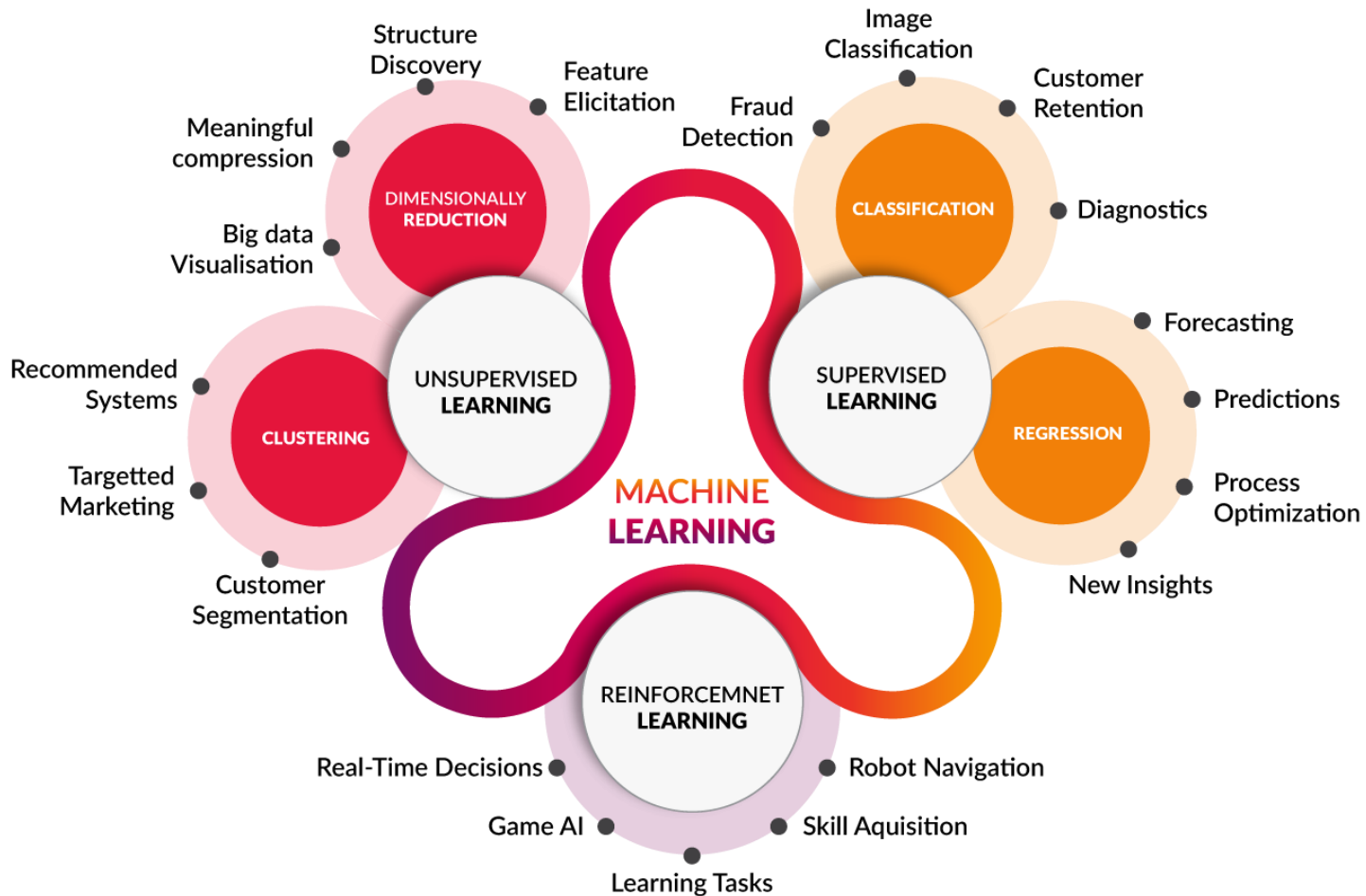


Tutorial on Deep Learning

CS - 590.21 Analysis and Modeling of Brain Networks

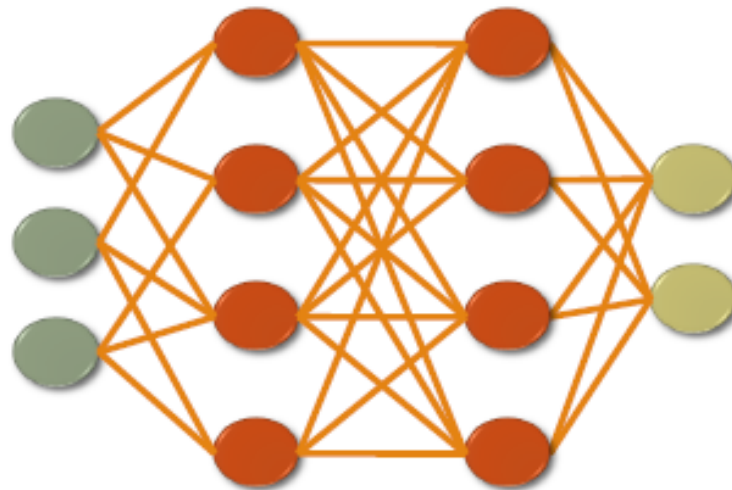
Evripidis Tzamos

Types of Machine Learning



