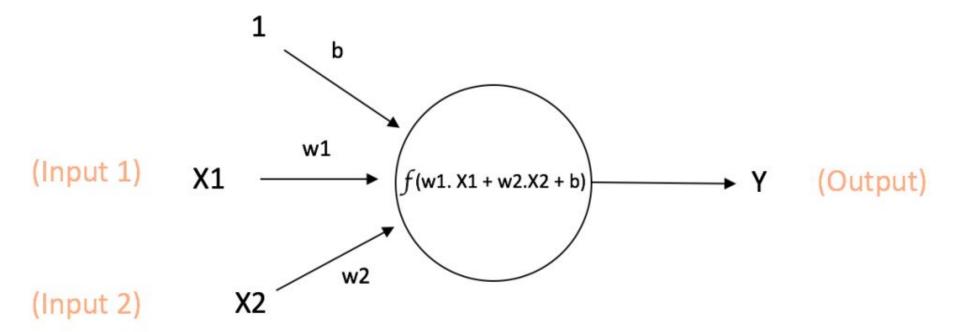
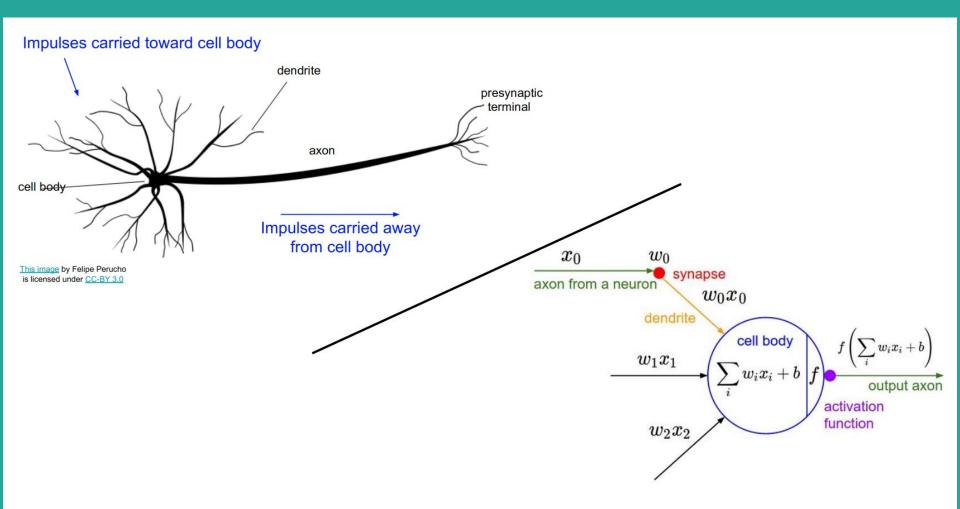
## Neural Network





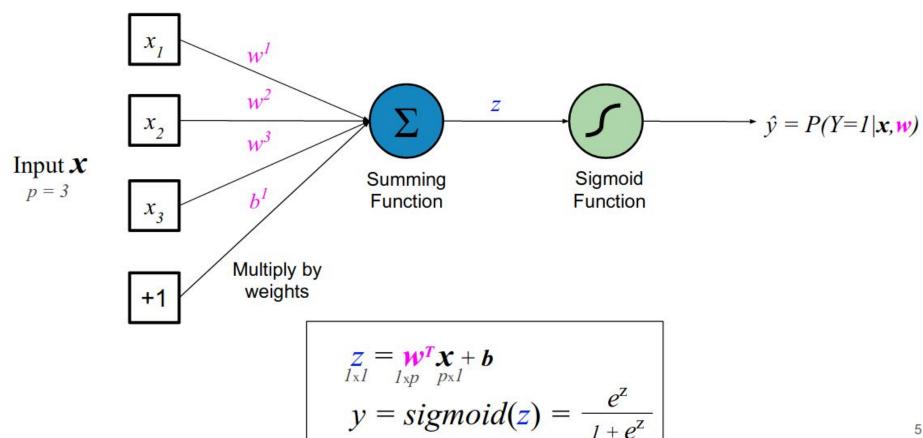
Output of neuron = Y= 
$$f(w1. X1 + w2. X2 + b)$$



