

## Back- propagation Algorithm – NN

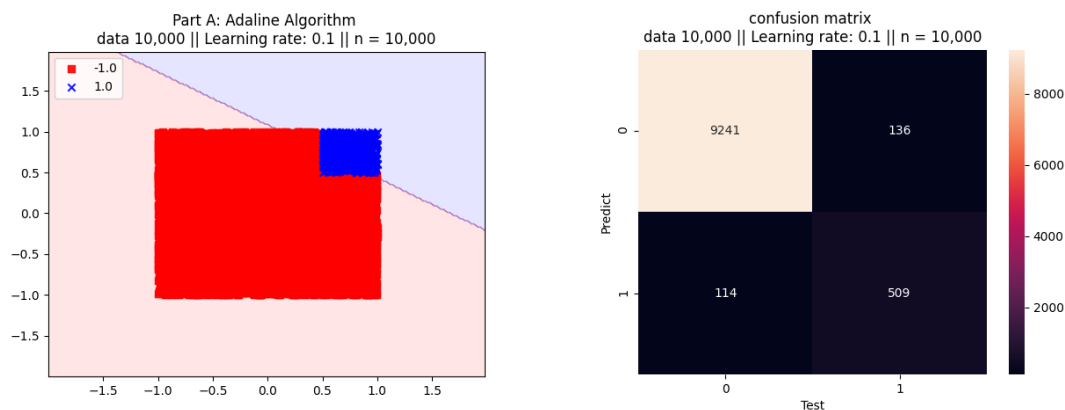
We create two-dimension random data  $\langle x, y \rangle$  in size 1,000, with range  $(-1, 1)$ . Then classified each sample to "1" or "-1" such that if  $x$  and  $y$  both bigger than 0.5 they get the value "1", if-else, "-1".

The MLPClassifier from SKlearn use Feed-Forward Networks and Backpropagation, with given data and desired output, the MLPClassifier train the model and change the weight and bias accordingly.  
you can learn all about MLPClassifier [Here](#).

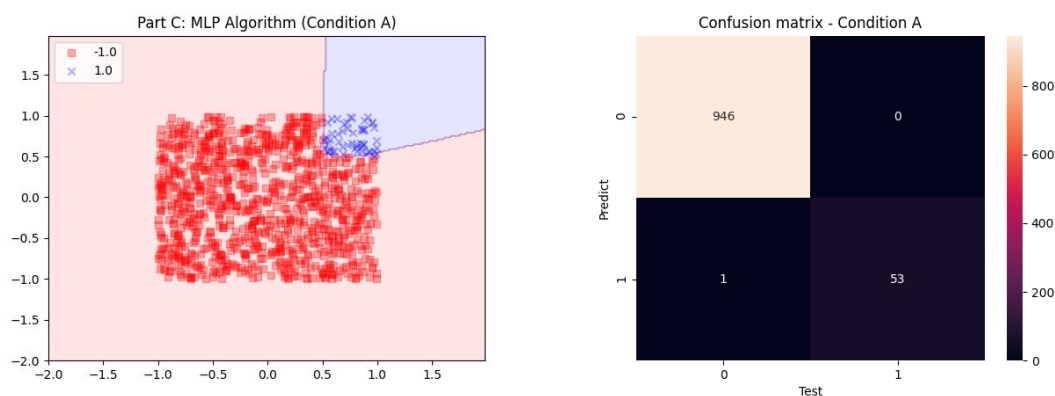
### Part C:

In this part we will use data from parts A and B and try to improve our result by using Backpropagation (the back is our model prediction):

**Adaline (our result: 97.5%):**



**MLPClassifier (our result: 99.9%):**



We can see that the result matches more accurately with MLP because the data is not linearly separate.

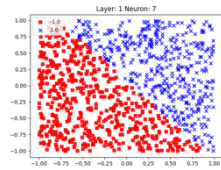
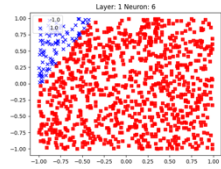
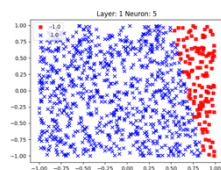
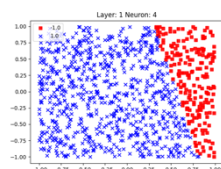
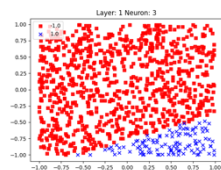
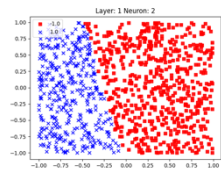
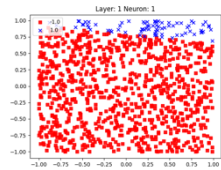
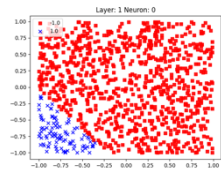
Now let's look at the second problem that points have value 1 only if  $1/2 \leq x^2 + y^2 \leq 3/4$ , to answer this problem we use MLP with 2 hidden layers such

that the first layer has 8 neurons and the second has 2.

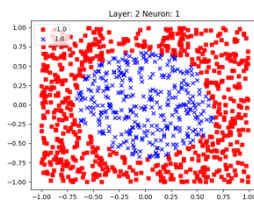
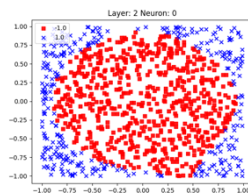
our final result was **96.4%**.