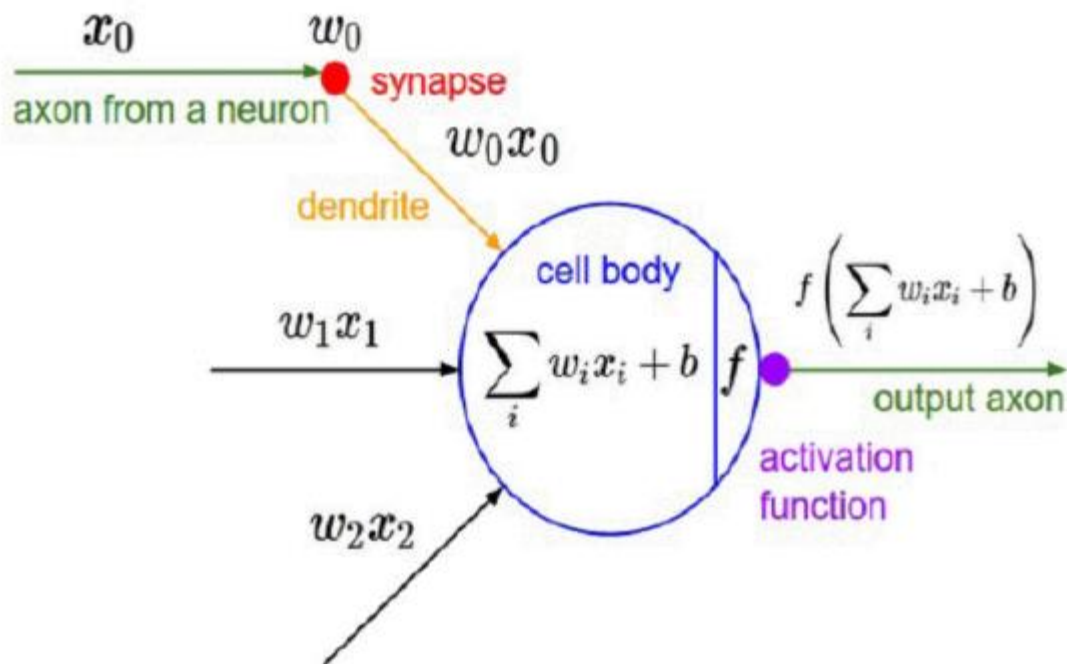
Artificial Neural Networks (ANN)

- Architecture (input/hidden/output layers)



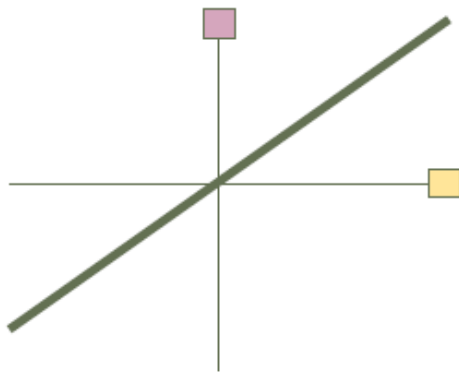
Artificial Neural Networks (ANN)

