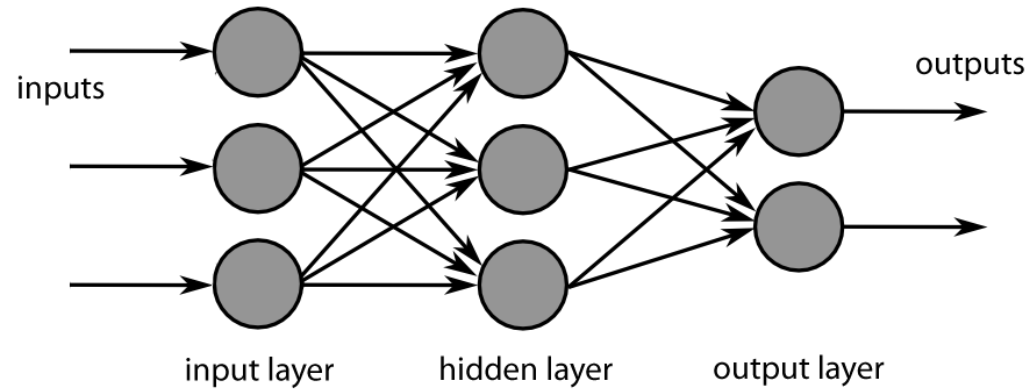
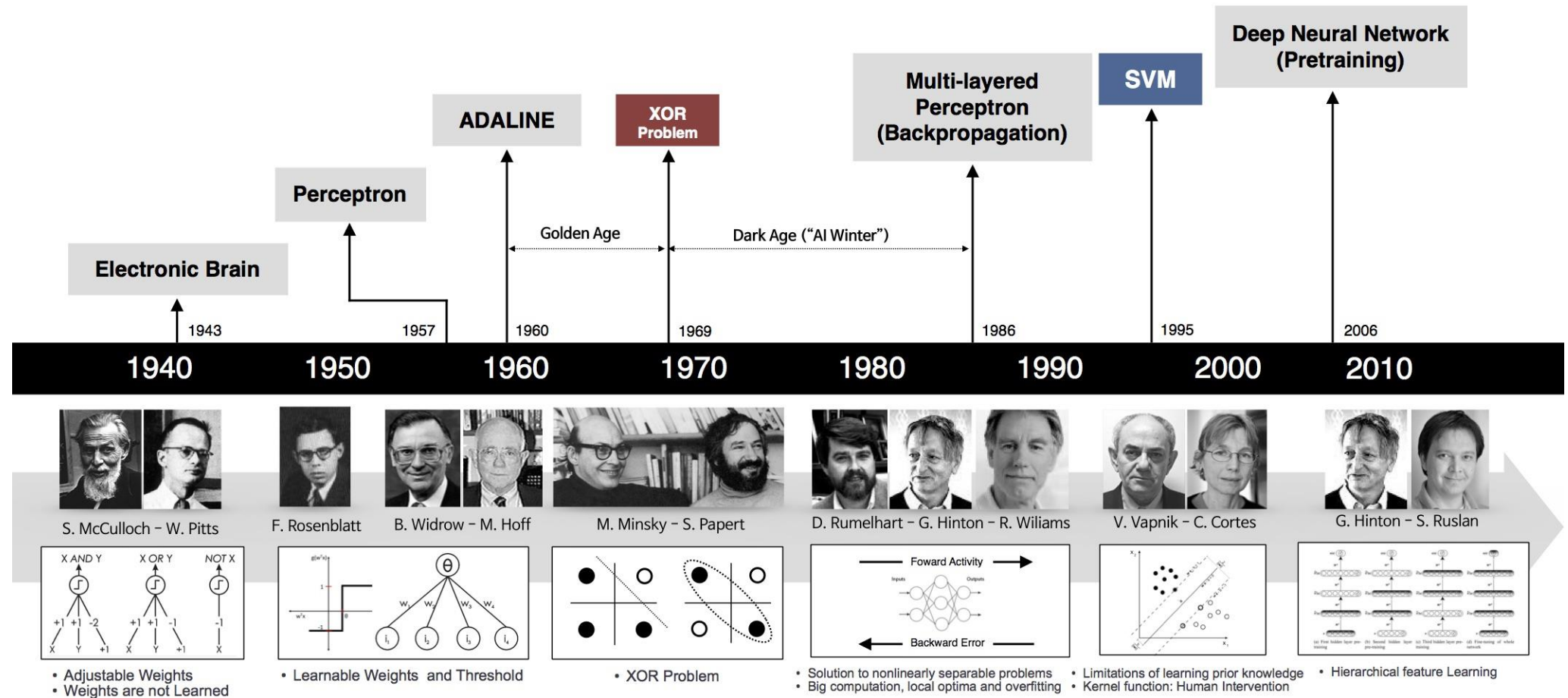


