

# FACE RECOGNITION USING DEEP LEARNING WORKSHOP

# What is Machine Learning?

The bottom left corner of the slide features a decorative graphic consisting of several overlapping geometric shapes. There is a light blue triangle pointing upwards and to the right, a black triangle pointing downwards and to the right, and a series of small, light blue squares arranged in a grid-like pattern along the bottom edge.

Field of study that gives the computers the ability to learn without being explicitly programmed

or in layman terms

“Making machines intelligent”

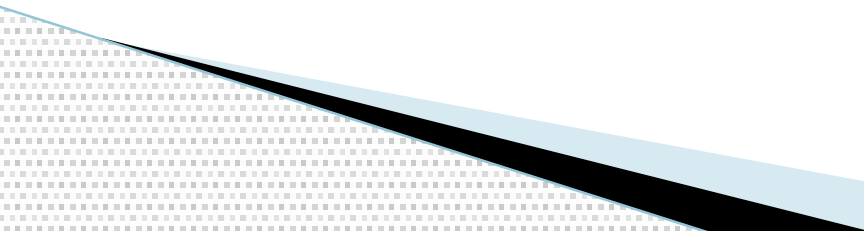


# MILESTONES IN MACHINE LEARNING

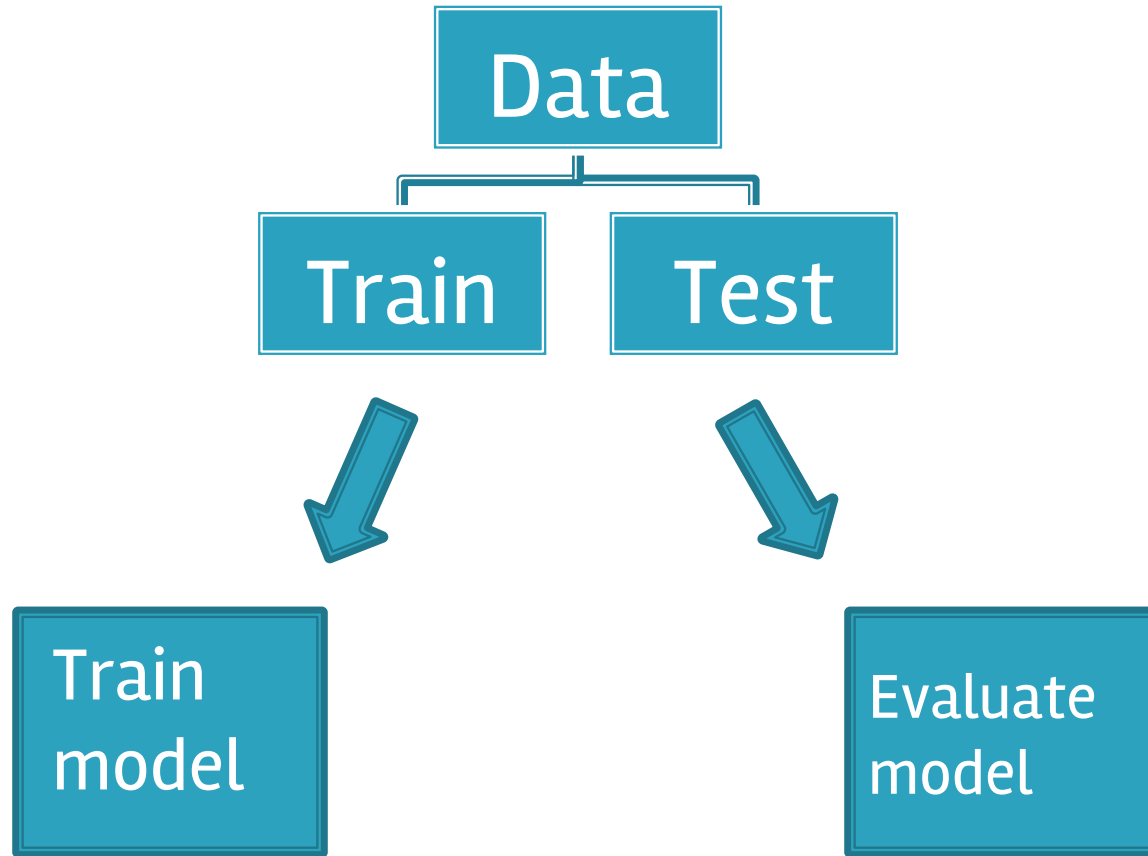
## ▶ ALPHA GO:

- Go is an ancient Chinese game which originated more than 2500 years ago
- There are more possible positions in Go than there are atoms in the universe!!!
- Go is played primarily through intuition unlike chess which is played by logic

# ML ML EVERYWHERE!!!

- ▶ Google, Facebook and Microsoft and many other tech giants are researching on ML
  - ▶ ML have a widespread applications
    - **Medical applications** such as Classification of EMG signals, Detecting malignant tumours,...
    - **Signal Processing applications** such as speech recognition, machine translation, Face Recognition
    - **Robotic applications**
    - **Data Analytics**
    - and many more ...
- 

