

# foundation of machine learning

November 21, 2018

## 1 lab1

## 2 Q1

```
In [ ]: # hebbian learning with signum function.....
import numpy as np
x=np.matrix([[1,-2,1.5,0],[1,-.5,-2,-1.5],[0,1,-1,1.5]])
w0=np.array([1,-1,0,.5])
n=.05
#err =np.matlib.zeros([1,3])
eps=.001
while(1):
    for i in range(0,2):
        net=np.dot(w0,x[i].T)
        y=np.sign(net)
        del_w=n*y*x[1]
        w_nxt=w0+del_w
        err=np.linalg.norm(w_nxt-w0)
        if(err<eps):
            break
    w0=w_nxt
print(w0)
```

## 3 output - the code is not converging

## 4 Q2

```
In [ ]: # hebbian learning with bipolar sigmoidal function
import numpy as np

x=np.matrix([[1,-2,1.5,0],[1,-.5,-2,-1.5],[0,1,-1,1.5]])
w0=np.array([1,-1,0,.5])
n=.05
eps=.0001
while(1):
    for i in range(0,2):
```

```

        net=np.dot(w0,x[i].T)
        y = (2/(1+exp(-net)))-1
        del_w=n*y*x[1]
        w_nxt=w0+del_w
        err=np.linalg.norm(w_nxt-w0)
        if(err<eps):
            break
        w0=w_nxt
print(w0)

```

## 5 output - the code is not converging

## 6 Q3

```

In [11]: # by perceptron learning with noise data.....
import numpy as np
x=np.array([[1,-2,0,-1],[0,-1.5,-0.5,-1.0],[-1,1,0.5,-1]])
d=np.array([[1],[-1],[1]])
w0=np.array([1,-1,0,0.5])
no_data_pts,tmp=np.shape(x)
iteration=0
while(1):
    iteration=iteration+1
    cont=0
    for i in range(0,3):
        net=np.dot(w0,x[i].T)
        y=np.sign(net)
        r=d[i]-y

        w_nxt=w0+r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        if(err<.001):
            cont=cont+1
        w0=w_nxt
    if(cont==no_data_pts):
        break
print(w0)
print('iteration is {}'.format(iteration))
noisy_data=np.array([1,-2,0,-1.5])
y=np.sign(np.dot(w0.T,noisy_data))
noisy_data=np.array([-1,1.2,0.5,-1.2])
y1=np.sign(np.dot(w0.T,noisy_data))

```

```
[-1.  3.  0.  2.5]
iteration is 2
```

## 7 output - it converge in 2 iteration

## 8 Q4

```
In [ ]: #train a neuron in a xy plane by habbain rule.....
import numpy as np

x=np.matrix([[5,10],[1,3],[2,4],[5,1],[1,-3],[2,-4]])
y=np.array([[1],[1],[1],[-1],[-1],[-1]])
w0=np.matrix([1,-1])
n=.05
#err =np.matlib.zeros([1,3])
eps=.001
while(1):
    cnt=0
    for i in range(0,2):
        net=np.dot(w0,x[i].T)
        y=np.sign(net)
        del_w=n*y*x[i]
        w_nxt=w0+del_w
        err=np.linalg.norm(w_nxt-w0)
        if(err<eps):
            cnt=cnt+1
            w0=w_nxt
    if(cnt==2):
        break

print(w0)
```

## 9 the code is not converging

```
In [ ]: # train the neuron by perceptron rule .....
import numpy as np
x=np.matrix([[5,10],[1,3],[2,4],[5,1],[1,-3],[2,-4]])
d=np.array([[1],[1],[1],[-1],[-1],[-1]])
w0=np.matrix([1,-1])
no_data_pts,tmp=np.shape(x)
iteration=0
n=1
while(1):
    iteration=iteration+1
    cont=0
```

```

    for i in range(0,no_data_pts):
        net=np.dot(w0,x[i].T)
        y=np.sign(net)
        r=d[i]-y

        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        if(err<.001):
            cont=cont+1
        w0=w_nxt
    if(cont==no_data_pts):
        break
print(w0)
print('number of iteration is {}'.format(iteration))