- Architecture (input/hidden/output layers)
- Weights

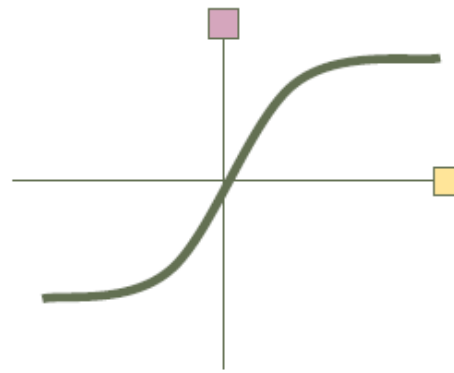


Artificial Neural Networks (ANN)

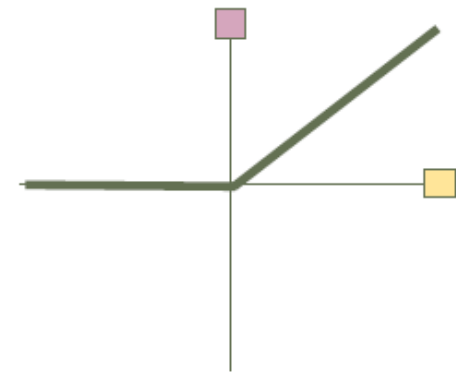
- Architecture (input/hidden/output layers)
- Weights
- Activation functions



