

Neural Networks

Homework 4

By:

Monil Shah

mds747

N19510262

```
In [80]: import numpy as np
```

```
In [81]: X = np.asarray([[1, 1], [1, 2], [2, -1], [2, 0], [-1, 2], [-2, 1], [-1, -1],  
y= np.asarray([[-1, -1], [-1, -1], [-1, 1], [-1, 1], [1, -1], [1, -1], [1,
```

Delta Rule

```
In [82]: def hardlim(y_in, train=False):  
    if train:  
        return y_in  
    else:  
        y_out = [[], []]  
        for x in range(len(y_in)):  
            if y_in[x] >= 0:  
                y_out[x] = 1  
            if y_in[x] < 0:  
                y_out[x] = -1  
        return y_out  
  
def yin(x_vec):  
    y_in = np.zeros(bias.shape) + bias  
    for j in range(len(bias)):  
        y_in[j] += np.dot(x_vec, w[j])  
    return y_in
```

Alpha = 0.001

```
In [83]: w=np.zeros(shape=(X.shape[1], y.shape[1]))
bias=np.zeros(shape=y.shape[1])
alpha=0.001
y = y.reshape(y.shape[0],-1)
if y.shape[1] == 1:
    w = w.reshape(1, w.shape[0])
    bias = np.reshape(bias, -1)
for i in range(1,10000):
    for x_vec, y_vec in zip(X, y):
        y_in = yin(x_vec)
        yy = []
        for j in range(len(bias)):
            yy.append(hardlim(y_in[j],train=True))
            w[j] = w[j] - (2*alpha*np.outer(np.subtract(yy[j],y_vec[j]),x_vec[j]))
            bias[j] = bias[j] - (2*alpha*np.subtract(yy[j],y_vec[j]))
```

```
In [84]: print("Weights: \n",w.transpose())
print("Bias: \n",bias)
```

```
Weights:
[[-0.59367939  0.16801311]
 [-0.05095887 -0.6659139 ]]
Bias:
[ 0.01325352  0.1679855 ]
```

```
In [101]: count = 0
target = []
for i in X:
    yy = i.dot(w) + bias
    y_out = hardlim(yy)
    target.append(y_out)
print("Predicted Output: ",target)
```

```
Predicted Output:  [[-1, -1], [-1, -1], [-1, 1], [-1, 1], [1, -1], [1, -1], [1, 1], [1, 1]]
```

```
In [114]: if((y==target).all()):
    print("All inputs classified correctly")
```

```
All inputs classified correctly
```

Alpha = 0.1

```
In [87]: w=np.zeros(shape=(X.shape[1], y.shape[1]))
bias=np.zeros(shape=y.shape[1])
alpha=0.1
y = y.reshape(y.shape[0],-1)
if y.shape[1] == 1:
    w = w.reshape(1, w.shape[0])
    bias = np.reshape(bias, -1)
for i in range(1,10000):
    for x_vec, y_vec in zip(X, y):
        y_in = yin(x_vec)
        yy = []
        for j in range(len(bias)):
            yy.append(hardlim(y_in[j],train=True))
            w[j] = w[j] - (2*alpha*np.outer(np.subtract(yy[j],y_vec[j]),x_vec[j]))
            bias[j] = bias[j] - (2*alpha*np.subtract(yy[j],y_vec[j]))
```

```
In [88]: print("Weights: \n",w.transpose())
print("Bias: \n",bias)
```

```
Weights:
[[-0.39953017  0.35521879]
 [ 0.06679871 -0.60212805]]
Bias:
[ 0.06760018  0.38030401]
```

```
In [102]: count = 0
target = []
for i in X:
    yy = i.dot(w) + bias
    y_out = hardlim(yy)
    target.append(y_out)
print("Predicted Output: ",target)
```

```
Predicted Output:  [[-1, -1], [-1, -1], [-1, 1], [-1, 1], [1, -1], [1, -1], [1, 1], [1, 1]]
```

```
In [105]: if((y==target).all()):
    print("All inputs classified correctly")
```

```
All inputs classified correctly
```

Part 2: Gradually Decreasing alpha

Alpha = 1/Iteration

```
In [91]: w=np.zeros(shape=(X.shape[1], y.shape[1]))
bias=np.zeros(shape=y.shape[1])
y = y.reshape(y.shape[0],-1)
if y.shape[1] == 1:
    w = w.reshape(1, w.shape[0])
    bias = np.reshape(bias, -1)
for i in range(1,10000):
    for x_vec, y_vec in zip(X, y):
        alpha=1/i;
        y_in = yin(x_vec)
        yy = []
        for j in range(len(bias)):
            yy.append(hardlim(y_in[j],train=True))
            w[j] = w[j] - (2*alpha*np.outer(np.subtract(yy[j],y_vec[j]),x_vec[j]))
            bias[j] = bias[j] - (2*alpha*np.subtract(yy[j],y_vec[j]))
```

```
In [97]: print("Weights: \n",w.transpose())
print("Bias: \n",bias)
```

```
Weights:
[[-0.59466015  0.16680423]
 [-0.0521512  -0.66659059]]
Bias:
[ 0.01308995  0.16680646]
```

```
In [103]: count = 0
target = []
for i in X:
    yy = i.dot(w) + bias
    y_out = hardlim(yy)
    target.append(y_out)
print("Predicted Output: ",target)
```

```
Predicted Output:  [[-1, -1], [-1, -1], [-1, 1], [-1, 1], [1, -1], [1, -1], [1, 1], [1, 1]]
```

```
In [104]: if((y==target).all()):
    print("All inputs classified correctly")
```

```
All inputs classified correctly
```

Alpha = alpha*0.9

```
In [111]: alpha=0.1
w=np.zeros(shape=(X.shape[1], y.shape[1]))
bias=np.zeros(shape=y.shape[1])
y = y.reshape(y.shape[0],-1)
if y.shape[1] == 1:
    w = w.reshape(1, w.shape[0])
    bias = np.reshape(bias, -1)
for i in range(1,10000):
    for x_vec, y_vec in zip(X, y):
        alpha=alpha*0.9;
        y_in = yin(x_vec)
        yy = []
        for j in range(len(bias)):
            yy.append(hardlim(y_in[j],train=True))
            w[j] = w[j] - (2*alpha*np.outer(np.subtract(yy[j],y_vec[j]),x_vec[j]))
            bias[j] = bias[j] - (2*alpha*np.subtract(yy[j],y_vec[j]))
print("Weights: \n",w.transpose())
print("Bias: \n",bias)
```

```
Weights:
[[-0.59392236  0.17147829]
 [-0.02947102 -0.64811857]]
Bias:
[-0.04044308  0.16911988]
```

```
In [112]: count = 0
target = []
for i in X:
    yy = i.dot(w) + bias
    y_out = hardlim(yy)
    target.append(y_out)
print("Predicted Output: ",target)
```

```
Predicted Output:  [[-1, -1], [-1, -1], [-1, 1], [-1, 1], [1, -1], [1, -1], [1, 1], [1, 1]]
```

```
In [113]: if((y==target).all()):
    print("All inputs classified correctly")
```

All inputs classified correctly

Comment on the results:

As we can see , we get better results for weight and bias, hence we get less error with value of alpha nearer to zero.

In []:

