

Assignment_1

Batch Perceptron and Online Training Algorithms

Name: Omar Hesham Abdelfatah Muhammed

Code: 1170065

Submitted to: TA, Peter

I. Batch Perceptron Algorithm:

- In this algorithm we have given data x, y where each element in x corresponds to a (-1 or 1) in y , so we start weights and deltas of zeros of the same length to start looping on data to reach zero error which is delta.
- In this algorithm delta is updated in each invalid condition in for loop while weight is updated after finishing each loop (epoch).
- When delta reaches zero the function ends and returns final weights, delta array which is change in weights, weights array and finally epochs count.
- Following figure shows code of this algorithm.

```
def batch_perceptron(x,y,lr=1):
    n = x.shape[1]
    epochs_count = 0
    weights_array = [] #initializing weights array
    delta_array = [] #initializing delta_array which carries weights changes
    #initializing weights with random number from -1 to 1
    weights = np.zeros(n)
    for i in range(0,n):
        weights[i] = random.random()*random.randint(-1,1)

    delta = np.ones(n) #initializing delta with ones to enter while loop
    e = sys.float_info.epsilon
    while (norm(delta,1) > e):
        delta = np.zeros(n) #giving delta zero values at the beginning of each loop
        for i in range(0,len(y)):
            if(y[i]*(weights.dot(x[i])) <= 0): #check condition if they have the same sign or not
                delta = delta - y[i]*x[i]
        delta = delta / len(y)
        delta_array.append(delta)
        weights = weights - (lr * delta) #updating weights by delta
        weights_array.append(weights) #filling weight array with weights updated
        epochs_count = epochs_count + 1 #counting epochs "complete loops"
    return weights,delta_array,weights_array,epochs_count
```

II. Online Training Algorithm:

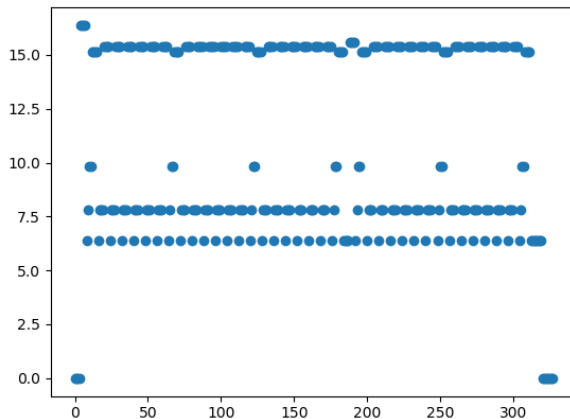
- a) In this algorithm we have given data x, y where each element in x corresponds to a (-1 or 1) in y , so we start weights and deltas of zeros of the same length to start looping on data to reach zero error which is delta.
- b) In this algorithm delta and weight are updated in each invalid condition in for loop.
- c) When delta reaches zero the function ends and returns final weights, delta array which is change in weights, weights array and finally epochs count.
- d) Following figure shows code of this algorithm.

```
def online_training(x,y,lr=1):  
    n = x.shape[1]  
    epochs_count = 0  
    weights_array = []           #initializing weights array  
    delta_array = []           #initializing delta_array which carries weights changes  
    #initializing weights with random number from -1 to 1  
    weights = np.zeros(n)  
    for i in range(0,n):  
        weights[i] = random.random()*random.randint([-1,1])  
  
    delta = np.ones(n)          #initializing delta with ones to enter while loop  
    e = sys.float_info.epsilon  
    while (norm(delta,1) > e):  
        delta = np.zeros(n)     #giving delta zero values at the beginning of each loop  
        for i in range(0,len(y)):  
            if(y[i]*(weights.dot(x[i])) <= 0):           #check condition if they have the same sign or not  
                delta = delta - y[i]*x[i]  
                delta = delta / len(y)  
  
                weights = weights - (lr * delta)         #updating weights by delta  
                weights_array.append(weights)             #filling weight array with weights updated  
                delta_array.append(norm(delta,1))  
  
        epochs_count = epochs_count + 1                 #counting epochs "complete loops"  
    return weights,delta_array,weights_array,epochs_count
```

Problem No.1 output parameters and plots:

a) Online Training:

Delta norm output:

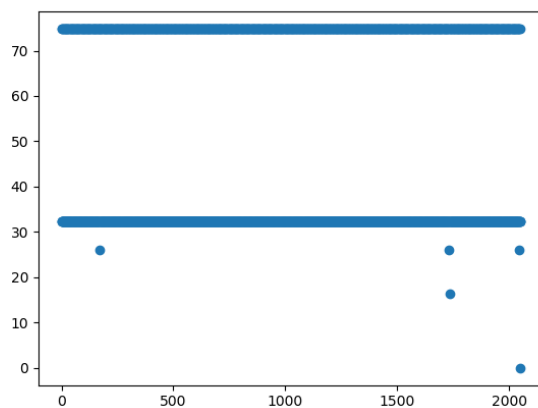


other parameters:

Parameters for online_training method for problem No.1
Number of epochs = 41
Number of times model weights are updated = 122

b) Batch Perceptron:

Delta norm output:



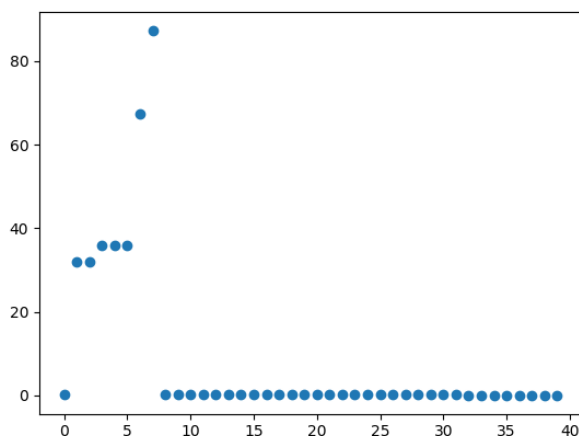
other parameters:

Parameters for batch_perceptron method for problem No.1
Number of epochs = 2053
Number of times model weights are updated = 2053

Problem No.4 output parameters and plots:

a) Online Training:

Delta norm output

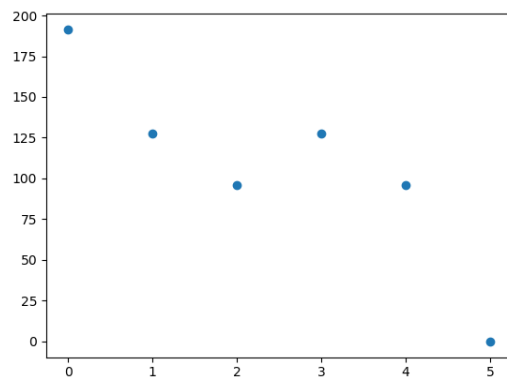


other parameters:

Parameters for online_training method for problem No.4
Number of epochs = 5
Number of times model weights are updated = 8

b) Batch Perceptron

Delta output:



other paramters:

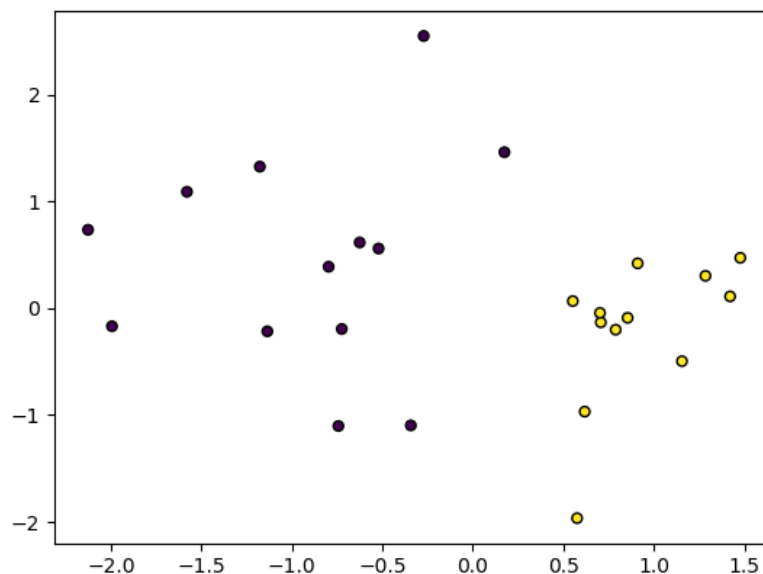
Parameters for online_training method for problem No.4
Number of epochs = 6
Number of times model weights are updated = 6

Make_Classification function:

- This function generates random values for x,y with given number of features for x and (1,-1) values for y to test these random inputs for online training and batch perceptron algorithms

```
x,y = make_classification(25,n_features=2,n_redundant = 0,n_informative=1,n_clusters_per_class=1)
mask_for_y = y == 0
y[mask_for_y] = -1
plt.scatter(x[:,0],x[:,1],marker='o',c=y,s=25,edgecolor='k')
plt.show()
```

