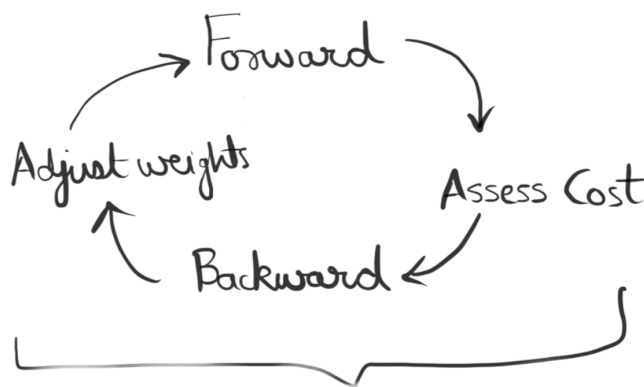


5 Components of Neural Network Training

1. Training Loop
2. Forward
3. Cost
4. Backward
5. Adjust Weights



Just plain calculations: $+$, $-$, \times , $/$, functions

No Algorithmic Cleverness

No smart data structures

1. Training Loop

Epochs and Batch Size

Problem 1: We are training on a dataset of 506 houses, with batch size of 10 and for 20 epochs, How many times weight update will happen?

2. Forward

Data

x1	x2		y
1	2		0
1	3		0
2	1		0
2	3		0
3	1		0
1	4		1
4	2		1

fig 2a

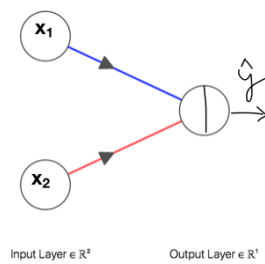
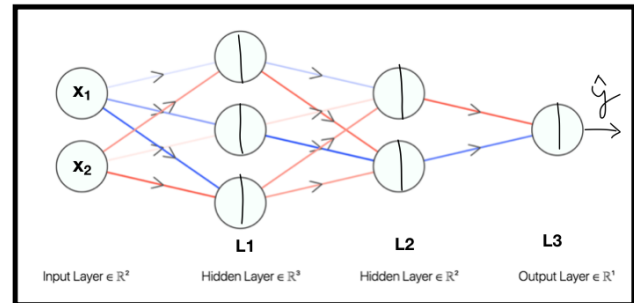


fig 2b



Problem 1: For the given single neuron setup in fig 2a, predict the output for the first input batch of size 4.

Problem 2: For the given 2 matrices A and B,

A

$$\begin{bmatrix} 1 & -2 \\ 2 & -1 \\ 3 & -3 \end{bmatrix}$$

B

$$\begin{bmatrix} 1 & 1 & 2 & 2 \\ 2 & 3 & 1 & 3 \end{bmatrix}$$

- Compute $A \times B$ (Matrix multiplication)
- Compute elementwise Sigmoid on the output of above multiplication

Problem 3: For the given neural network in fig 2b,

- How many weights are there in first hidden layer?
- How many weights are there in total?
- Compute the activation from the first hidden layer of the network for the first input batch of size 4?
- How many activations are produced from first hidden layer for single input sample?

3. Cost

- Mean Squared Error for regression problems

$$J = \frac{1}{2N} \sum_{i=0}^N (y - \hat{y})^2$$

- Categorical Cross Entropy Error for classification problems

$$J = -\frac{1}{N} \sum_{i=0}^N (y^{(i)} \log(\hat{y}^{(i)}) + (1 - y^{(i)}) \log(1 - \hat{y}^{(i)})) \quad (13)$$

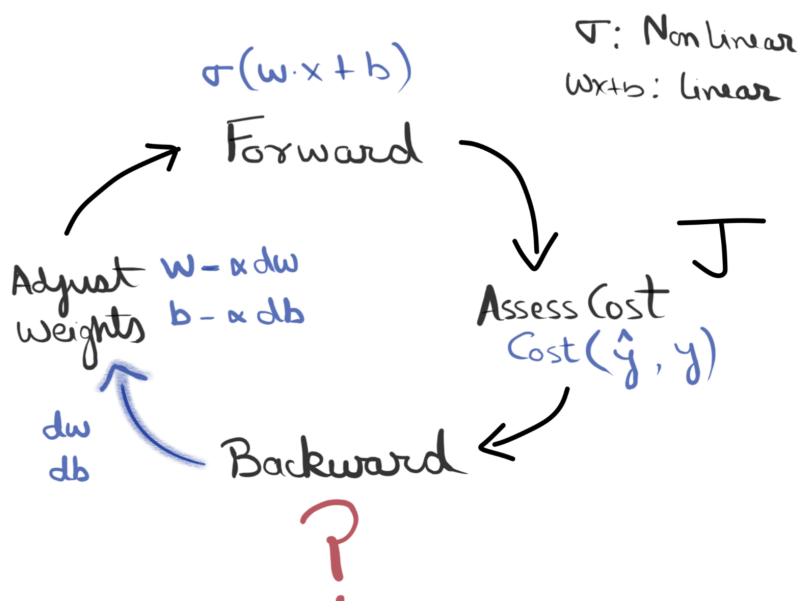
Problem 1 : For the single neuron setup like above compute the Mean Squared Error (MSE) cost for the first batch of size 3 given the following training data. And Weights as $w_1 = -0.2$, $w_2 = 0.5$