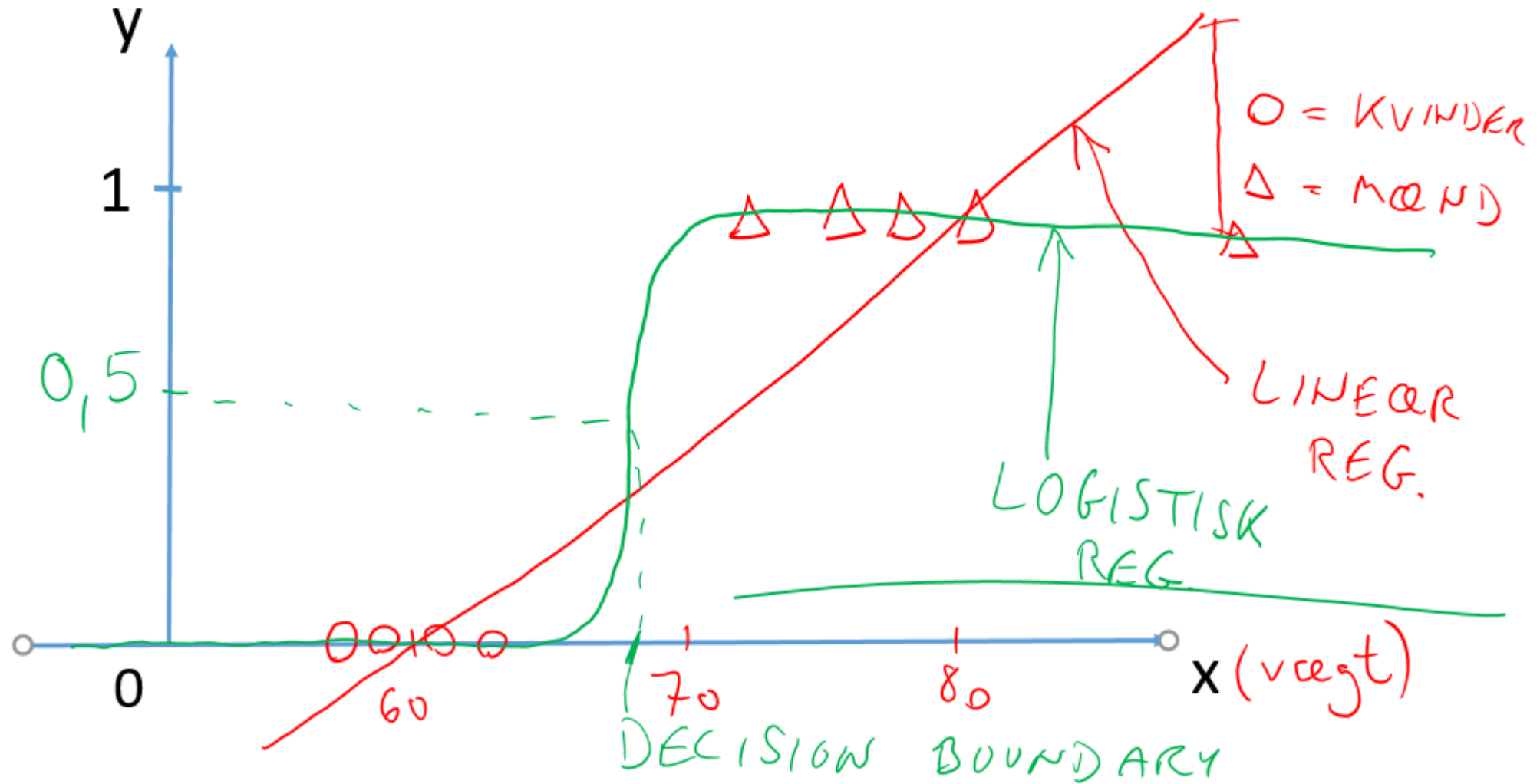
# Artificial Neural Networks



# Historien..



# Logistisk regression - recap



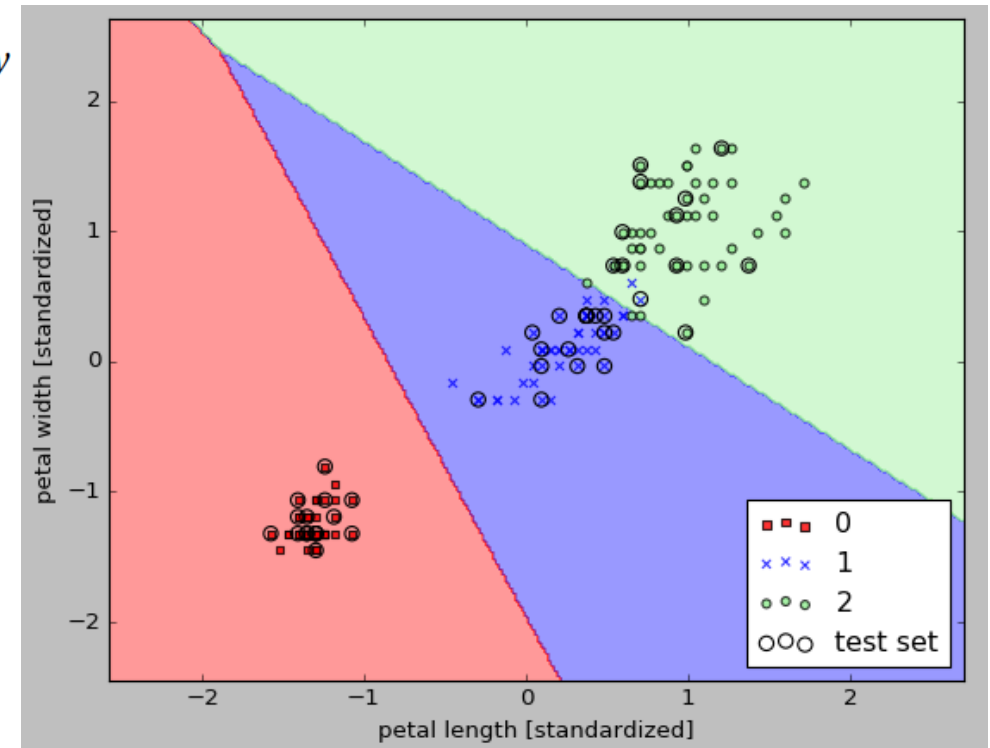