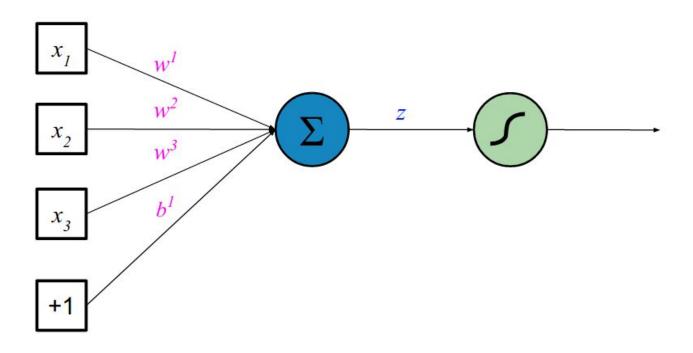
# NN & Regression



## **Expanded Logistic Regression**



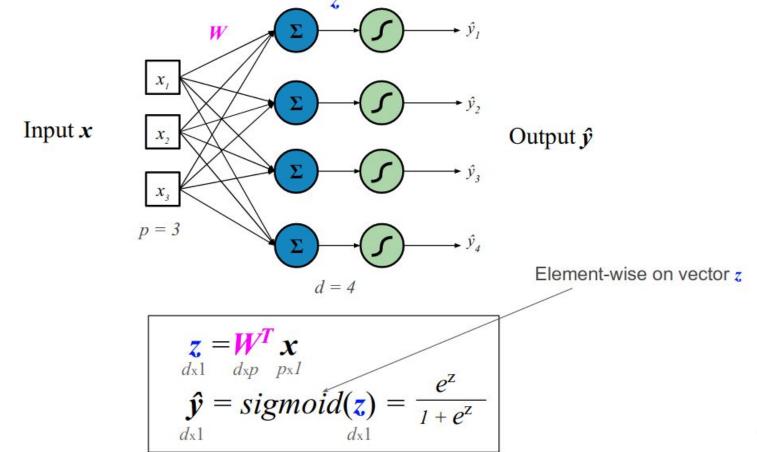
## "Neuron"



# 1-Layer network



### 1-Layer Neural Network (with 4 neurons)



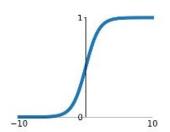
## Activation function



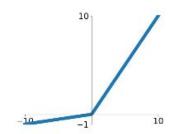
### **Activation Functions**

#### **Sigmoid**

$$\sigma(x) = \frac{1}{1 + e^{-x}}$$

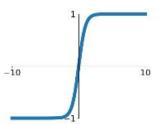


## Leaky ReLU max(0.1x, x)



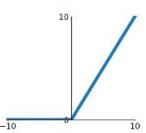
#### tanh

tanh(x)



#### ReLU

 $\max(0,x)$ 



#### **Maxout**

$$\max(w_1^T x + b_1, w_2^T x + b_2)$$

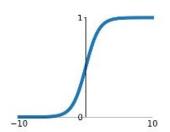
#### **ELU**

$$\begin{cases} x & x \ge 0 \\ \alpha(e^x - 1) & x < 0 \end{cases}$$

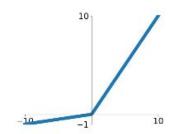
### **Activation Functions**

#### **Sigmoid**

$$\sigma(x) = \frac{1}{1 + e^{-x}}$$

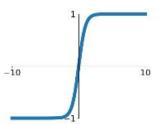


## Leaky ReLU max(0.1x, x)



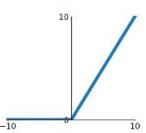
#### tanh

tanh(x)



#### ReLU

 $\max(0,x)$ 



#### **Maxout**

$$\max(w_1^T x + b_1, w_2^T x + b_2)$$

#### **ELU**

$$\begin{cases} x & x \ge 0 \\ \alpha(e^x - 1) & x < 0 \end{cases}$$

# Training





# See Google Dev.



# Implementation



#### Full implementation of training a 2-layer Neural Network needs ~20 lines:

```
import numpy as np
    from numpy random import randn
 3
    N, D_{in}, H, D_{out} = 64, 1000, 100, 10
                                                                  Define the network
    x, y = randn(N, D_in), randn(N, D_out)
    w1, w2 = randn(D in, H), randn(H, D out)
    for t in range(2000):
      h = 1 / (1 + np.exp(-x.dot(w1)))
9
      y \text{ pred} = h.dot(w2)
10
                                                                  Forward pass
      loss = np.square(y_pred - y).sum()
11
      print(t, loss)
12
13
14
      grad y pred = 2.0 * (y pred - y)
15
      grad_w2 = h.T.dot(grad_y_pred)
                                                                  Calculate the analytical gradients
      grad h = grad y pred.dot(w2.T)
16
17
      grad w1 = x.T.dot(grad h * h * (1 - h))
18
19
      w1 -= 1e-4 * grad_w1
                                                                  Gradient descent
      w2 -= 1e-4 * grad w2
20
```