LINEAR

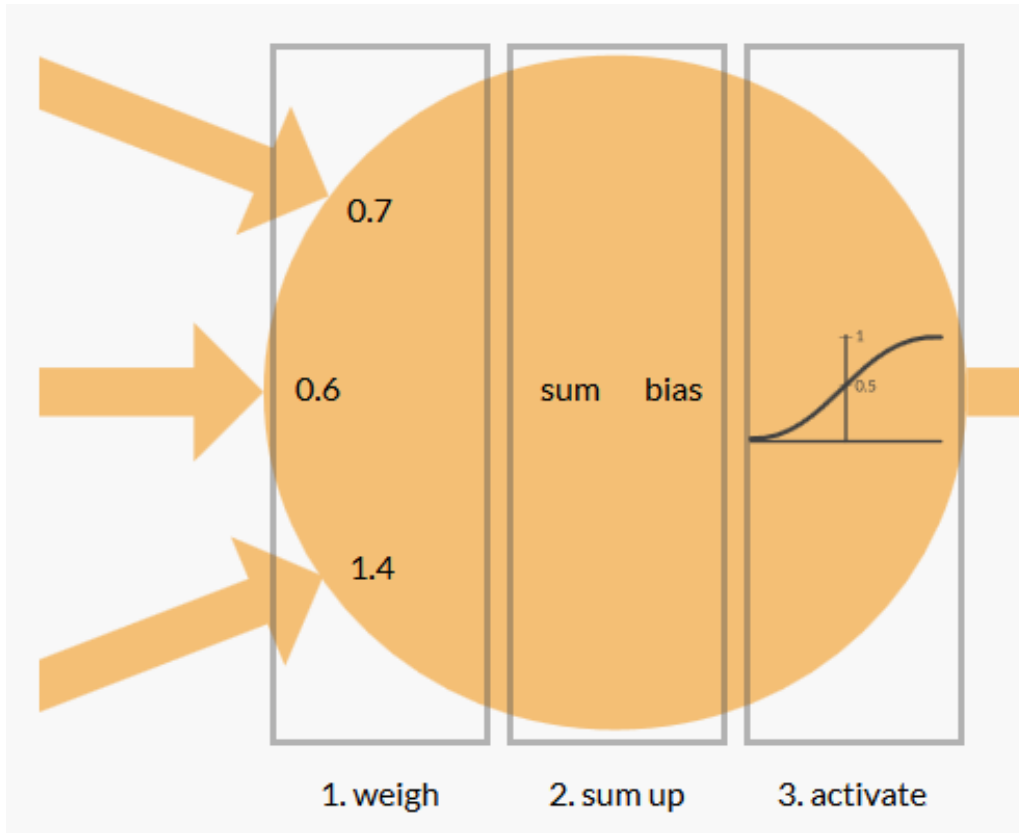


**LOGISTIC /
SIGMOIDAL / TANH**



**RECTIFIED
LINEAR (ReLU)**

Inside an artificial neuron



Activation of the j -th neuron
in the l -th layer

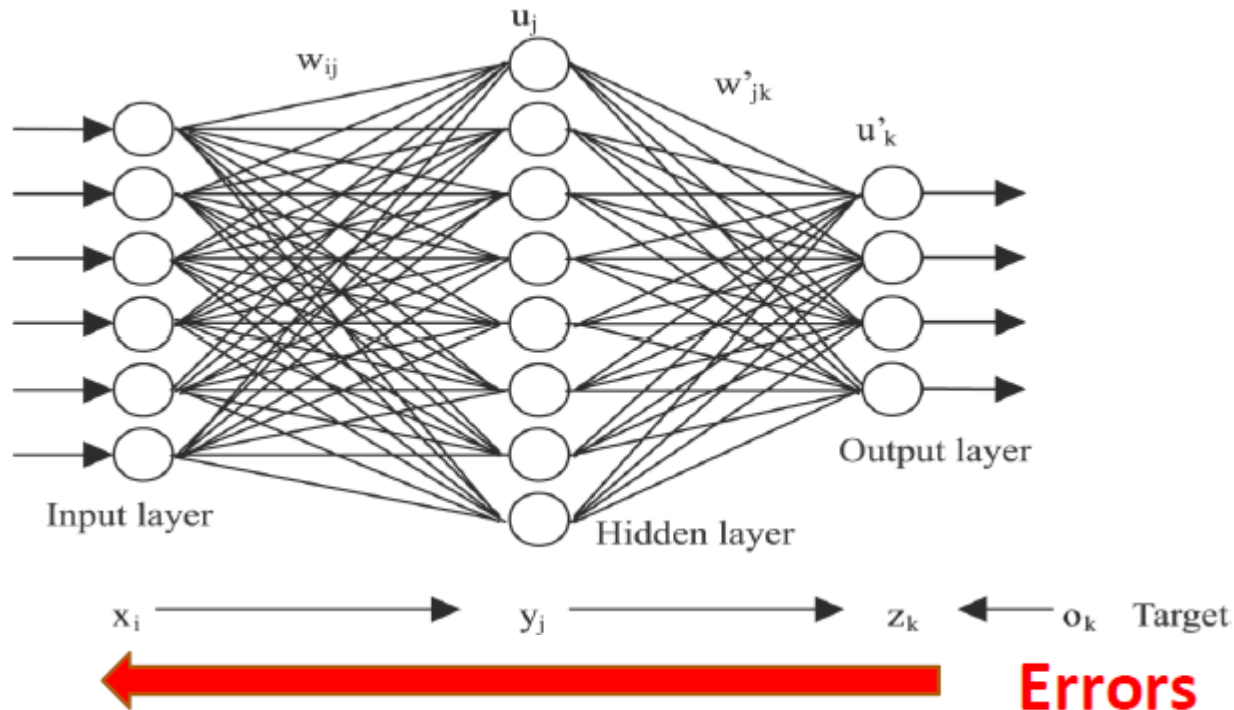
$$a_j^l = \sigma \left(\sum_k w_{jk}^l a_k^{l-1} + b_j^l \right)$$

w_{jk}^l weight from the k -th neuron
in the $(l-1)$ -th layer to the j -th
neuron in the l -th layer

b_j^l weight from the k -th neuron
in the $(l-1)$ -th layer to the j -th
neuron in the l -th layer

Training an ANN

1. Get data
2. Forward through the network \rightarrow compute error
3. **Backpropagate** error
4. Update weights based on gradient



Backpropagation

Define a loss/cost function

$$J(x, y; \theta) = \frac{1}{2} \sum (y - f(x; \theta))^2$$

$$f(x; \theta) = w^T x + b \quad , \quad \theta = \{w, b\}$$

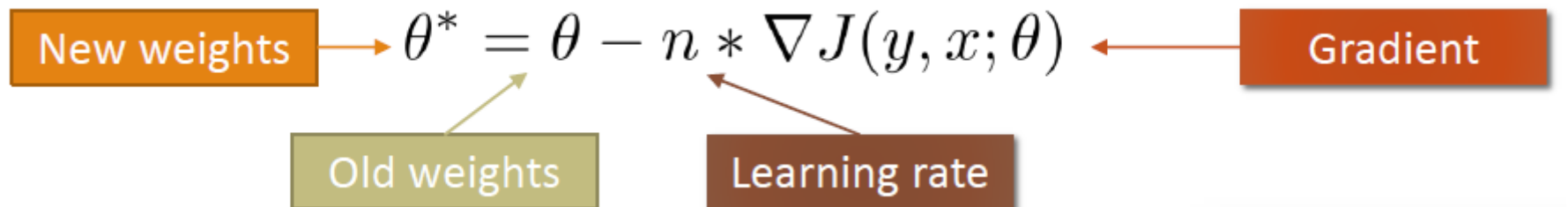
Backpropagation

Define a loss/cost function

$$J(x, y; \theta) = \frac{1}{2} \sum (y - f(x; \theta))^2$$

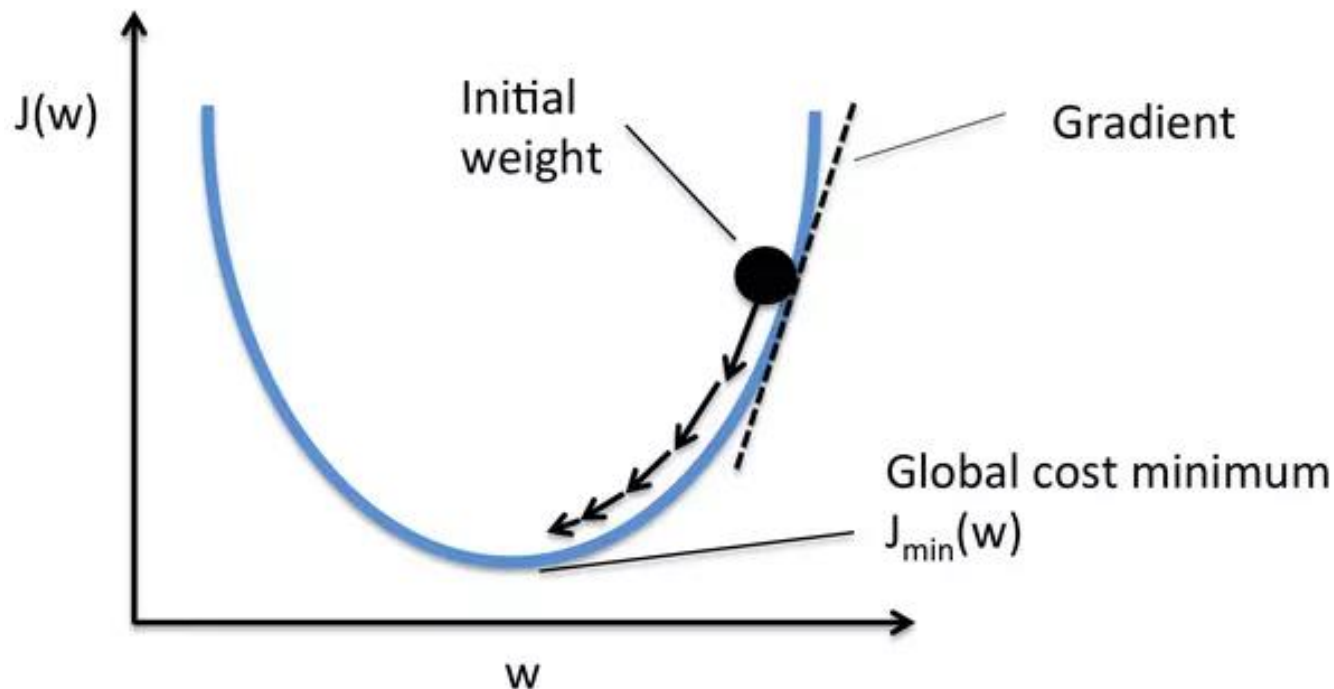
$$f(x; \theta) = w^T x + b \quad , \quad \theta = \{w, b\}$$