x1	x2	y
20	16	5
40	20	3
10	6	4
20	12	4

Problem 2 : For the following values of Y and Y_hat for a classification problem, Compute Categorical Cross entropy error

y	y_hat
1	0.96
0	0.003
0	0.8
1	0.88

4. Backward



Derivative from first principles

Problem 1: Compute derivative of following functions from first principles

$$y = 5x$$

$$y = x^2$$

Simple Derivative Problems

Problem 1: Find derivatives for following functions

$$y = \sin(x)$$

$$y = x + 2$$

$$y = 5 \sin(x)$$

$$y = 3x$$

$$y = 5 \sin(x) + x^4$$

$$y = 5x^4 \sin(x)$$

$$y = 2e^x \log(x)$$

Derivatives Chain Rule

Problem 1: Find derivatives for following functions using chain rule

$$y = \log(x^2)$$

$$y = \sin^2(x)$$

$$y = \sin(x^2)$$

$$y = e^{5x^2}$$

$$y = \frac{1}{1 + e^{-10x+3}}$$

Gradient Descent

Problem 1: Tale of 2 functions: First is f , the function we are trying to predict. second is J , the cost function. Whats your general observation about f and J ?

Problem 2: Simply stated gradient descent means that move in the direction of negative slope in some proportion to the incline of the slope.

- Which of above 2 functions we would do gradient descent?
- What is a learning rate?

Problem 3: Given the following cost function J

$$J(x) = (x - 3)^2$$

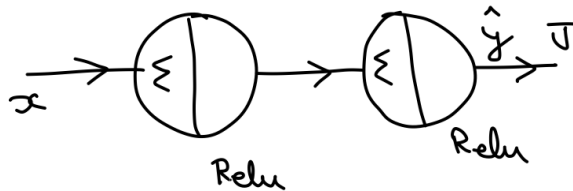
and our current weight is 7, given the learning rate of 0.1

- What will be the length of our next stride?
- What will be the new weight?

Backpropagation

Problem 1: What is being back propagated?

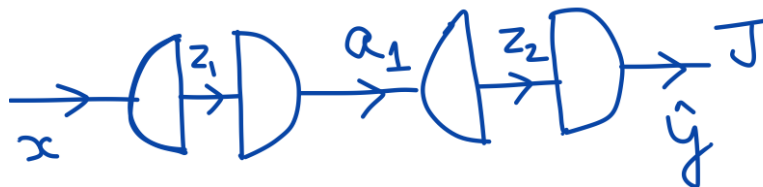
Problem 2: In the following setup



- How many functions are involved?
- How many weights are involved?
- With only one training sample $x=3$, $y=2$ and weights $w_1=0.5$, $w_2=0.8$ What's y_{hat} ?
- What's the MSE Cost?

Problem 3:

Just expanded the above neural network to show weighted sum and activation components



To go backward, compute the following for previously given weights and training sample

$$\frac{dJ}{d\hat{y}} \quad \frac{d\hat{y}}{dz_2} \quad \frac{dz_2}{dw_2} \quad \frac{dz_2}{da_1} \quad \frac{da_1}{dz_1} \quad \frac{dz_1}{dw_1}$$

Problem 4:

Whole purpose of back propagation or this notebook is to compute **how cost changes with weights** i.e

$$\frac{dJ}{d\text{weights}}$$

What are the values of:

a) $\frac{dJ}{dw_1}$

b) $\frac{dJ}{dw_2}$

(Hint: Use Chain Rule & Problem 3 results)

5. Update Weights

Problem 1: In the above problem after you have computed $\frac{dJ}{dw_1}$ and $\frac{dJ}{dw_2}$

what are new weights if the learning rate is 0.1

Forward Again

Problem 1 : Plug in those new weights and check if the cost is reduced.