# Logistisk regression - recap

*Equation 4-13. Logistic Regression model estimated probability*

$$\hat{p} = h_{\theta}(\mathbf{x}) = \sigma(\mathbf{x}^T \boldsymbol{\theta})$$

*Equation 4-14. Logistic function*

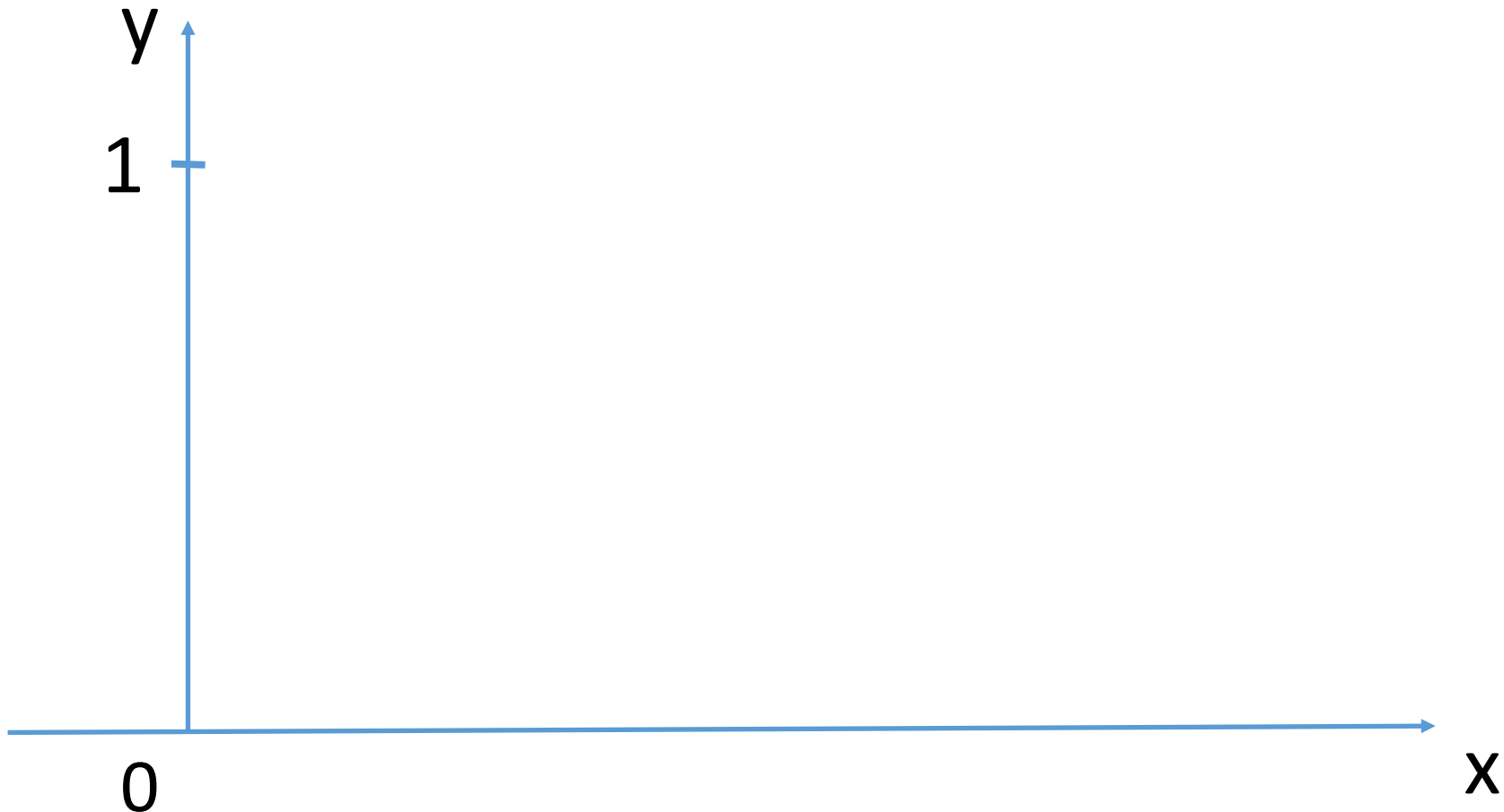
$$\sigma(t) = \frac{1}{1 + \exp(-t)}$$



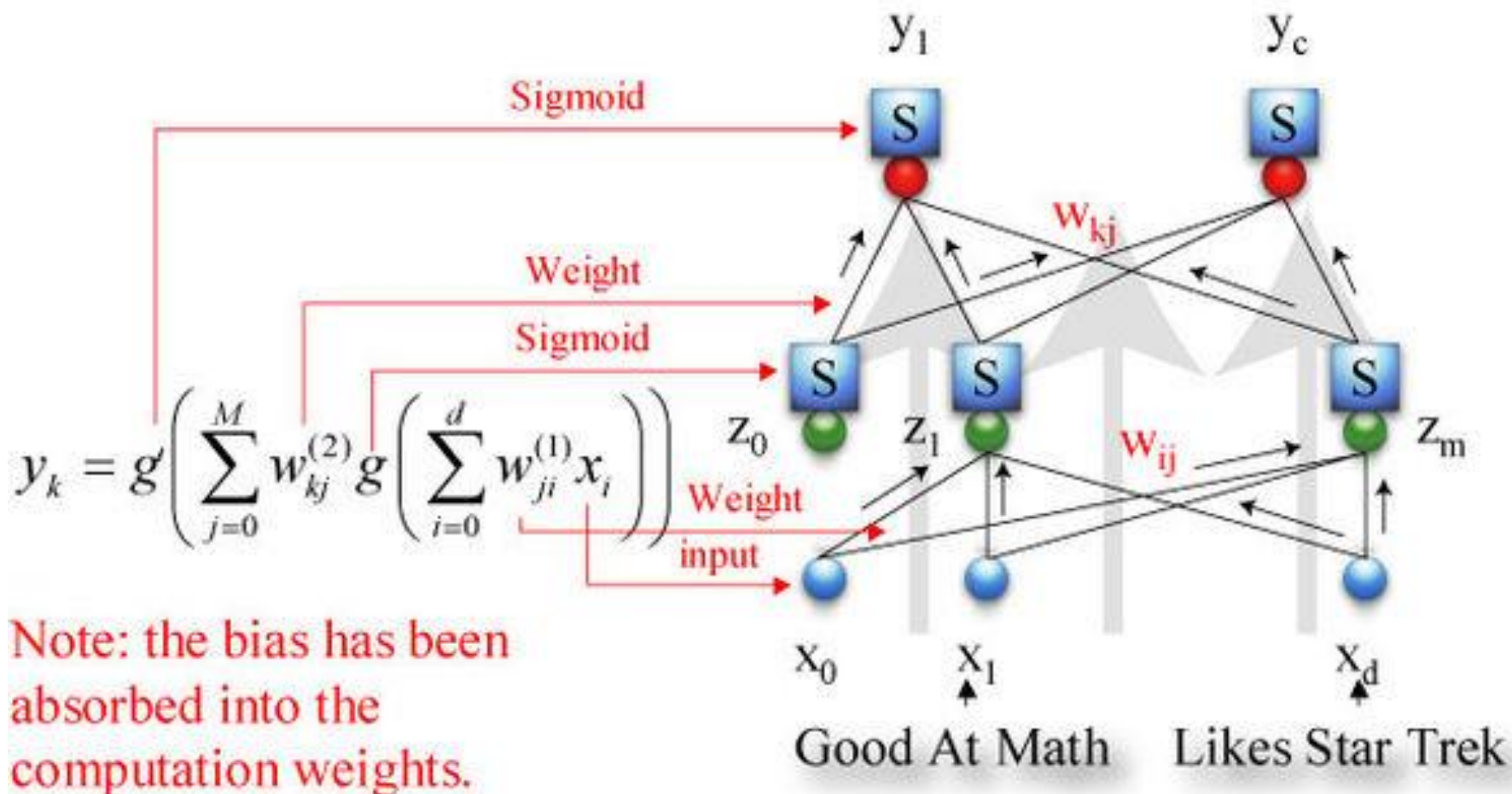
**Lineær classifier**

# Multi-layer perceptron ("alm." neural