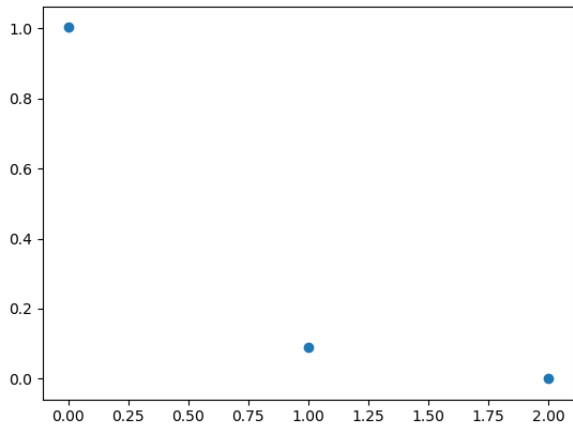
This is the output of plotting these random values



Mask Classifications output parameters and plots:

a) Batch Preceptron:

Delta norm ouput:

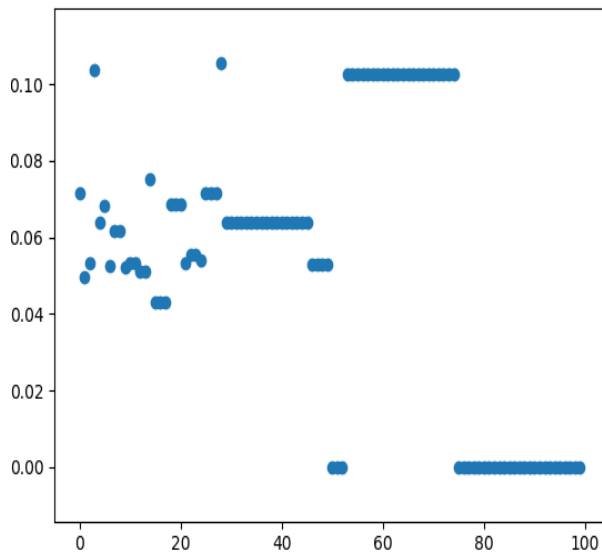


other parameters:

Parameters for batch preceptron method for mask classification
Number of epochs = 3
Number of times model weights are updated = 3

b) Online Training:

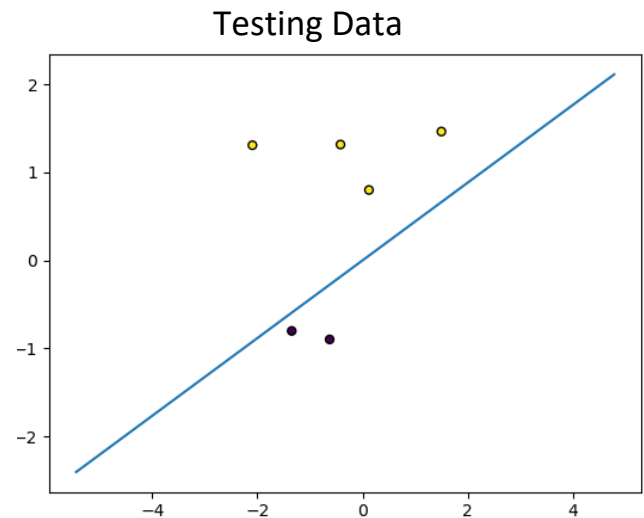
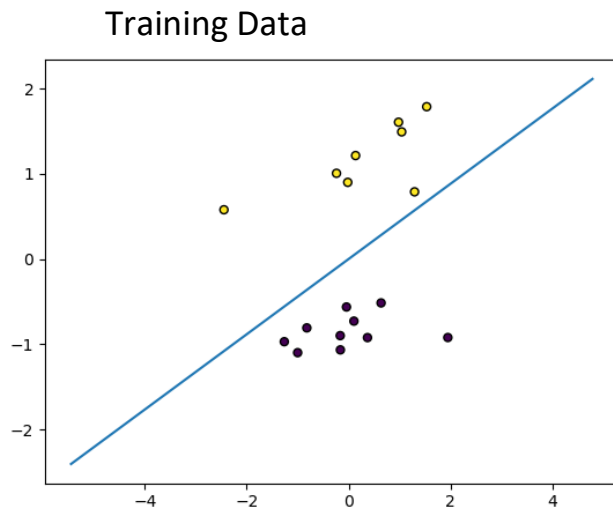
Delta norm output:



other parameters:

Parameters for online training method for mask classification
Number of epochs = 4
Number of times model weights are updated = 22

Visualizing the model on the plot:



Calculating accuracy:

-Following code is how accuracy is calculated:

```
count = 0
for i in range(0, len(x_test)):
    if (y[i+training_len] * (w.dot(x_test[i])) >= 0):
        count = count + 1
accuracy = count / len(x_test)
print("accuracy = " + str(accuracy))
```

- Accuracy in this example was : 50%