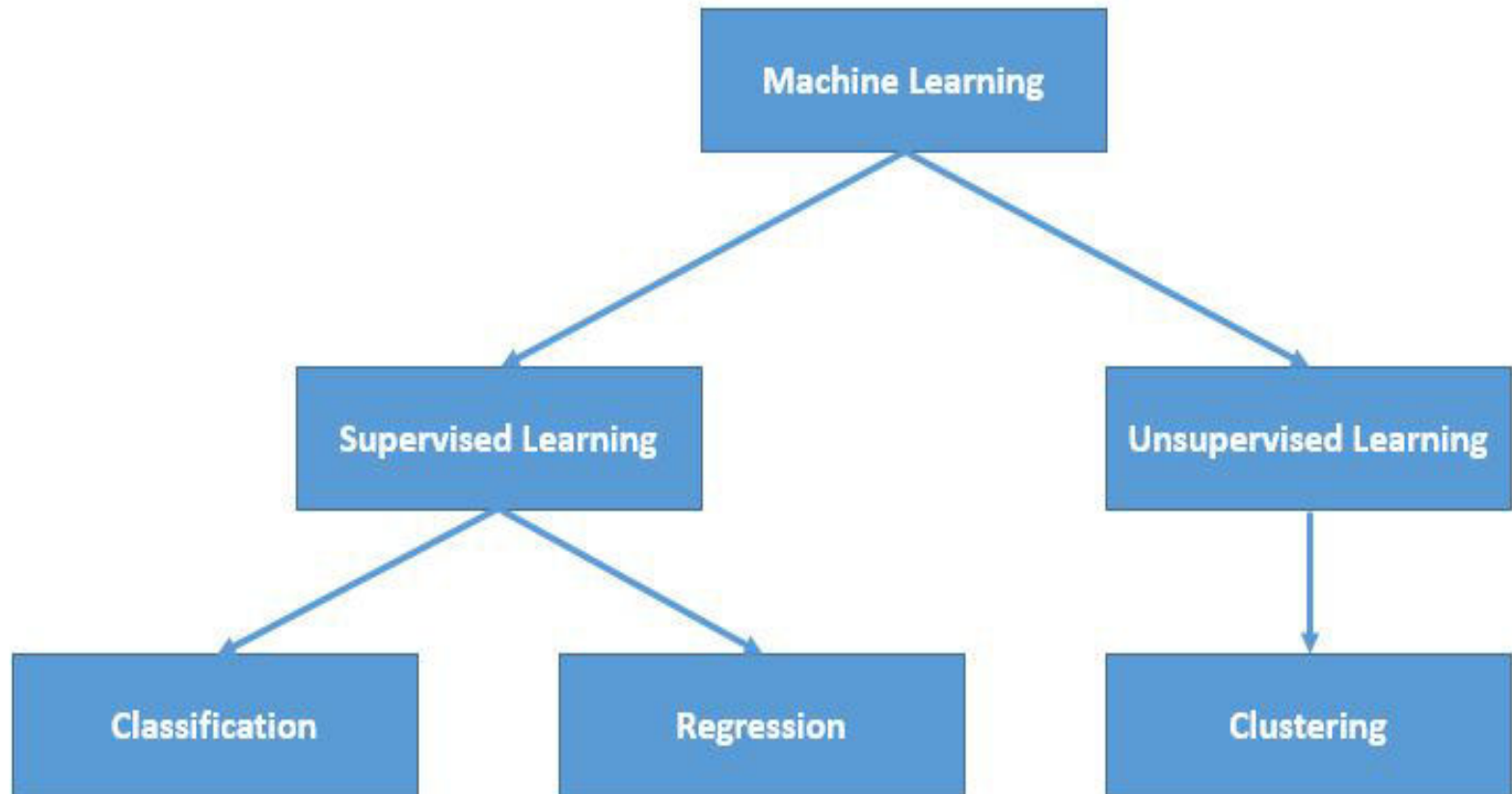
# The ML Process



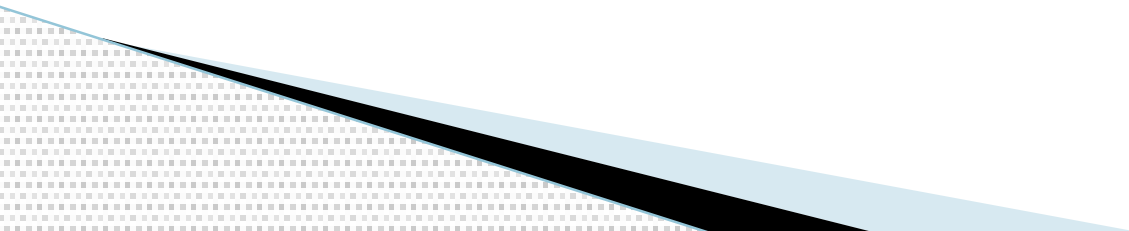
The hard part of  
ML

Establishing model  
accuracy

# TYPES OF ML

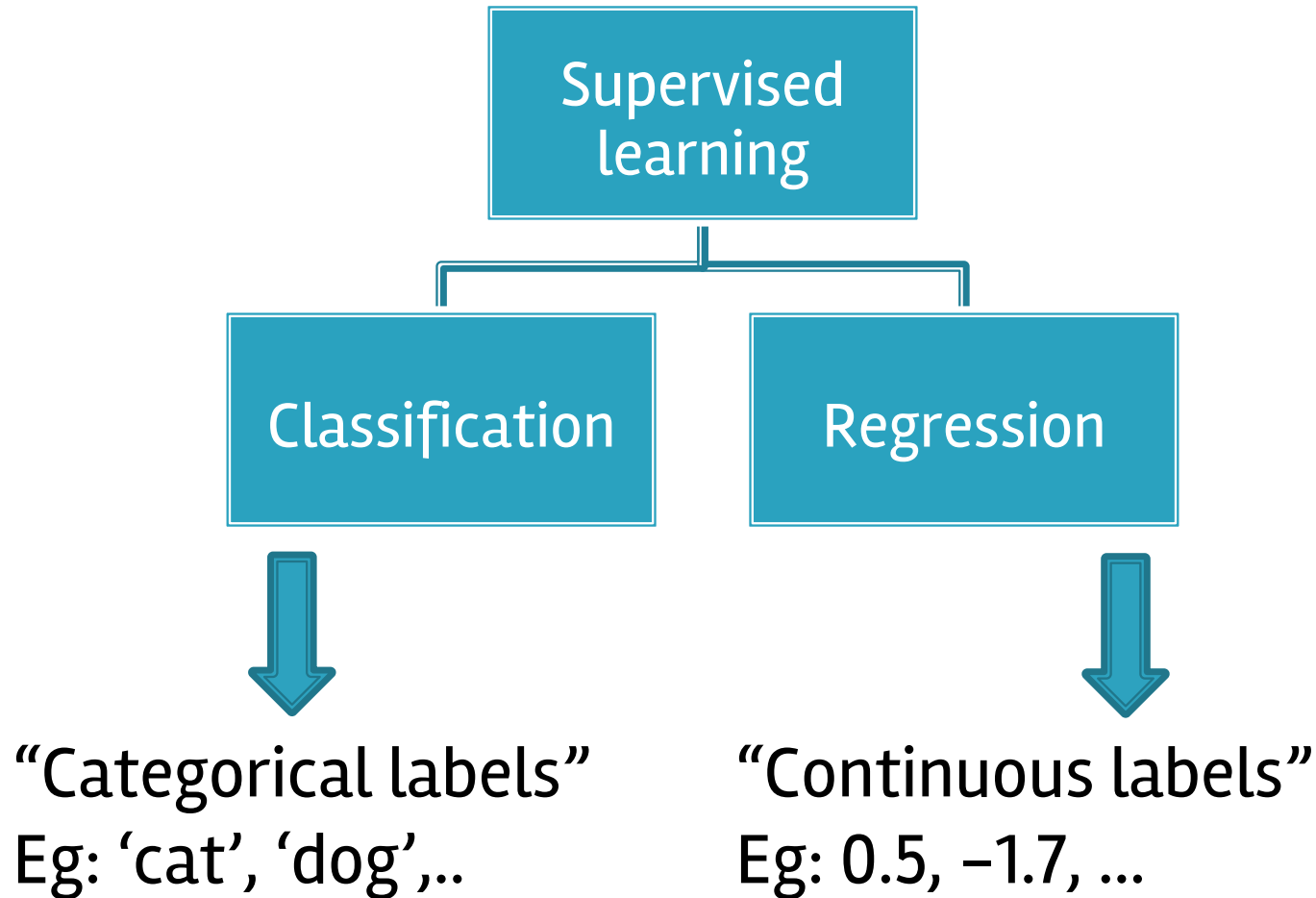


# **SUPERVISED LEARNING**

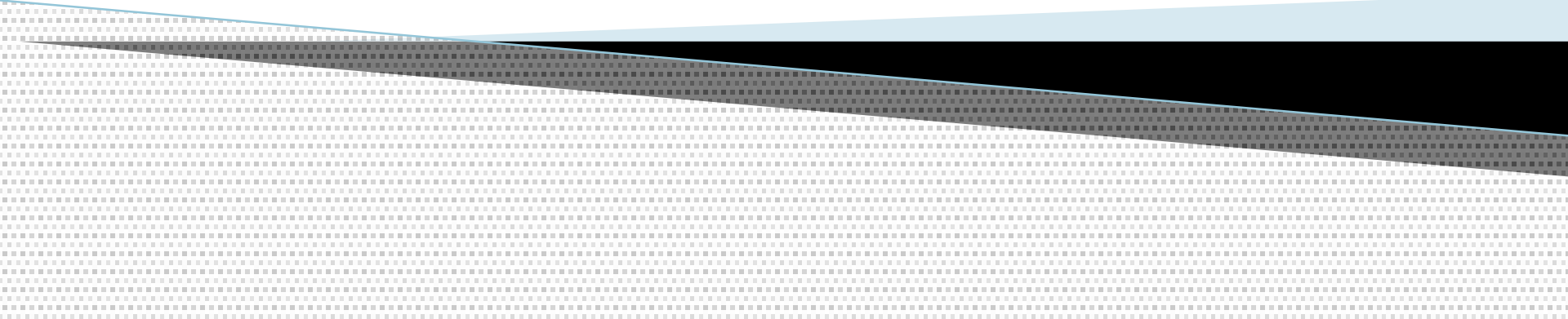




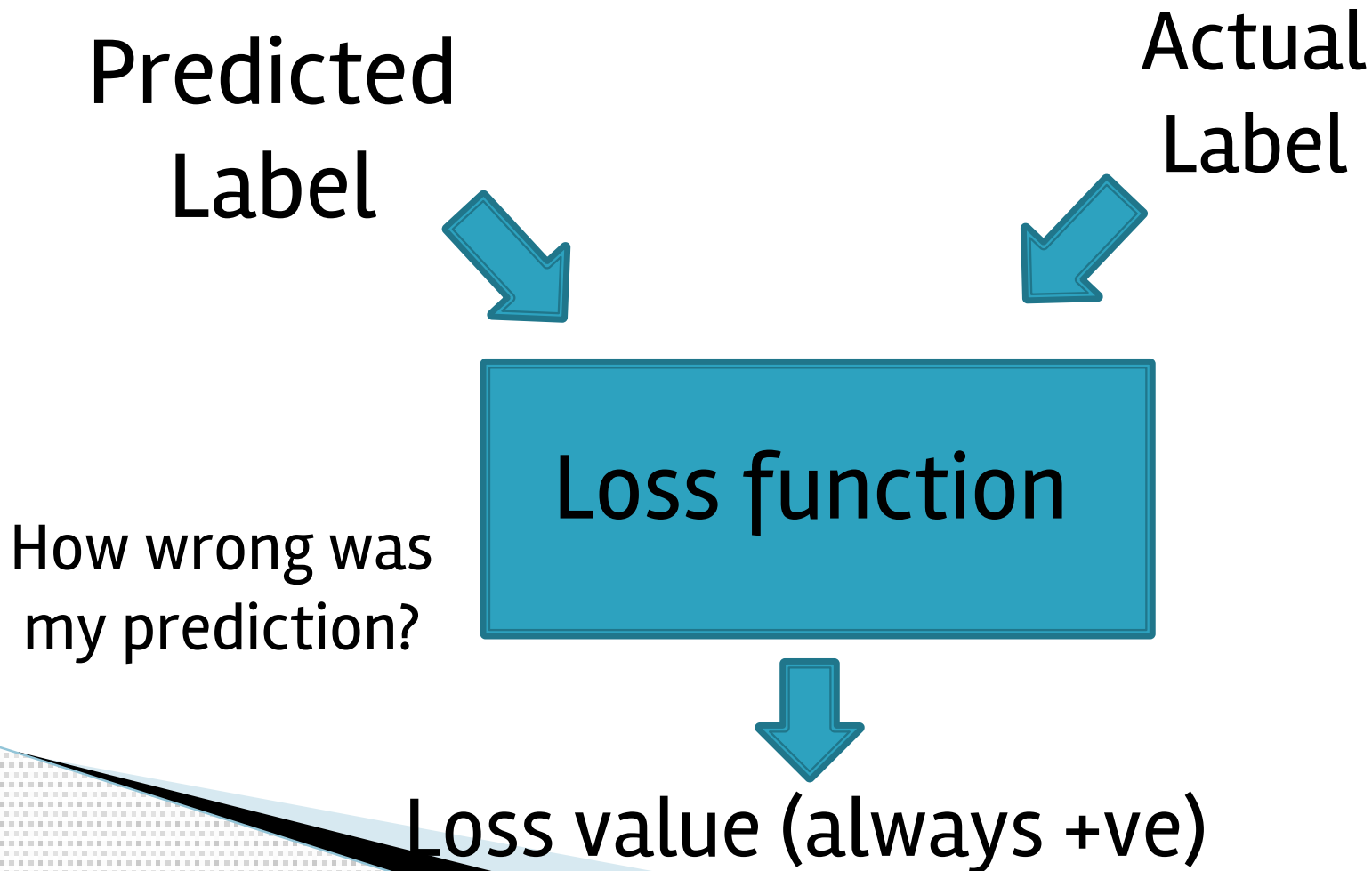
# Types of Supervised learning



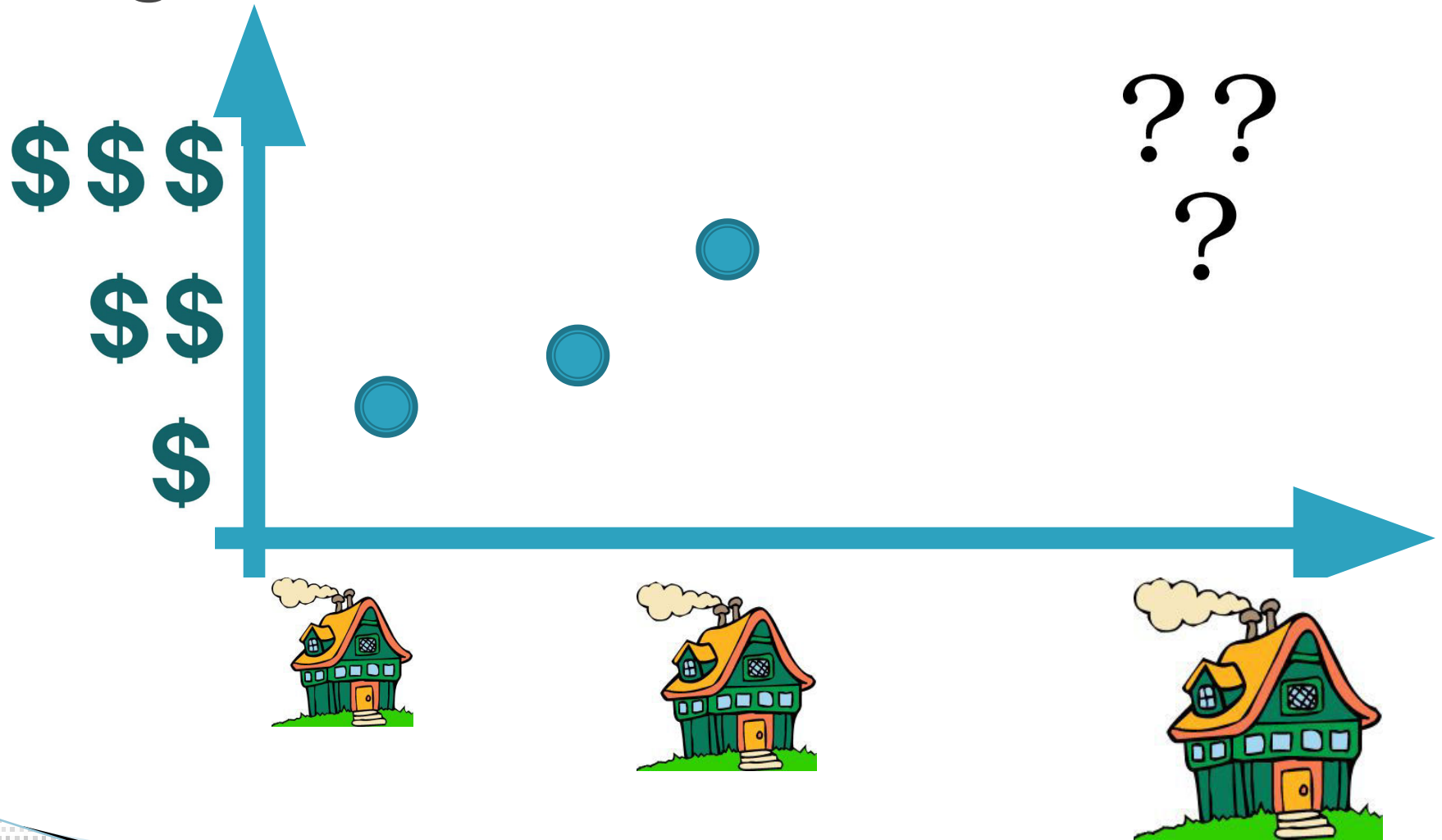
# What do we mean by learning?



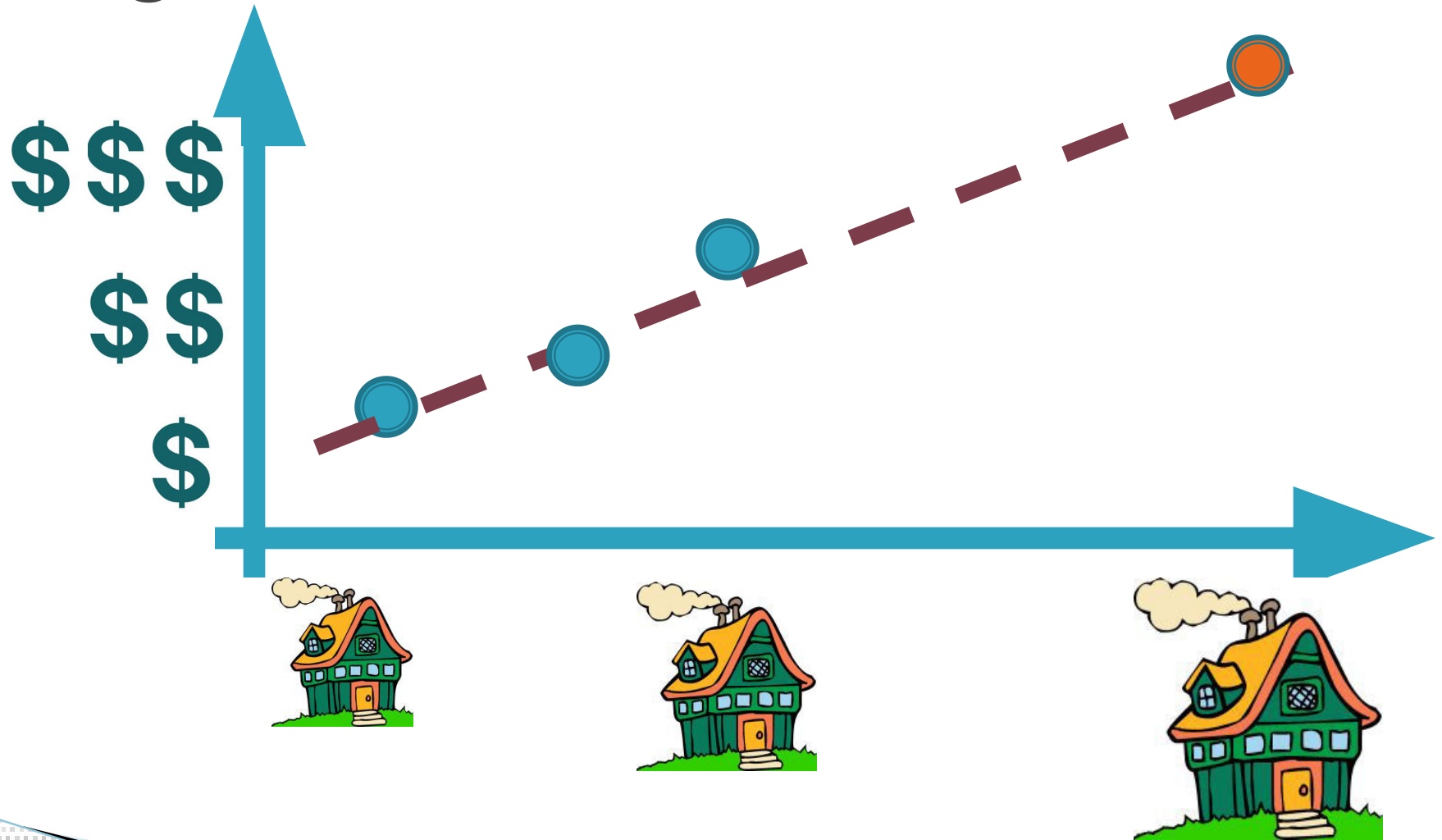
# Learning = Minimizing a function



# Regression



# Regression



# Classification



Ca  
t



Dog



Ca  
t



Dog

?



Ca ?  
Dog ?  
t

# Classification



0



1



0



1

?



0  
1

?  
?

# Classification



1



0



?



# Classification



1

0



0.91 = Dog!

# Unsupervised Learning



# Unsupervised Learning

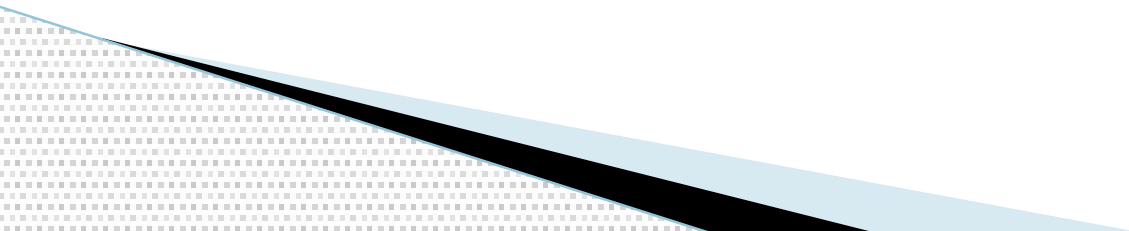




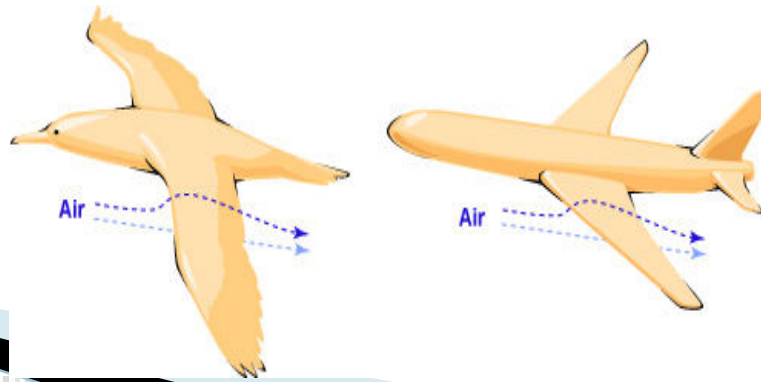
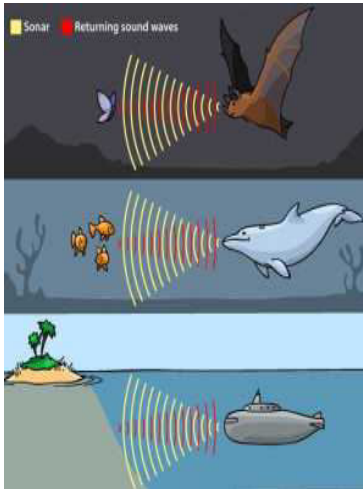
# Unsupervised Learning



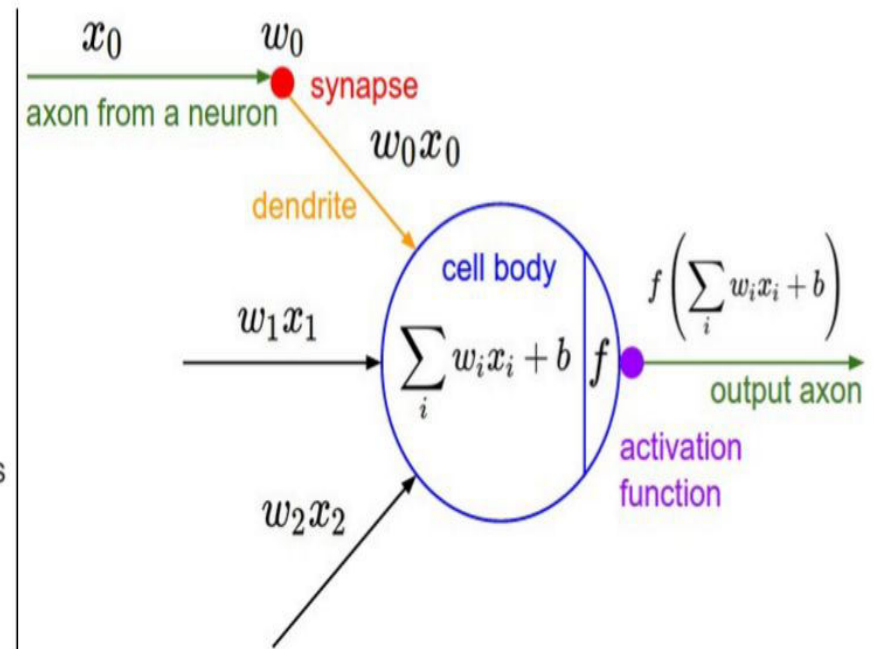
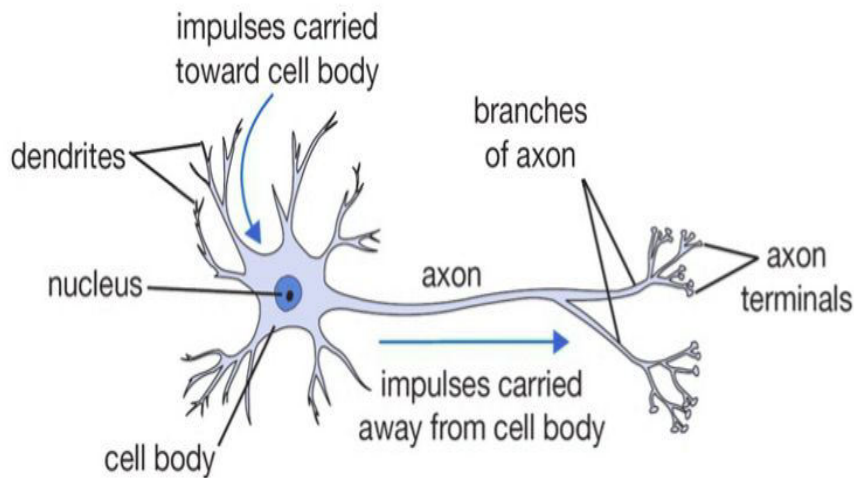
# NEURAL NETWORKS(SUPERVISED)



# Copying from Nature -- Nothing New, Really !!!

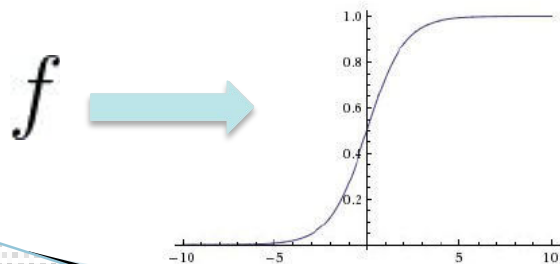
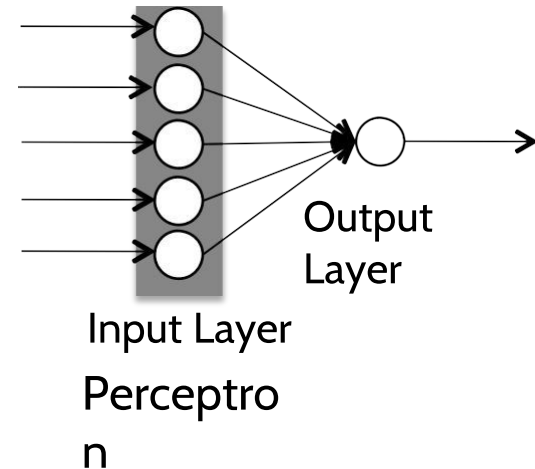
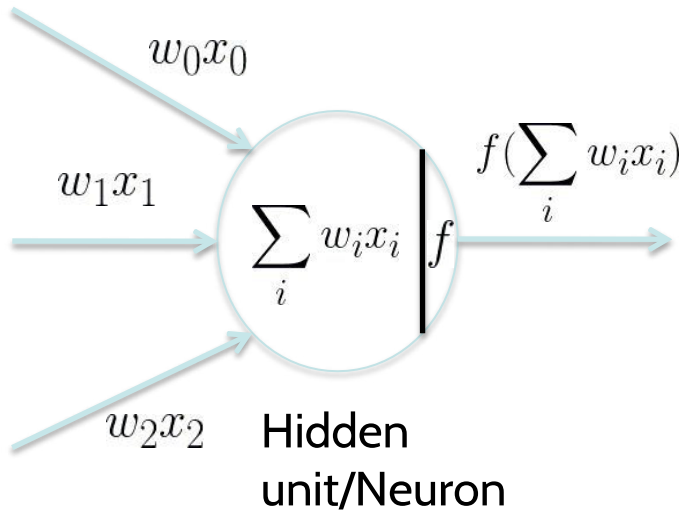


# Basic Building block :: A Neuron

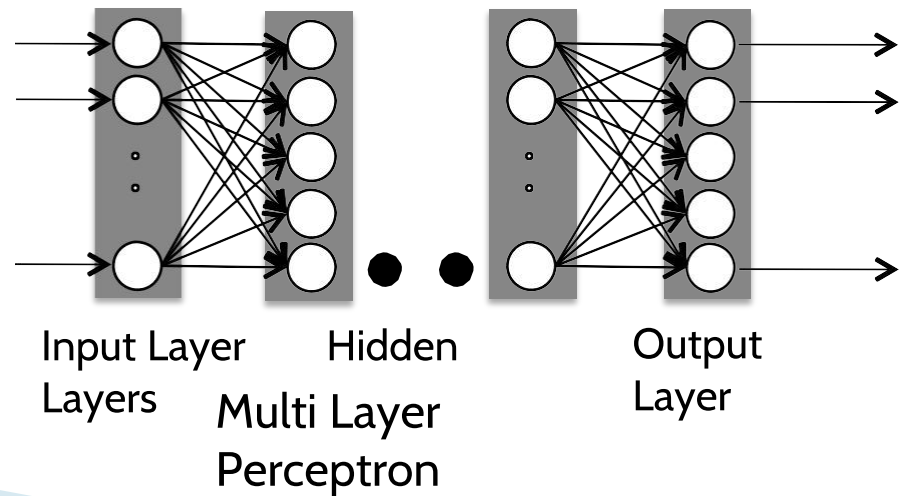




# Neuron, Perceptron and MLP



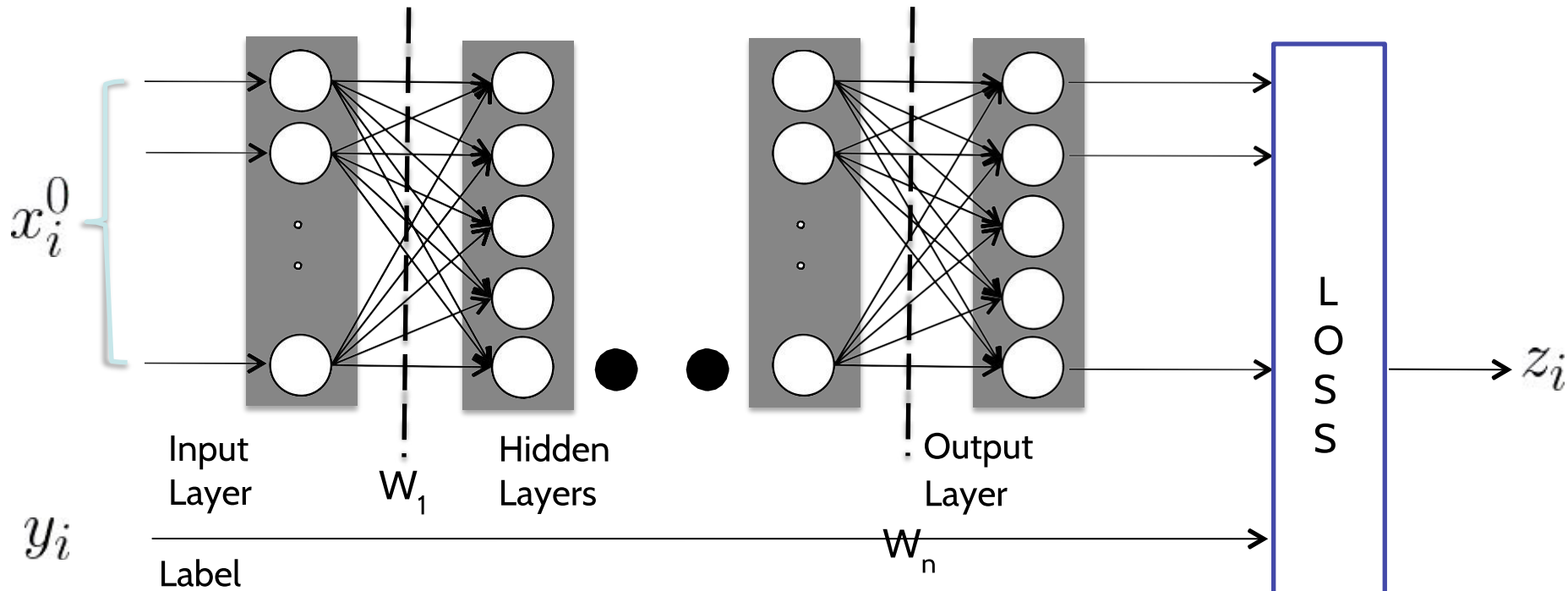
E.g. Sigmoid Activation Function







# Loss or Objective



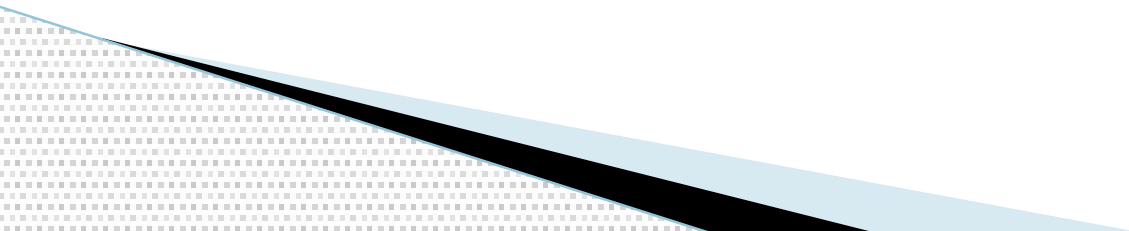
**Objective:** Find out the best parameters which will minimize the loss.