```

10 OUTPUT= W0=[[-9 15]

11 number of iteration is 3

12 lab 2

13 Q1

In [ ]: *#single discrete perceptron training algorithm keeping eta=1*  
import numpy as np

```

x=np.matrix([[0.8,0.5,0],[0.9,0.7,0.3],[1,0.8,0.5],[0,0.2,0.3],[0.2,0.1,1.3],[0.2,0.7,0.3],[0.2,0.7,0.3],[0.2,0.7,0.3],[0.2,0.7,0.3],[0.2,0.7,0.3]])
d=np.array([[1],[1],[1],[-1],[-1],[-1]])
w0=np.array([0,0,0])
no_data_pts,tmp=np.shape(x)
iteration=0
n=1# ete=1
while(1):
    iteration=iteration+1
    cont=0
    for i in range(0,no_data_pts):
        net=np.dot(w0,x[i].T)
        y=np.sign(net)
        r=d[i]-y

        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        if(err<.001):
            cont=cont+1

```

```

        w0=w_nxt
    if(cont==no_data_pts):
        break
print(w0)
print(iteration)

```

**14 output**

**15 W0=[[ 0.8 0.1 -0.6]]**

**16 number of iteration=12**

**17 Q2**

In [ ]: *#delta learning rule for a single contineous perceptron.....*

```

import numpy as np
x=np.matrix([[0.8,0.5,0],[0.9,0.7,0.3],[1,0.8,0.5],[0,0.2,0.3],[0.2,0.1,1.3],[0.2,0.7,0.3]])
d=np.array([[1],[1],[1],[-1],[-1],[-1]])
w0=np.array([0,0,0])
no_data_pts,tmp=np.shape(x)
iteration=0
n=.001#eta=.001
while(1):
    iteration=iteration+1
    cont=0
    for i in range(0,no_data_pts):
        net=np.dot(w0,x[i].T)
        y=1/(1+np.exp(-net))
        dy=0.5*(1-y**2)
        r=d[i]-y

        w_nxt=w0+n*r*dy*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        if(err<.001):
            cont=cont+1
            w0=w_nxt/np.linalg.norm(w_nxt)
    if(cont==no_data_pts):
        break
print(w0)
print(iteration)

```

18 output is = w0=[[ 0.84816134 0.52973658 -0.00122033]]

19 number of iteration is 6

20 Q3

In [ ]: *#WIDROW-HOFF LEARNING ALGORITHM.....*

```
import numpy as np
x=np.matrix([[1,2],[1,-1],[-1,2],[-2,-1]])
d=np.array([-1],[1],[1],[-1]))
w0=np.array([0.1,-0.3])
no_data_pts,tmp=np.shape(x)
n=0.001
iteration=0
while(1):

    cnt=0
    for i in range(0,no_data_pts):
        iteration=iteration+1
        net=np.dot(w0,x[i].T)
        r=d[i]-net
        w0_nxt=w0+n*r*x[i]
        tmp=w0_nxt-w0
        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w0_nxt/np.linalg.norm(w0_nxt)
    if(cnt==no_data_pts):
        break
print(w0)
print(iteration)
```

21 output is w0=[[ 0.70574373 -0.70846721]]

22 number of iteration is 4

23 LAB 3

24 q1- AND operation

In [1]: *#and operation bipolar input by perceptron learning*

```
import numpy as np
x=np.matrix([[1,1],[1,-1],[-1,1],[-1,-1]])
d=np.array([1],[-1],[-1],[-1]))
```

```

w0=np.array([0.5,-0.5])
n=.002
iteration=0
col,tmp=np.shape(x)
while(1):
    cnt=0
    for i in range(0,col):
        iteration=iteration+1
        net=np.dot(w0,x[i].T)
        y=1/(1+np.exp(-net))
        r=d[i]-y
        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w_nxt/np.linalg.norm(w_nxt)
    if(cnt==col):
        break
print(w0)
print(iteration)

```

```

0.0014142135623730963
0.00510369660012198
0.0033815847870624803
0.0042406372076714705
[[ 0.71150818 -0.70267782]]
4

```

In [2]: *#AND operation by signum function using widrow-hoff learning rule*

```

import numpy as np
x=np.matrix([[1,1],[1,-1],[-1,1],[-1,-1]])
d=np.array([[1],[-1],[-1],[-1]])
w0=np.array([0.5,-0.5])
n=.002
iteration=0
col,tmp=np.shape(x)
while(1):
    cnt=0
    for i in range(0,col):
        iteration=iteration+1
        net=np.dot(w0,x[i].T)
        r=d[i]-net
        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0

```

```

        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w_nxt/np.linalg.norm(w_nxt)
            if(cnt==col):
                break
        print(w0)
        print(iteration)

0.0028284271247461927
0.006828395125130148
0.0011715404341103351
0.0028122983536799876
[[ 0.71192993 -0.70225051]]
4

```

In [4]: *#input AND operation using signum function done by perceptron learning*

```

import numpy as np
x=np.matrix([[1,1],[1,-1],[-1,1],[-1,-1]])
d=np.array([[1],[-1],[-1],[-1]])
w0=np.array([0.5,-0.5])
n=.002
iteration=0
col,tmp=np.shape(x)
while(1):
    cnt=0
    for i in range(0,col):
        iteration=iteration+1
        net=np.dot(w0,x[i].T)
        y=np.sign(net)
        r=d[i]-y
        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w_nxt/np.linalg.norm(w_nxt)
            if(cnt==col):
                break
    print(w0)
    print(iteration)

```

0.0028284271247461927



```

0.005656854249492385
0.0
0.0
[[ 0.70994556 -0.70425656]]
4

```

## 25 OR operation

In [5]: *#OR operation bipolar input by perceptron learning*

```

import numpy as np
x=np.matrix([[1,1],[1,-1],[-1,1],[-1,-1]])
d=np.array([1],[1],[1],[-1]))
w0=np.array([0.5,-0.5])
n=.004
iteration=0
col,tmp=np.shape(x)
while(1):
    cnt=0
    for i in range(0,col):
        iteration=iteration+1
        net=np.dot(w0,x[i].T)
        y=1/(1+np.exp(-net))
        r=d[i]-y
        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w_nxt/np.linalg.norm(w_nxt)
    if(cnt==col):
        break
print(w0)
print(iteration)

```

```

0.0028284271247461927
0.0011063228501433527
0.004550531421590335
0.008477253770786631
[[ 0.71588352 -0.69821972]]
4

```

In [6]: *#or operation bipolar input by widrow-hoff learning*

```

import numpy as np
x=np.matrix([[1,1],[1,-1],[-1,1],[-1,-1]])

```

```

d=np.array([[1],[1],[1],[-1]])
w0=np.array([0.5,-0.5])
n=.002
iteration=0
col,tmp=np.shape(x)
while(1):
    cnt=0
    for i in range(0,col):
        iteration=iteration+1
        net=np.dot(w0,x[i].T)

        r=d[i]-net
        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w_nxt/np.linalg.norm(w_nxt)
    if(cnt==col):
        break
print(w0)
print(iteration)

```

```

0.0028284271247461927
0.0011715408756377626
0.0068283950500208496
0.002812298353674021
[[ 0.71192993 -0.70225051]]
4

```

## 26 xor operation

In [7]: *#xor operation bipolar input by perceptron learning*

```

import numpy as np
x=np.matrix([[1,1],[1,-1],[-1,1],[-1,-1]])
d=np.array([[1],[1],[1],[-1]])
w0=np.array([0.5,-0.5])
n=.004
iteration=0
col,tmp=np.shape(x)
while(1):
    cnt=0
    for i in range(0,col):
        iteration=iteration+1

