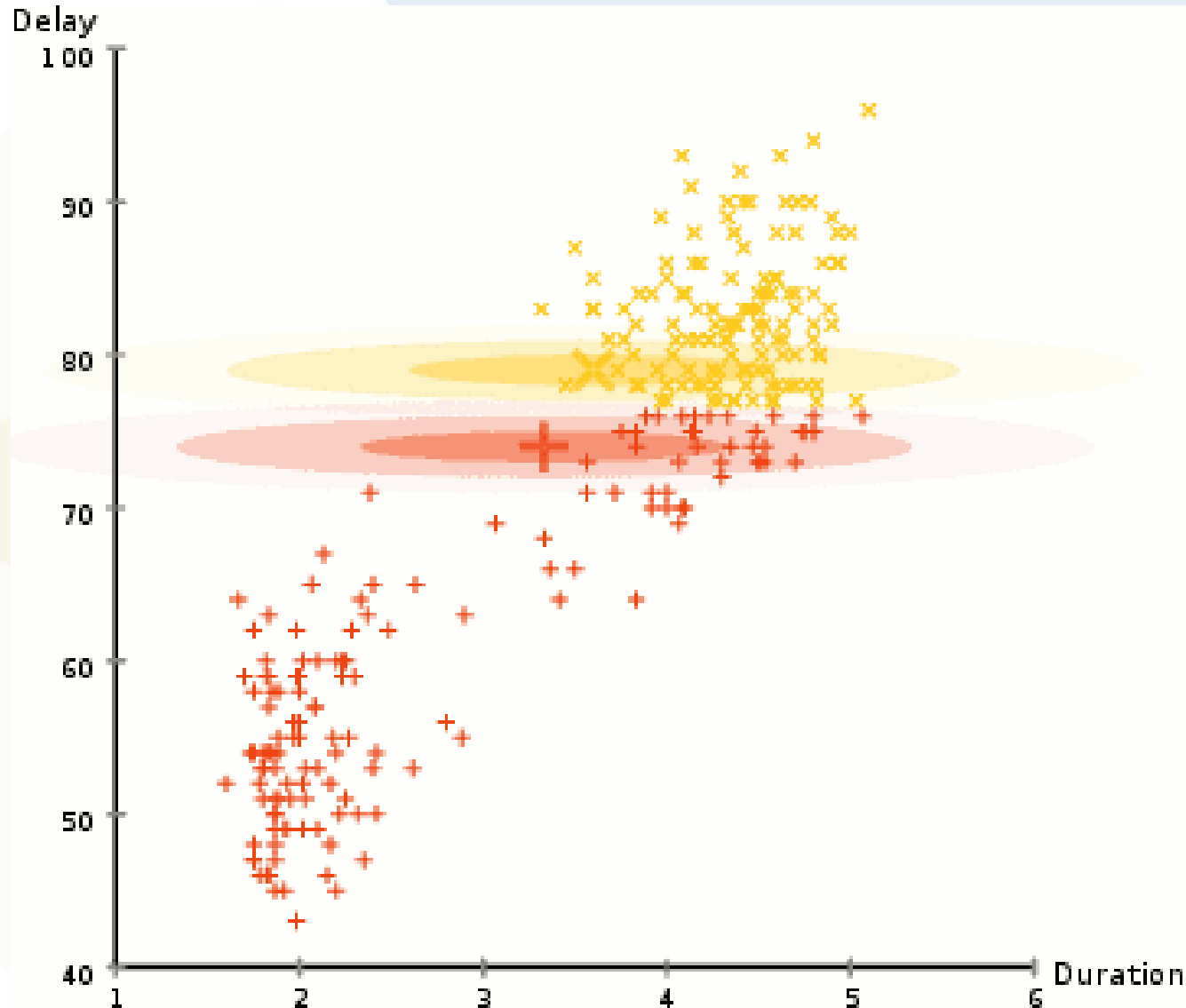
- Logistic Regression
- Support Vector Machine
- Decision Trees
- Random Forests
- **Neural Networks**



# Unsupervised Learning

## Clustering:

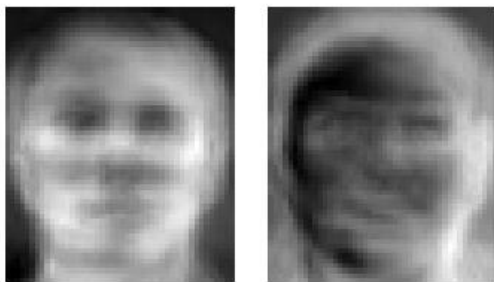
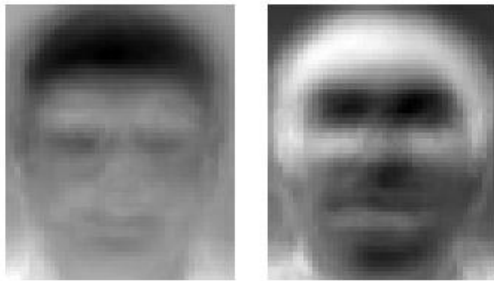
- K-means
- Mixture of Gaussians



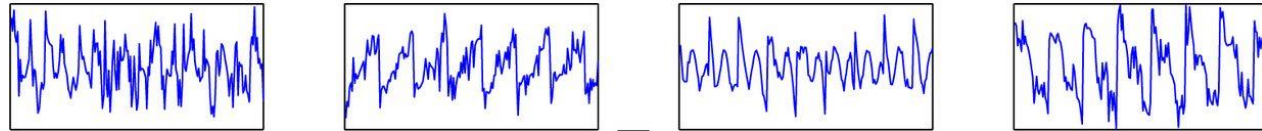
# Unsupervised Learning

## Dimensionality Reduction:

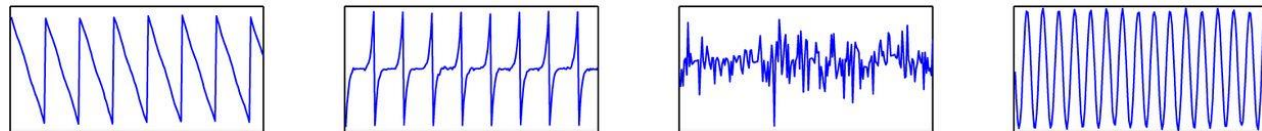
- Principal Component Analysis
- Independent Component Analysis



(a) measured signals



(b) signals separated by ICA



Hyvärinen, Aapo. "Independent component analysis: recent advances." *Phil. Trans. R. Soc. A* 371.1984 (2013): 20110534.