$$W^* = \arg \min_W \sum_{i=1}^N L(x_i^n, y_i; W) \longrightarrow \text{Weight Vector}$$

$$z_i = \frac{1}{2} \| x_i^n - y_i \|_2^2$$

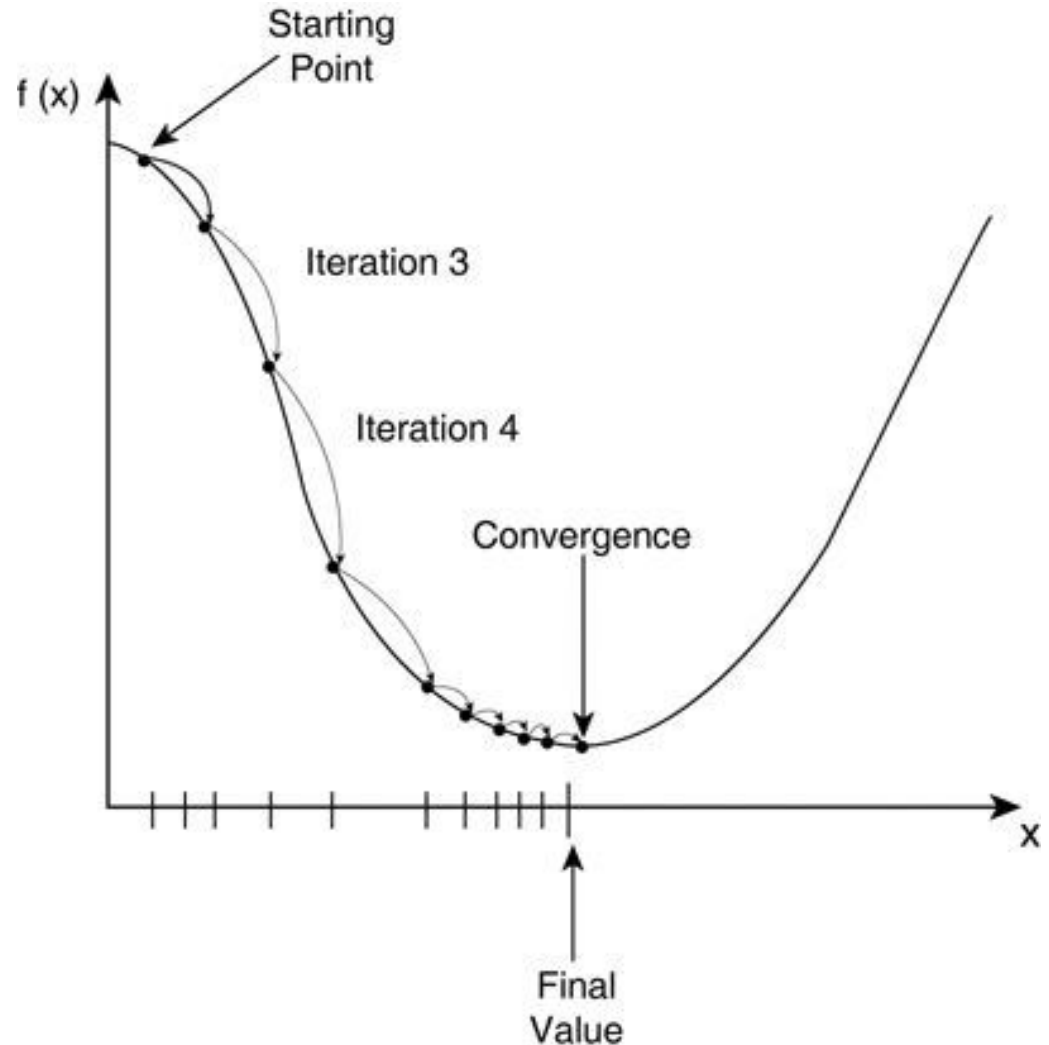
E.g. Squared Loss

# HOW DO NEURAL NETWORKS LEARN



# Gradient Descent

Workhorse for  
modern Deep  
Neural Networks!



# Gradient descent

Let  $\theta$  be the parameters (a,b) and let  $J(\theta)$  be the cost function.

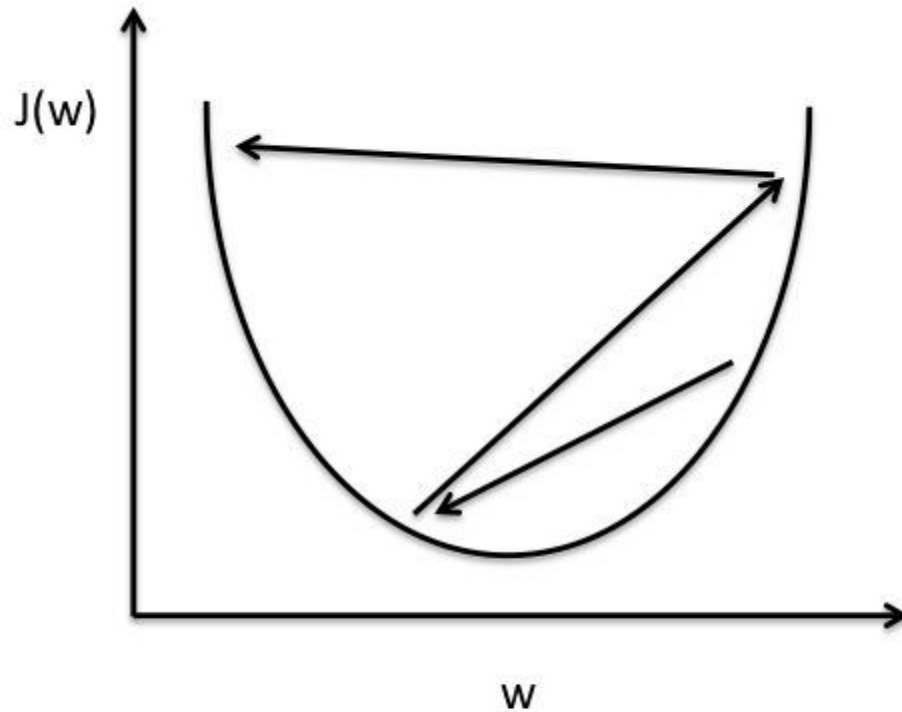
Repeat until convergence {

$$\theta_j \leftarrow \theta_j - \alpha \frac{\partial}{\partial \theta_j} J(\theta)$$

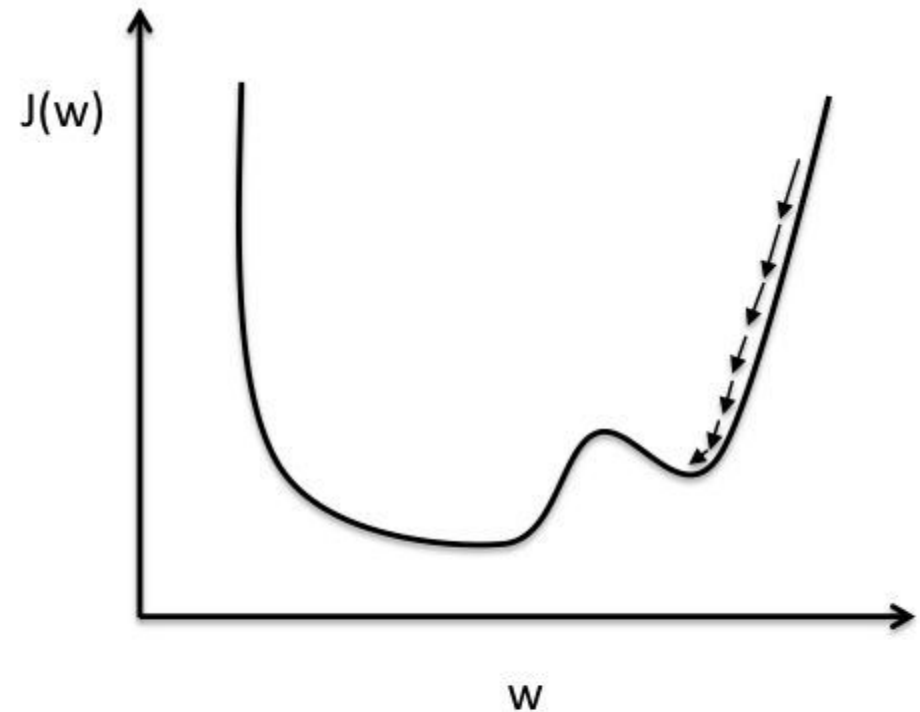
}



# Learning rate



**Large learning rate: Overshooting.**



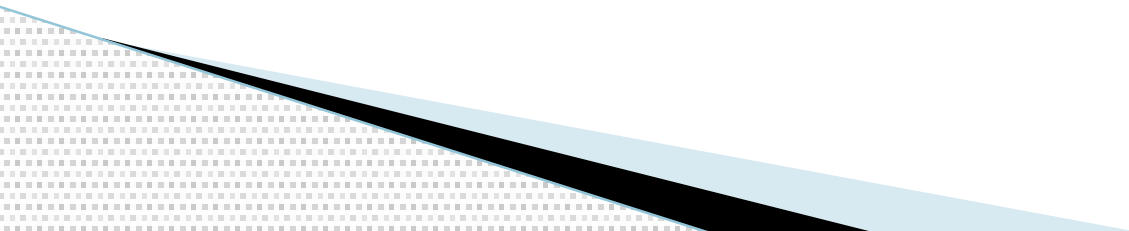
**Small learning rate: Many iterations until convergence and trapping in local minima.**

# Gradient descent procedure

- ▶ Choose high learning rate and perform GD
- ▶ If learning diverges, divide learning rate by 10
- ▶ Perform GD

Other methods to select learning rate also exist

**LET'S SEE AN EXAMPLE**





# Image Understanding



Caption: *"Two  
pizzas sitting  
on top of a  
stove top oven"*



Caption: *"A group of people  
shopping at an outdoor  
market."*



# Image Understanding



DAQUAR

**Q:** What is the object close to the wall?

**A:** whiteboard

**Q:** What is the object in front of the sofa?

**A:** table



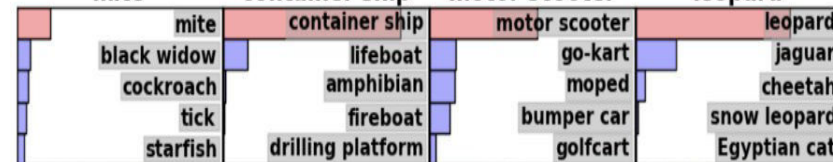
DAQUAR

**Q:** What is the largest object?

**A:** sofa

**Q:** How many windows are there?

**A:** 2



Classification: Alex Net





# Basic Approach

Example Images



Annotated  
Data Set  
(Training  
Data)

Feature Extraction  
Ex: PHOW, PHOG, GIST,

CNN  
Trainin

offline

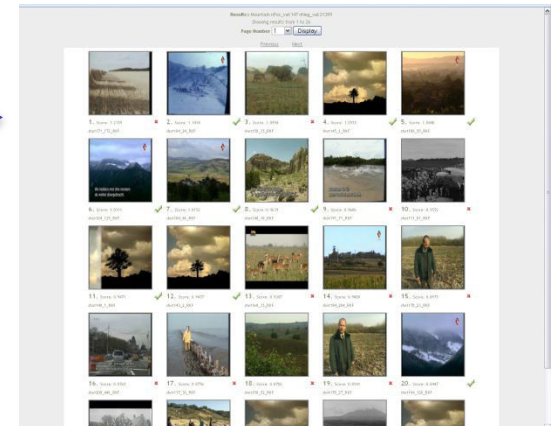


Unseen  
Image(s)

Feature  
Extractio

Testin

Classifier  
Ex: SVM,  
Random  
Forests,  
FC



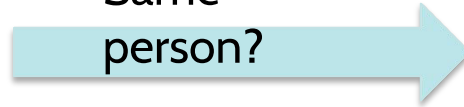
Ranked List



# Face Verification



Same  
person?



YES

$C = l$

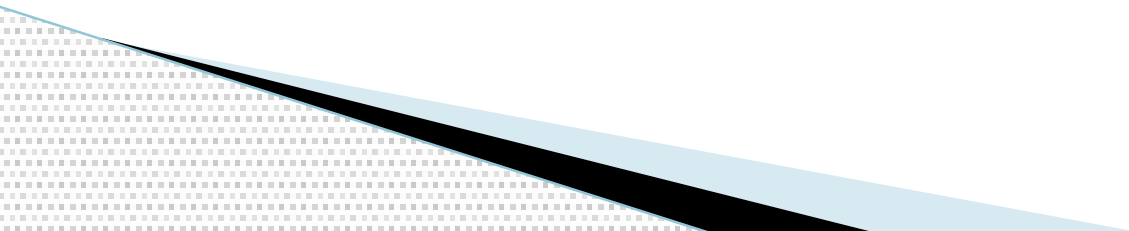
$l \in L = \{l_1 = \text{"YES"}, l_2 = \text{"NO"}\}$

**Goal:** To predict if the two input images  $X_1$  &  $X_2$  are of same person or not.

**Challenge:** Variation in Lighting, occlusion, pose, expression, multiple faces. Different people in train and test set.

# ADVANCED NEURAL NETWORKS

- ▶ CONVOLUTIONAL NEURAL NETWORKS
- ▶ RECURRENT NEURAL NETWORKS
- ▶ GENERATIVE ADVERSARIAL NETWORKS



# ML RESOURCES

- Coursera Machine learning Courses by Andrew ng
- <http://neuralnetworksanddeeplearning.com/>
  - Online book by Michael Nielsen
- <http://cs231n.github.io/>
  - Courses by Stanford University