```

```

        net=np.dot(w0,x[i].T)
        y=1/(1+np.exp(-net))
        r=d[i]-y
        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w_nxt/np.linalg.norm(w_nxt)
        if(cnt==col):
            break
    print(w0)
    print(iteration)

0.008485281374238578
0.0011064033924073154
0.004550451057256001
0.008509362117028373
[[ 0.7046052  -0.70959954]]
4

```

In [9]: *#xor operation bipolar input by widrow-hoff learning rule*

```

import numpy as np
x=np.matrix([[1,1],[1,-1],[-1,1],[-1,-1]])
d=np.array([[1],[1],[1],[-1]])
w0=np.array([0.5,-0.5])
n=.002
iteration=0
col,tmp=np.shape(x)
while(1):
    cnt=0
    for i in range(0,col):
        iteration=iteration+1
        net=np.dot(w0,x[i].T)

        r=d[i]-net
        w_nxt=w0+n*r*x[i]
        tmp=w_nxt-w0
        err=np.linalg.norm(tmp)
        print(err)
        if err<10**-2:

            cnt=cnt+1
            w0=w_nxt/np.linalg.norm(w_nxt)
    if(cnt==col):

```

```

        break
    print(w0)
    print(iteration)

0.0028284271247461927
0.0011715408756377626
0.0068283950500208496
0.0028445558958183643
[[ 0.70626649 -0.70794607]]
4

```

## 27 lab- 6

```

In [10]: #lab=6.....
import numpy as np
my_data=np.array(('heli.csv','plane.csv','tank.csv'))
w=np.zeros((144,144))
image=[]
for i in range(0,3):
    data=np.genfromtxt(my_data[i],delimiter=",")
    tmp=data.flatten()
    pattern=np.matrix(tmp)
    image.append(pattern)
    tmp=np.outer(pattern,pattern)
    w=w+tmp

#Recall equation
data=np.genfromtxt('testdata.csv',delimiter=",")
input_pattern=data.flatten()
no_clm=np.shape(input_pattern)[0]
tmp1=np.matmul(input_pattern,w)
y=np.sign(tmp1)
for i in range(0,no_clm):
    if (y[i]==0):
        y[i]=input[i]
dist_list=[]
for i in range(0,3):
    sub=abs(y-image[i])
    dist=np.sum(sub)
    dist_list.append(dist)
indx=dist_list.index(min(dist_list))
print(indx)

```

## 28 output is helicopter

## 29 lab 5

```
In [11]: # lab=5.....
import numpy as np
#filename=np.array(('zero.csv','one.csv','two.csv','three.csv','four.csv','five.csv',
my_data=np.array(('four.csv','five.csv','six.csv','seven.csv','eight.csv','nine.csv'))
w=np.zeros((35,35))
input_pattern=np.zeros((10,35))
n=6
img_arr=[]
for i in range(0,n):
    data=np.genfromtxt(my_data[i],delimiter=",")

    tmp=data.flatten()
    input_pattern[i]=tmp
    pattern=np.matrix(tmp)
    img_arr.append(pattern)
    tmp=np.outer(pattern,pattern)
    w=w+tmp
    #Recall equation
for k in range (0,n):
    no_clm=np.shape(input_pattern[k])[0]
    tmp1=np.matmul(input_pattern[k],w)
    y1=np.sign(tmp1)
    for i in range(0,no_clm):
        if (y1[i]==0):
            y1[i]=input[i]

    dist_list=[]
    for i in range(0,n):
        sub=abs(y1-img_arr[i])
        dist=np.sum(sub)
        dist_list.append(dist)
    indx=dist_list.index(min(dist_list))
    print(indx)
```