Minimize cost function w.r.t. parameters θ



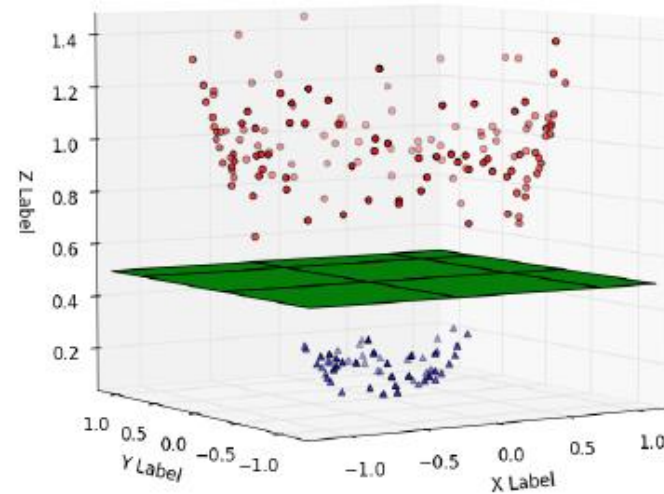
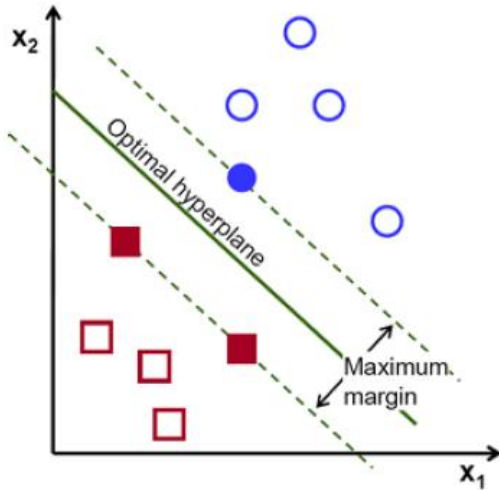
Gradient descent

Gradient: $\nabla J(x) = \left(\frac{\partial J(x)}{\partial x_1}, \frac{\partial J(x)}{\partial x_2}, \dots, \frac{\partial J(x)}{\partial x_n} \right)$