netværk)

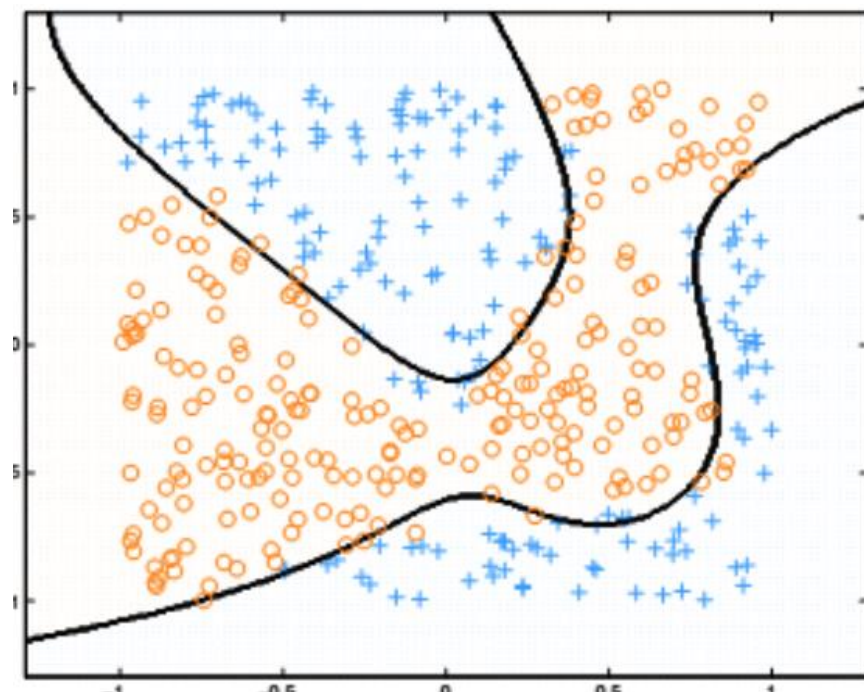
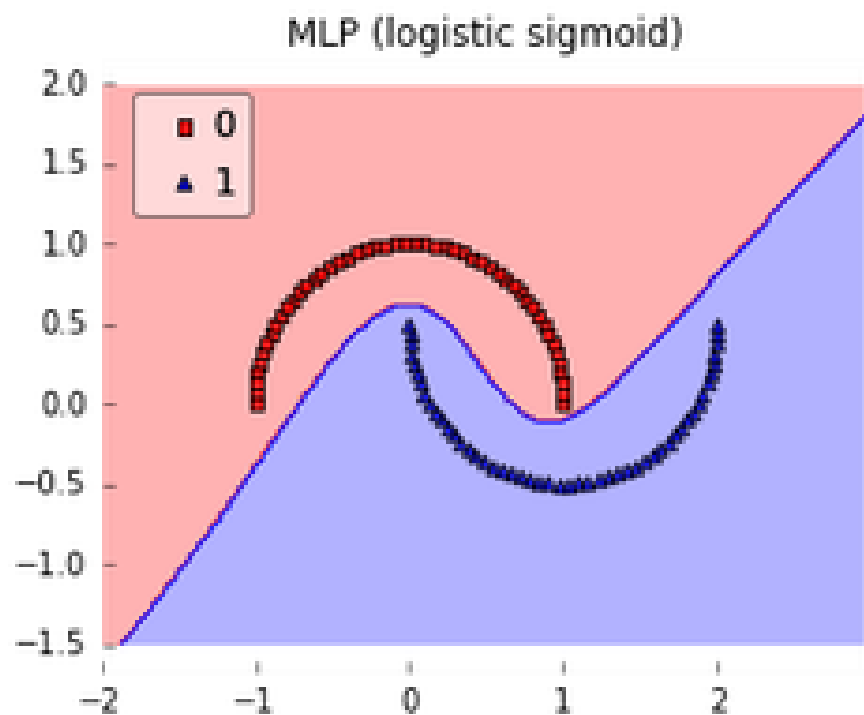
- Ide : Sum af fx. logistic function  $\rightarrow$  mere fleksibel decision boundary



