

Sheet 8_XOR_Neural_Network

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1 Using Backpropagation algorithm to train a two layer XOR problem.

```
In [36]: #imports cell
import numpy as np
import matplotlib.pyplot as plt
import sys
```

1.0.1 For the XOR problem introduced below, 4 data points exist in the dataset -

$x_1 = (1, 0)$, $x_2 = (1, 1)$, $x_3 = (0, 1)$, $x_4 = (0, 0)$.)

```
In [2]: # The training data.
X = np.array([[1, 0], [1, 1], [0, 1], [0, 0]])

# The labels for the training data.
Y = np.array([[1], [0], [1], [0]])
```

Let us define a one hidden layer network with two input units, N hidden layer units and one output unit, with training set of D data samples.

1.0.2 Activation Function used here is Sigmoid. I tried Relu but it kept getting me bugs i think i implemented it wrongly.

```
In [135]: def sigmoid(f):
            return 1 / (1 + np.exp(-2 * f))

            def sigmoid_derivative(f):
                return f * (1 - f)
```

1.0.3 Forward Calculations

```
In [136]: def forward(input_layer, output_layer, hidden_weights, output_weights, bias):
            z2 = np.dot(input_layer, hidden_weights)
            a2 = sigmoid(z2)
            a2 = np.vstack((a2.T, bias)).T
            z3 = np.dot(a2, output_weights)
            a3 = sigmoid(z3)
            return a2, a3, hidden_weights, output_weights
```

1.1 Back Propagation: Gradient Descent

```
In [141]: def backprobagation(input_layer, output_layer, hidden_weights, output_weights, bias,
    for _ in range(max_iter):
        a2, a3, hidden_weights, output_weights = forward(input_layer, output_layer, 1)
        loss_a3 = output_layer - a3
        loss_a2 = np.dot(loss_a3, output_weights[0:2, :].T) * sigmoid(np.dot(input_l
        delta_a3 = loss_a3 * sigmoid_derivative(a3)
        delta_a2 = loss_a2 * sigmoid_derivative(a2[:, 0:2])
        # Updating weights
        output_weights += np.dot(a2.T, delta_a3)
        hidden_weights += np.dot(input_layer.T, delta_a2)
    return a3

In [143]: # Randomly initialising weights
    np.random.seed(1)
    hidden_weights = np.random.random((2, 2))
    output_weights = np.random.random((3, 1))
    # Bias term initialization
    bias = np.ones((1, 4))
    # Number of iterations
    iterations = 33000
    print(backprobagation(X, Y, hidden_weights, output_weights, bias, iterations))

[[0.97508655]
 [0.05622335]
 [0.97508655]
 [0.00115668]]
```