The output of each neuron is as follows (etch point  $\langle x, y \rangle$ , blue = 1, red = -1):

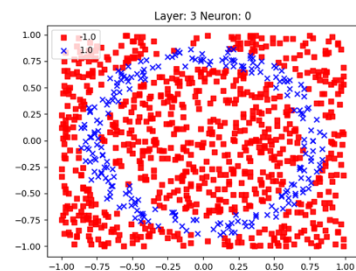
**layer 1**



**layer 2**

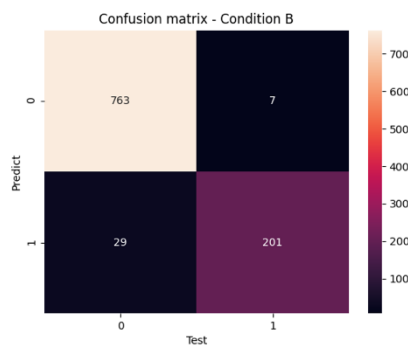
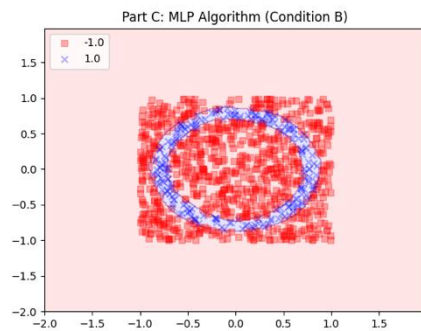


**output layer**

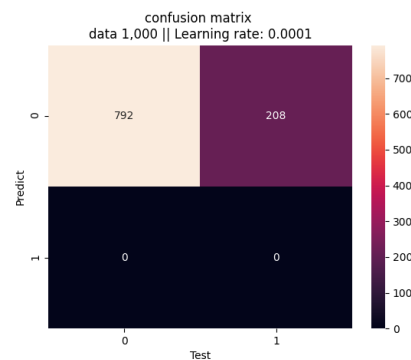
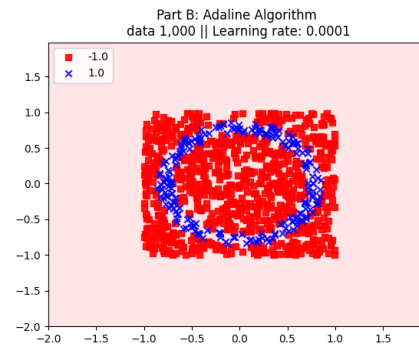


Let's look at the final result of MLP vs Adaline (train and test data), our model prediction is at the back and the 'dots' are the train data:

## MLP



## Adaline



It can be seen that Adaline always predict -1 and he's right at **79.2%**,  
On the other hand, the MLP model succeed to predict the circle almost exactly(!) and he's right at **96.4%**.

(this is the same samples, but we had to make the MLP plot brighter so that the circle could be seen)

### Part D:

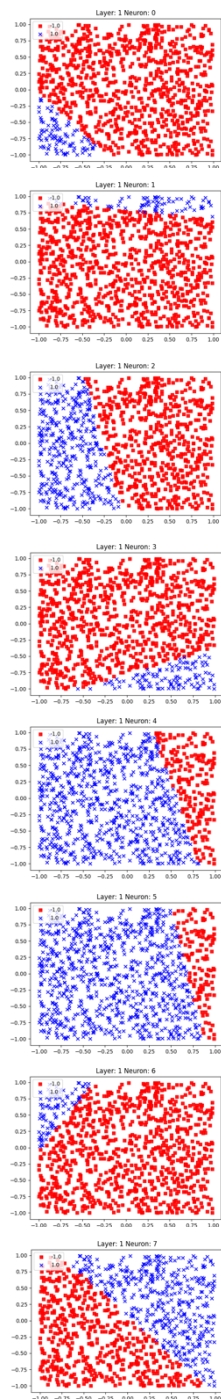
In this part, we will use the trained neurons from the next to last level of Part C as input and only an Adaline for the output. That is, we will give Adaline the output of the neurons from Part C in the level below the output, and train only the Adaline.

Now let's look at the second problem that points have value 1 only if:

$$1/2 \leq x^2 + y^2 \leq 3/4.$$

the output of each neuron is as follow (each point  $\langle x, y \rangle$ , blue = 1, red = -1):

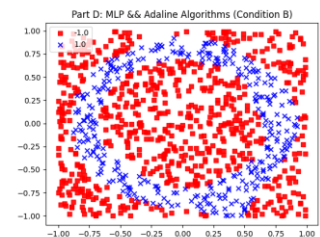
MLP layer 1



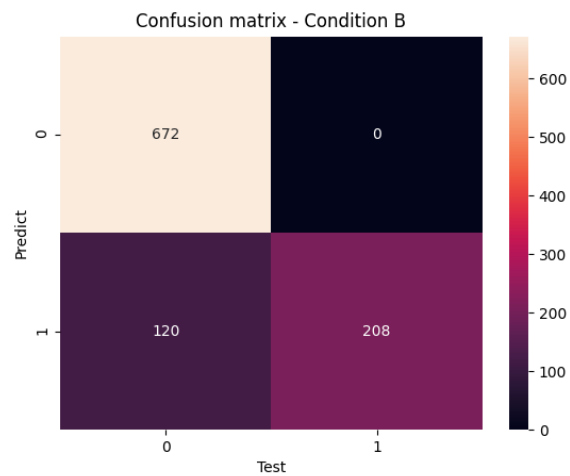
MLP layer 2



ADALINE output layer



Let's look at the final result of the combination between MLP and Adaline Algorithms (train and test data):



It can be seen that Adaline with MLP input predict a better result, and instead of correction of **79.2%** in part C, now we get to correction of **88%**.

Moreover, we can tell that we got a better prediction while using only MLP Algorithm.