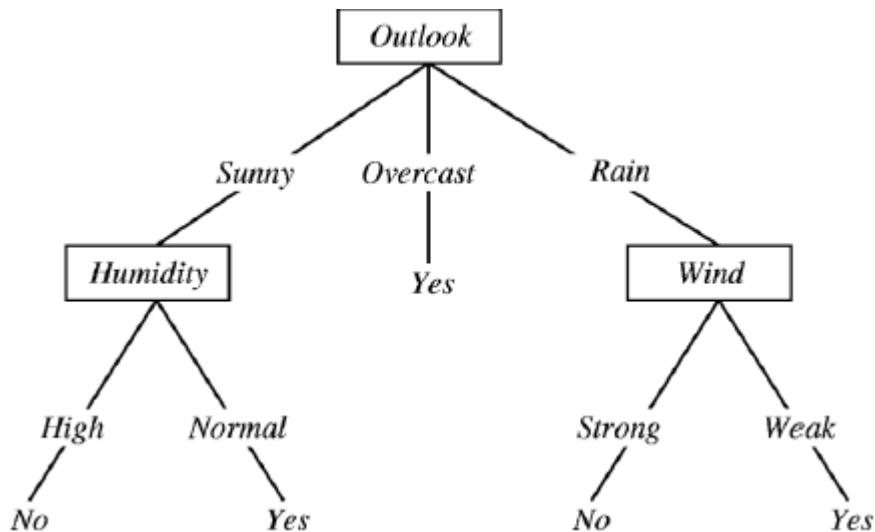


Before Deep Learning

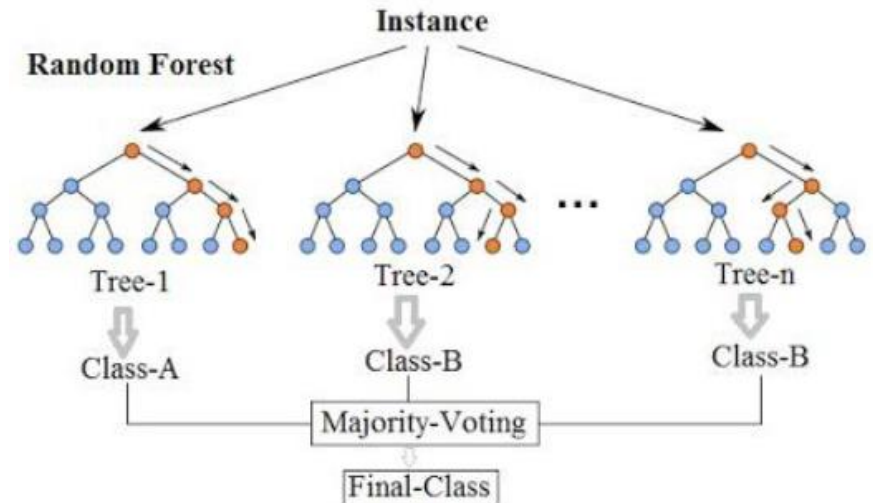
Support Vector Machines



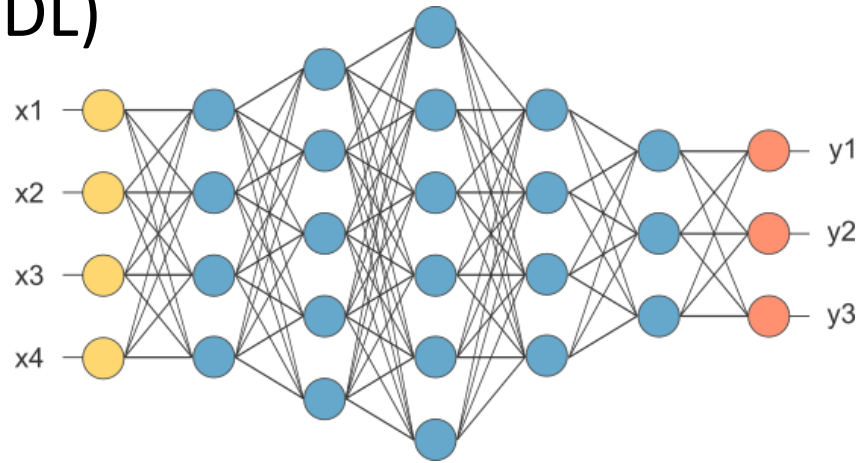
Decision Tree



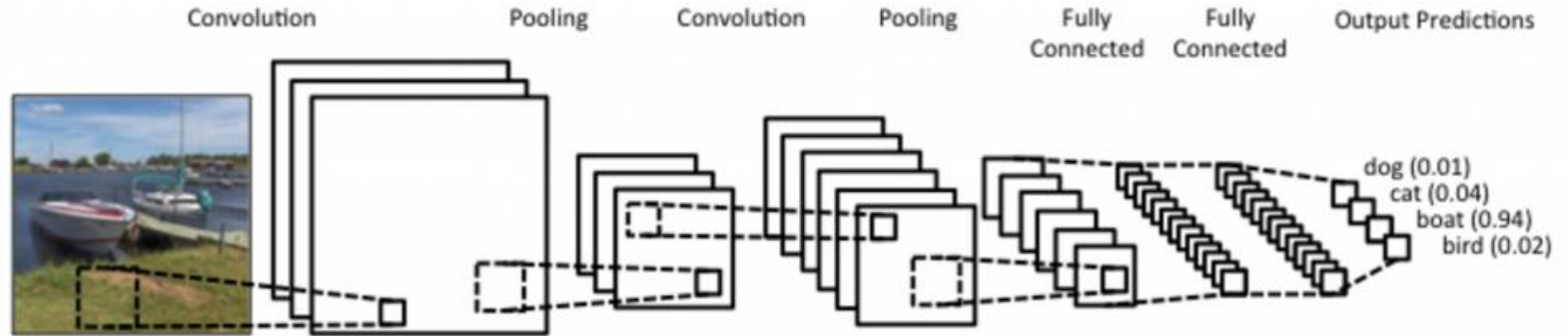
Random Forest Simplified



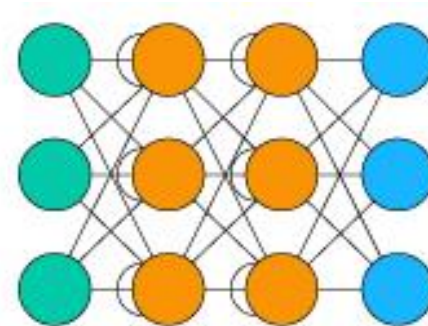
Deep learning (DL)



Convolutional Neural Networks (CNN)



Recurrent Neural Networks (RNN)



Matlab examples