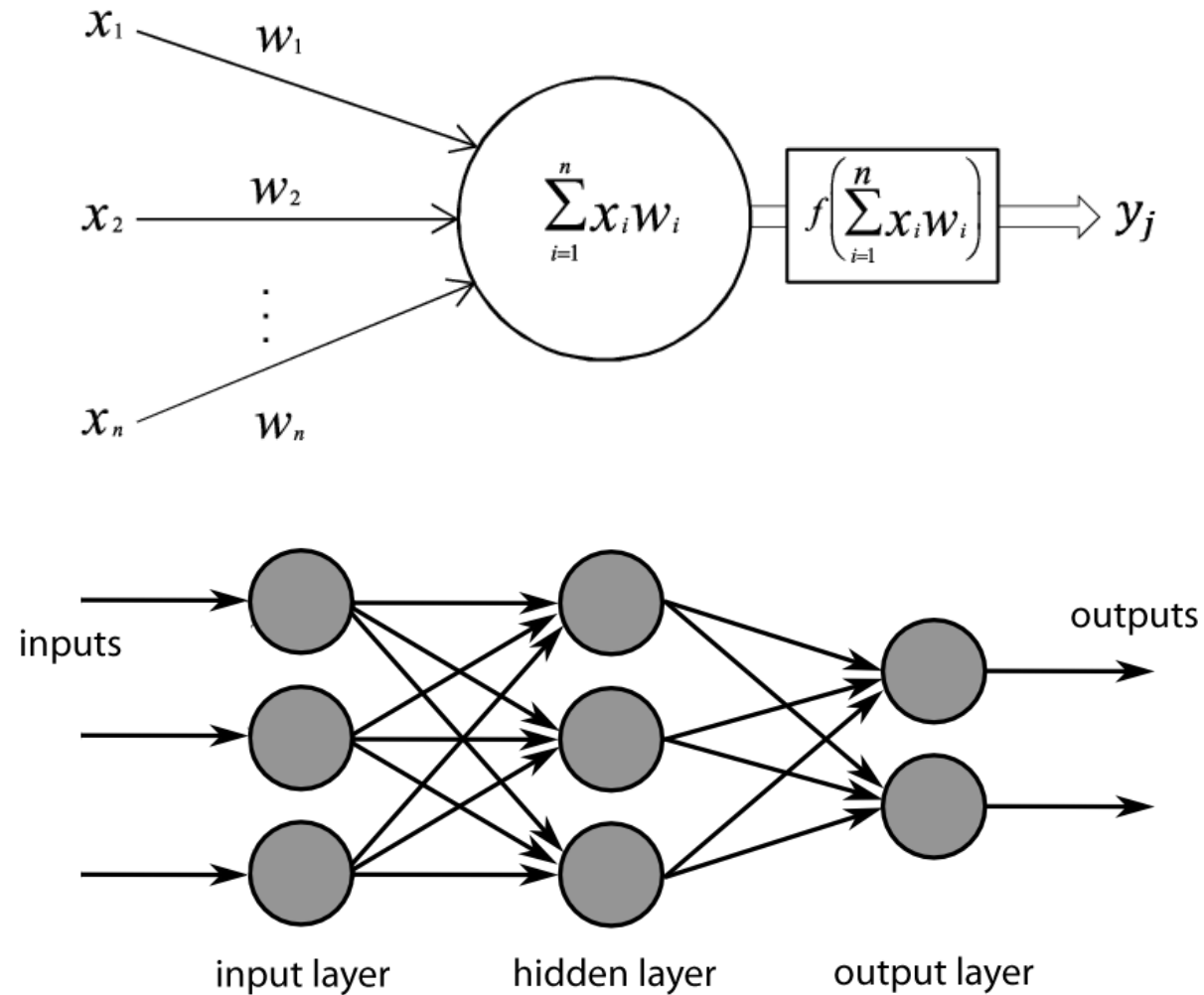
# Multi-layer perceptron (alm. 2 lags)