0  
1  
2  
3  
4  
5

```
In [13]: import numpy as np
w=np.zeros((70,70))
```

```

img=[]
input_pattern=np.zeros((5,70))
my_data=np.array(('A.csv','B.csv','C.csv','D.csv','E.csv'))
for i in range(0,5):
    data=np.genfromtxt(my_data[i],delimiter=",")

    tmp=data.flatten()
    input_pattern[i]=tmp
    pattern=np.matrix(tmp)
    img.append(pattern)
    tmp=np.outer(pattern,pattern)
    w=w+tmp
#Recall
for k in range (0,5):
    x=np.shape(input_pattern[k])[0]
    mem=np.matmul(input_pattern[k],w)
    y=np.sign(mem)
    for i in range(0,x):
        if (y[i]==0):
            y[i]=input_pattern[k][i]

    dist_list=[]
    for i in range(0,5):
        diff=np.abs(y[i]-img[i])
        dist=np.sum(diff)
        dist_list.append(dist)
    indx=dist_list.index(min(dist_list))
    print(indx)

```

3  
3  
3  
3  
3

**30 OUTPUT =index is 3**

**31 lab 8**

**32 Q1**

```

In [12]: import numpy as np
         w=np.zeros((144,120))

         A_vector=[]
         B_vector=[]

```

```

a=np.array(('heli.csv','plane.csv','tank.csv'))
b=np.array(('three.csv','one.csv','two.csv'))

for i in range(0,3):
    data_a=np.genfromtxt(a[i],delimiter=",")
    data_b=np.genfromtxt(b[i],delimiter=",")
    tmp=data_a.flatten()
    pattern_a=np.array(tmp)
    A_vector.append(pattern_a)
    tmp2=data_b.flatten()
    pattern_b=np.array(tmp2)
    B_vector.append(pattern_b)
    tmp=np.outer(pattern_a,pattern_b)
    w=w+tmp

#Recall equation
data=np.genfromtxt('testdata.csv',delimiter=",")
x=data.flatten()
tmp1=np.matmul(x,w)
new_B=np.sign(tmp1)
new_B[new_B==0] = 1
first_time=0
iteration=0
limit_pts=[]
while(1):
    iteration=iteration +1
    for i in range (0,3):
        if(new_B==B_vector[i]).all():
            print("Value corresponding to pattern index - :",i)
            break
    if(first_time !=0):
        if any((new_B == x).all() for x in limit_pts):
            #print('Limit pt...')
            break
    else:
        first_time=1
        limit_pts.append(new_B)
        tmp2=np.matmul(new_B,w.T)
        update_A=np.sign(tmp2)
        update_A[update_A==0] = x[update_A==0]
        new_A=update_A
        tmp1=np.matmul(new_A,w)
        B=new_B
        new_B=np.sign(tmp1)
        new_B[new_B==0] = B[new_B==0]
print(iteration)

```

-----

ValueError

Traceback (most recent call last)

```
<ipython-input-12-34ed4fb628e0> in <module>()
    17     B_vector.append(pattern_b)
    18     tmp=np.outer(pattern_a,pattern_b)
--> 19     w=w+tmp
    20
    21 #Recall equation
```

ValueError: operands could not be broadcast together with shapes (144,120) (144,35)

Value corresponding to pattern index - : 1 Value corresponding to pattern index - : 1