# Decision boundary

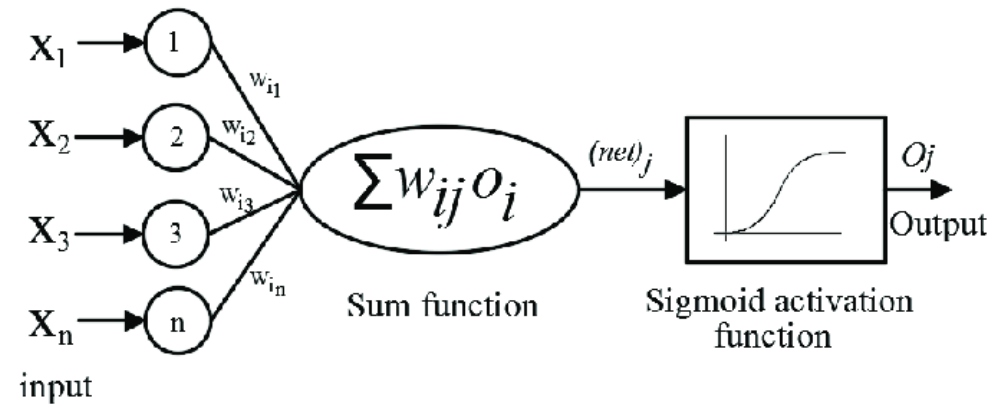


# Grafisk repræsentation

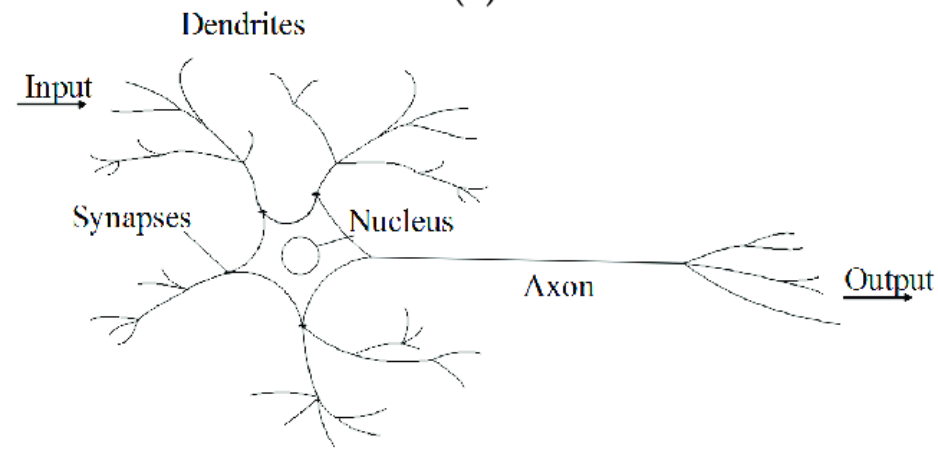




# Lidt historie igen..

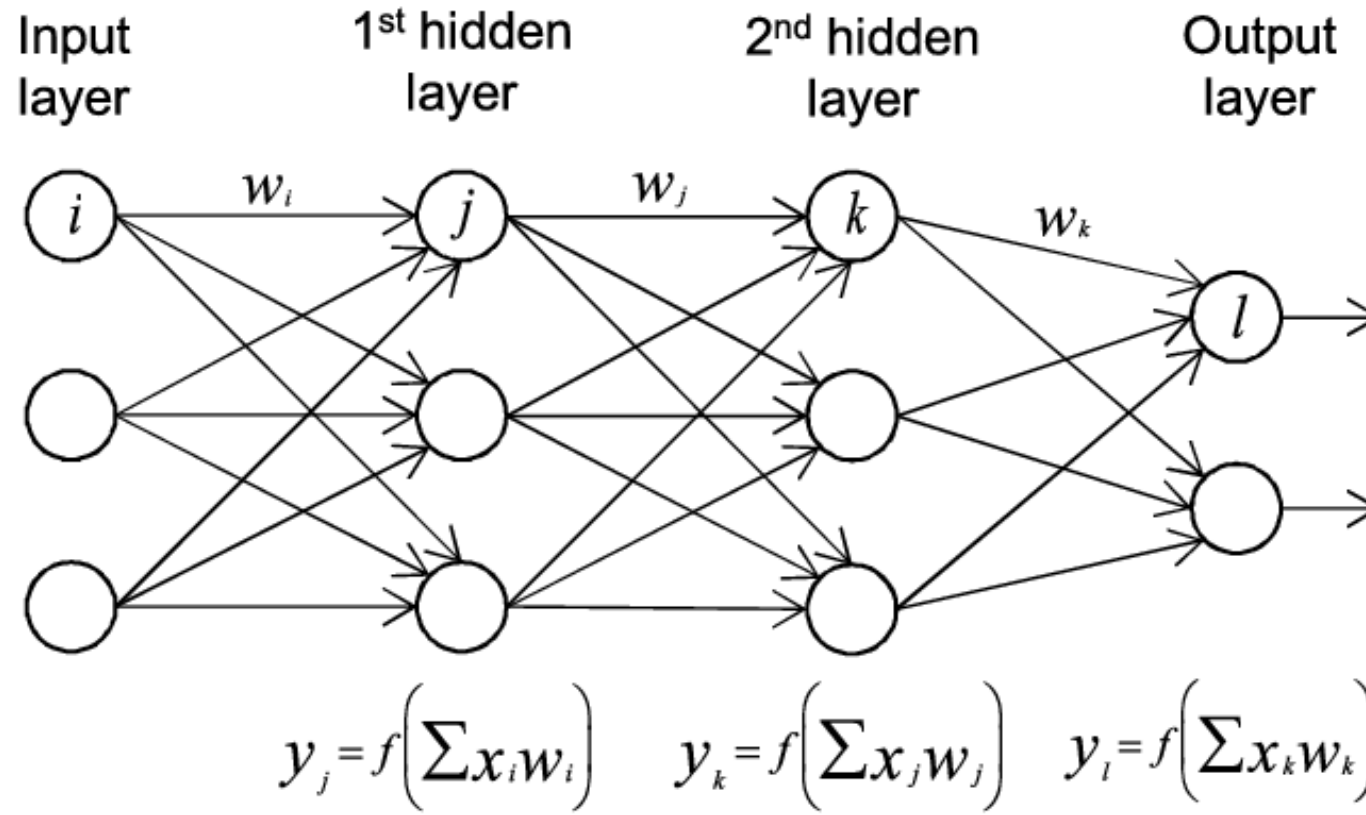


(a)



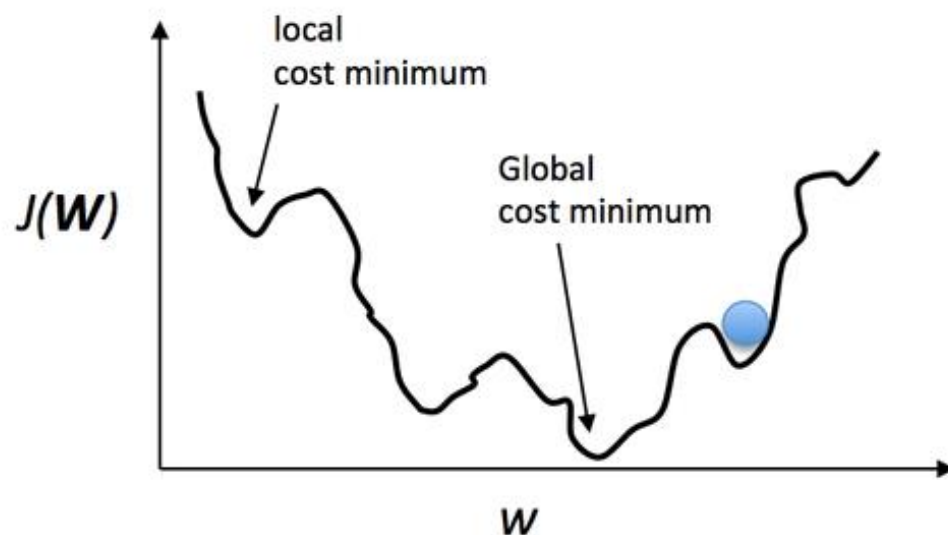
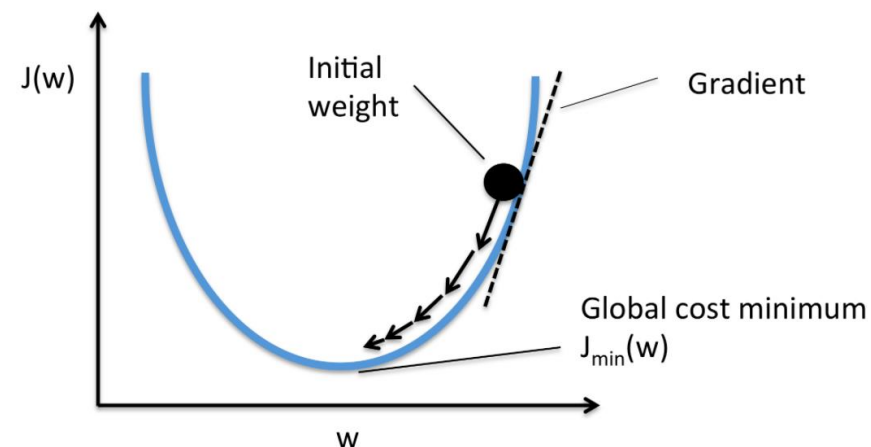
(b)

# Grafisk repræsentation



# Learning / training

- Regression – samme cost function som linear regression, MSE
- Klassifikation – fx. cross-entropy error function
- Samme princip med minimering af cost function som tidligere..



# Backpropagation

- "Trick" til lettere at beregne gradient af cost function
- Kan sammenlignes med FFT til udregning af DFT

# Keras / Tensorflow

- Neural network python libs
- Vi benytter Keras i ITMAL !
- Keras mere fleksibelt/udbygget end Scikit – især til dybe neurale net
- Keras = frontend til Tensorflow
- Keras vs tf.keras