### 33 Q2

In [7]: `import numpy as np`

```
weight_vector=np.zeros((5,4))
A_vector=[]
B_vector=[]
```

```
def compute_hamming_dist(u,v):
    tmp=abs(u-v)
    dist=np.sum(tmp)
    return dist
```

```
def transfer_func(weight_vector,input):
    global A_vector,B_vector
    limit_pts=[]
    new_A=input

    tmp1=np.matmul(input,weight_vector)
    new_B=np.sign(tmp1)
    new_B[new_B==0] = -1
    first_time=0
    iteration=0
    while(1):
        for i in range (0,2):
            if(new_B==B_vector[i]).all():
                print("Value corresponding to pattern - :",i)
                print("iterations=",iteration)
                print("hamind dist from 0-",compute_hamming_dist(new_B,B_vector[0]))
```



```

        print("hammind dist from 1-",compute_hamming_dist(new_B,B_vector[1]))
        return
    if(first_time !=0):
        if any((new_B == x).all() for x in limit_pts):
            print("iterations=",iteration)
            print('Limit pt...')
            print("hammind dist from 0-",compute_hamming_dist(new_B,B_vector[0]))
            print("hammind dist from 1-",compute_hamming_dist(new_B,B_vector[1]))
            return
        else:
            first_time=1
            limit_pts.append(new_B)
            tmp2=np.matmul(new_B,weight_vector.T)
            update_A=np.sign(tmp2)
            update_A[update_A==0] = new_A[update_A==0]
            new_A=update_A
            tmp1=np.matmul(new_A,weight_vector)
            B=new_B
            new_B=np.sign(tmp1)
            new_B[new_B==0] = B[new_B==0]
            iteration=iteration +1

a1 = np.matrix([0, 1, 0, 1, 0])
a2 = np.matrix([1, 1, 0, 0, 0])
b1 = np.matrix([1, 0, 0, 1])
b2 = np.matrix([0, 1, 0, 1])
a1[a1 == 0] = -1
a2[a2 == 0] = -1
b1[b1 == 0] = -1
b2[b2 == 0] = -1
A_vector.append(a1)
B_vector.append(b1)
tmp=np.outer(a1,b1)
weight_vector=weight_vector+tmp
A_vector.append(a2)
B_vector.append(b2)
tmp=np.outer(a2,b2)
weight_vector=weight_vector+tmp

input_pattern=np.array([-1,1,1,1,-1])

transfer_func(weight_vector,input_pattern)

input_pattern=np.array([-1,-1,1,1,-1])

transfer_func(weight_vector,input_pattern)

```

```

Value corresponding to pattern - : 0
iterations= 0
hammind dist from 0- 0.0
hammind dist from 1- 4.0
iterations= 1
Limit pt...
hammind dist from 0- 4.0
hammind dist from 1- 8.0

```

## 34 LAB 9

```
In [8]: import numpy as np
```

```

weight_vector=np.zeros((15,10))

A_vector=[]
B_vector=[]

def transfer_func(weight_vector,input):
    global A_vector,B_vector
    limit_pts=[]
    new_A=input

    tmp1=np.matmul(input,weight_vector)
    new_B=np.sign(tmp1)
    new_B[new_B==0] = 1
    first_time=0
    iteration=1
    while(1):
        for i in range (0,4):
            if(new_B==B_vector[i]).all():
                print("Value corresponding to pattern index - :",i)
                print("Number of iterations",iteration)
                return
        if(first_time !=0):
            if any((new_B == x).all() for x in limit_pts):
                print('Limit pt...')
                print("Number of iterations",iteration)
                return
        else:
            first_time=1
    limit_pts.append(new_B)
    tmp2=np.matmul(new_B,weight_vector.T)
    update_A=np.sign(tmp2)

```

```

update_A[update_A==0] = new_A[update_A==0]
new_A=update_A
tmp1=np.matmul(new_A,weight_vector)
B=new_B
new_B=np.sign(tmp1)
new_B[new_B==0] = B[new_B==0]
iteration=iteration +1

data_a=np.genfromtxt('input_data.csv',delimiter=",")
data_b=np.genfromtxt('output_data.csv',delimiter=",")
for i in range (0,4):
    A_vector.append(data_a[i])
    B_vector.append(data_b[i])
    tmp=np.outer(data_a[i],data_b[i])
    weight_vector=weight_vector+tmp

input_pattern=np.array([-1,-1,-1,-1,-1,-1,-1,-1,-1,-1,-1,-1,-1,-1,-1])
transfer_func(weight_vector,input_pattern)

```

Limit pt...

Number of iterations 3