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## A. Design a simple linear neural network.

```
#include<iostream.h>
#include <conio.h>
void main()
{ clrscr();
cout<<"Name: Kimberly Moniz \n Roll No: 21 \n";
cout<<"\n Create a simple linear neural network.";</pre>
float x,bias,weight,Yin,out;
cout<<"\nEnter the input X : "; cin>>x;
cout<<"\nEnter the bias : "; cin>>bias;
cout<<"\nEnter the weight W = "; cin>>weight;
Yin = (bias + (x*weight ));
cout<<"\n Yin = bias + x*weight "<<"\n Yin = "<<Yin;</pre>
if(Yin<0) out=0;
else if((Yin>=0) && (Yin<1)) out=Yin;
else out=1;
cout<<"\nY = "<<out;
getch();
}
```

```
DOSBox 0.74, Cpu speed: max 100%

Name: Kimberly Moniz
Roll No: 21

Create a simple linear neural network.
Enter the input X: 0.2

Enter the bias: -0.4

Enter the weight W = .3

Yin = bias + x*weight
Yin = -0.34
Y = 0_
```

```
DOSBox 0.74, Cpu speed: max 100%

Name: Kimberly Moniz
Roll No: 21

Create a simple linear neural network.
Enter the input X: 0.2

Enter the bias: 0.3

Enter the weight W = 0.8

Yin = bias + x*weight
Yin = 0.46
Y = 0.46_
```

```
DOSBox 0.74, Cpu speed: max 100%

Name: Kimberly Moniz

Roll No: 21

Create a simple linear neural network.

Enter the input X: 0.9

Enter the bias: 1

Enter the weight W = .45

Yin = bias + x*weight

Yin = 1.405

Y = 1_
```

## A neural network for multiple inputs.

#### Code:

```
print("Name : Kimberly Moniz")
print("Roll No : 21")
n=int(input("Enter the number of inputs : "))
yin=0
for i in range(n):
    x=float(input("Enter x : "))
    w=float(input("Enter weight : "))
    yin=yin + x*w

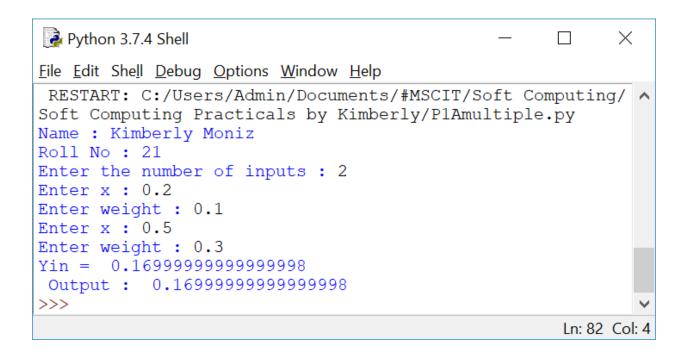
print("Yin = ", yin)

if(yin<0): output=0
elif (yin>1): output=1
else : output=yin

print (" Output : " , output)
```

```
Python 3.7.4 Shell
                                                     Х
<u>File Edit Shell Debug Options Window Help</u>
RESTART: C:/Users/Admin/Documents/#MSCIT/Soft Computing/ ^
Soft Computing Practicals by Kimberly/P1Amultiple.py
Name : Kimberly Moniz
Roll No : 21
Enter the number of inputs: 3
Enter x : 0.3
Enter weight: 0.7
Enter x : 0.2
Enter weight: 0.9
Enter x : 0.1
Enter weight: 0.4
Yin = 0.430000000000000005
 Output: 0.4300000000000005
                                                     Ln: 82 Col: 4
```

```
Python 3.7.4 Shell
                                                    X
File Edit Shell Debug Options Window Help
RESTART: C:/Users/Admin/Documents/#MSCIT/Soft Computing/ ^
Soft Computing Practicals by Kimberly/P1Amultiple.py
Name : Kimberly Moniz
Roll No : 21
Enter the number of inputs: 2
Enter x : -5
Enter weight: 4
Enter x : 7
Enter weight: 2
Yin = -6.0
Output: 0
>>>
                                                    Ln: 71 Col: 4
```



# B. Calculate the output of neural net using both binary and bipolar sigmoidal function.

#### Code:

```
import math
print("Name : Kimberly Moniz ")
print("Roll No : 21")
n=int(input("Enter number of elements : "))
yin=0
for i in range(0,n):
    x=float(input("X = "))
    w=float(input("W = "))
    b=float(input("B = "))
    yin = yin + x*w +b

print("Yin" , yin)
binary_sigmoidal = (1 / (1 + (math.e**(-yin))))
print("Binary Sigmoidal = " , round(binary_sigmoidal,3))
bipolar_sigmoidal = (2 / (1 + (math.e**(-yin))))+1
print("Bipolar Sigmoidal = " , round(bipolar_sigmoidal,3))
```

```
Х
Python 3.7.4 Shell
                                                      <u>File Edit Shell Debug Options Window Help</u>
RESTART: C:/Users/Admin/Documents/#MSCIT/Soft Computing/
Soft Computing Practicals by Kimberly/P1B.py
Name : Kimberly Moniz
Roll No : 21
Enter number of elements: 2
X = 0.2
W = 0.5
B = 0.34
X = 0.8
W = 0.4
B = 0.6
Yin 1.36
Binary Sigmoidal = 0.796
Bipolar Sigmoidal = 2.592
                                                       Ln: 17 Col: 4
```

## A] Generate AND/NOT function using McCulloch-Pitts neural net.

```
Code:
print("Kimberly Moniz")
print("Roll No: 21")
print("AND NOT function using Mc Culloch Pitts")
print("Enter 4 binary inputs.");
               x2inputs=[]
x1inputs=[]
c=input("Press 1 to enter input values or press enter to use default values.")
if(c=="1"):
  for i in range(0,4):
    x1=int(input("Enter x1:"))
    x1inputs.append(x1)
    x2=int(input("Enter x2:"))
    x2inputs.append(x2)
else:
  x1inputs=[1,1,0,0]
                                x2inputs=[1,0,1,0]
print("Considering all weights as excitatory.");
w1 = [1,1,1,1]
                      w2 = [1,1,1,1]
                                             y=[]
for i in range(0,4): y.append(x1inputs[i]*w1[i] + x2inputs[i]*w2[i])
print("x1", " x2", " y")
for i in range(0,4): print(x1inputs[i]," ",x2inputs[i]," ",y[i])
print("Considering one weight as excitatory and other as inhibitory.");
w1 = [1,1,1,1]
                      w2 = [-1, -1, -1, -1]
                                             y=[]
for i in range(0,4): y.append(x1inputs[i]*w1[i] + x2inputs[i]*w2[i])
print("x1", " x2 ", "y")
for i in range(0,4): print(x1inputs[i]," ",x2inputs[i]," ",y[i])
print("Applying Threshold = 1")
Y=[]
for i in range(0,4):
  if(y[i]>=1):
    value=1
    Y.append(value)
  else:
    value=0
    Y.append(value)
print("x1 ", "x2 ", "Y")
for i in range(0,4): print(x1inputs[i]," ", x2inputs[i]," ",Y[i])
```

```
Python 3.7.4 Shell
                                                         \times
                                                   <u>File Edit Shell Debug Options Window Help</u>
RESTART: C:\Users\Admin\Documents\#MSCIT\Soft Computing\ ^
Soft Computing Practicals by Kimberly\P2A.py
Kimberly Moniz
Roll No : 21
AND NOT function using Mc Culloch Pitts
Enter 4 binary inputs.
Press 1 to enter input values or
press enter to use default values.
Considering all weights as excitatory.
x1 x2
1
   1
        2
1
   0
       1
0
   1
        1
0
   0
        0
Considering one weight as excitatory and other as
inhibitory.
x1 x2
       У
   1
        0
1
1
   0
       1
0
   1 -1
0
   0
        0
Applying Threshold = 1
x1 x2
1
   1
       0
1
    0
       1
0
   1
       0
    0
        0
>>>
                                                   Ln: 133 Col: 4
```

# B] Generate XOR function using McCulloch-Pitts neural net.

```
Code:
print("Name : Kimberly Moniz")
                                     print("Roll No: 21")
print("XOR function using Mc-Culloch Pitts neuron")
                                                            print()
print("Enter 4 binary inputs.");
x1inputs=[]
             x2inputs=[]
c=input("Press 1 to enter inputs or Enter to use default inputs.")
if(c=="1"):
  for i in range(0,4):
       x1=int(input("Enter x1:"))
                                            x1inputs.append(x1)
       x2=int(input("Enter x2:"))
                                            x2inputs.append(x2)
else:
  x1inputs=[1,1,0,0]
                         x2inputs=[1,0,1,0]
print("Calculating z1 = x1 x2"")
print("Considering one weight as excitatory and other as inhibitory.");
                      w2 = [-1, -1, -1, -1]
w1 = [1,1,1,1]
                                             z1=[]
for i in range(0,4): z1.append(x1inputs[i]*w1[i] + x2inputs[i]*w2[i])
print("x1 ", "x2 ", "z1")
for i in range(0,4): print(x1inputs[i]," ", x2inputs[i]," ", z1[i])
print("Calculating z2 = x1' x2")
print("Considering one weight as excitatory and other as inhibitory.");
                     w2 = [1,1,1,1] z2=[]
w1 = [-1, -1, -1, -1]
for i in range(0,4): z2.append(x1inputs[i]*w1[i] + x2inputs[i]*w2[i])
print("x1 ", "x2 ", "z2")
for i in range(0,4): print(x1inputs[i],"", x2inputs[i],"", z2[i])
print("Applying Threshold=1 for z1 and z2")
for i in range(0,4):
  if(z1[i]>=1):
                   z1[i]=1
  else:
            z1[i]=0
  if(z2[i]>=1):
                   z2[i]=1
            z2[i]=0
  else:
print("z1 ","z2")
for i in range(0,4): print(z1[i]," ", z2[i])
y = [] v1=1 v2=1
for i in range(0,4): y.append(z1[i]*v1 + z2[i]*v2)
print("x1", "x2", " y")
for i in range(0,4): print(x1inputs[i],"", x2inputs[i],"", y[i])
```

```
Python 3.7.4 Shell
                                                    \times
<u>File Edit Shell Debug Options Window Help</u>
RESTART: C:\Users\Admin\Documents\#MSCIT\Soft Computing\ ^
Soft Computing Practicals by Kimberly\P2B.py
Name : Kimberly Moniz
Roll No : 21
XOR function using Mc-Culloch Pitts neuron
Enter 4 binary inputs.
Press 1 to enter inputs or Enter to use default inputs.
Calculating z1 = x1 x2
Considering one weight as excitatory and other as inhibit
ory.
x1 x2 z1
1
   1
        0
1
    0
       1
0
    1
       -1
    0
        0
Calculating z2 = x1' x2
Considering one weight as excitatory and other as inhibit
ory.
x1 x2 z2
1
   1
       0
1
    0
       -1
0
    1
        1
Applying Threshold=1 for z1 and z2
z1 z2
0
   0
1
    0
0
    1
0
   0
x1 x2 y
1
    1
        0
1
    0
       1
0
    1
       - 1
0
    0
       0
>>>
                                                    Ln: 791 Col: 4
```

# A] Implement Hebb Rule

```
print("Name : Kimberly Moniz")
print("Roll No: 21")
print("Enter 4 binary training pairs")
w1=[0,0,0,0]
w2=[0,0,0,0]
for m in range(0,4):
  print("Enter 4 binary input values")
  s=[]
  t=[]
for i in range(0,4):
     x=int(input())
     s.append(x)
  print("Enter 2 binary target values")
  for i in range(0,2):
     y=int(input())
     t.append(y)
  print("s= ",s)
  print("t= ",t)
  w1new=[]
  for i in range(0,4):
     newweight1=w1[i] + s[i]*t[0]
     w1new.append(newweight1)
 "print new weights"
  for i in range(0,4):
     print("w",(i+1),"1 = ",w1new[i])
  w2new=[]
```

```
for i in range(0,4):
    newweight2=w2[i] + s[i]*t[1]
    w2new.append(newweight2)

for i in range(0,4):
    print("w",(i+1),"2 = ",w2new[i])

w1=w1new
    w2=w2new
    print(w1)
    print(w2)

print("The final weight matrix is : ")
print("W = ")
for i in range(0,4):
    print(w1[i] , w2[i])
```

```
Python 3.7.4 Shell - C:/Users/Admin/Documents/#MSCIT/...
                                                              X
                                                       <u>File Edit Shell Debug Options Window Help</u>
>>>
RESTART: C:\Users\Admin\Documents\#MSCIT\Soft Computing\
Soft Computing Practicals by Kimberly\P3A.py
Name : Kimberly Moniz
Roll No : 21
Enter 4 binary training pairs
Enter 4 binary input values
1
0
1
Enter 2 binary target values
0
s = [1, 0, 1, 0]
t= [1, 0]
w 1 1 =
         1
w 2 1 = 0
w \ 3 \ 1 = 1
w \ 4 \ 1 = 0
w 1 2 = 0
w 2 2 = 0
w \ 3 \ 2 = 0
w \ 4 \ 2 = 0
[1, 0, 1, 0]
[0, 0, 0, 0]
Enter 4 binary input values
1
0
0
Enter 2 binary target values
1
s=[1, 0, 0, 1]
t = [1, 0]
w \ 1 \ 1 = 2
w 2 1 = 0
w \ 3 \ 1 = 1
w \ 4 \ 1 = 1
                                                        Ln: 16 Col: 0
```

```
Python 3.7.4 Shell - C:/Users/Admin/Documents/#MSCIT/...
                                                                X
                                                         <u>File Edit Shell Debug Options Window Help</u>
Enter 2 binary target values
1
0
s= [1, 0, 0, 1]
t = [1, 0]
w \ 1 \ 1 =
         2
w 2 1 = 0
w \ 3 \ 1 = 1
w \ 4 \ 1 = 1
w 1 2 = 0
w 2 2 = 0
w \ 3 \ 2 = 0
w \ 4 \ 2 = 0
[2, 0, 1, 1]
[0, 0, 0, 0]
Enter 4 binary input values
1
1
0
Enter 2 binary target values
1
s=[1, 1, 0, 0]
t = [0, 1]
w 1 1 =
         2
w 2 1 = 0
w \ 3 \ 1 = 1
w \ 4 \ 1 = 1
w 1 2 = 1
w 2 2 = 1
w \ 3 \ 2 = 0
w \ 4 \ 2 = 0
[2, 0, 1, 1]
[1, 1, 0, 0]
Enter 4 binary input values
0
1
1
                                                          Ln: 16 Col: 0
```

```
Python 3.7.4 Shell - C:/Users/Admin/Documents/#MSCIT/...
                                                                 \times
<u>File Edit Shell Debug Options Window Help</u>
t = [0, 1]
w 1 1 =
          2
w 2 1 =
          0
w \ 3 \ 1 =
          1
w \ 4 \ 1 = 1
w 1 2 = 1
w 2 2 = 1
w \ 3 \ 2 =
w \ 4 \ 2 = 0
[2, 0, 1, 1]
[1, 1, 0, 0]
Enter 4 binary input values
0
1
Enter 2 binary target values
1
s = [0, 0, 1, 1]
t = [0, 1]
w 1 1 =
          2
w 2 1 = 0
w \ 3 \ 1 =
          1
w \ 4 \ 1 = 1
w 1 2 = 1
w 2 2 = 1
w \ 3 \ 2 = 1
w \ 4 \ 2 = 1
[2, 0, 1, 1]
[1, 1, 1, 1]
The final weight matrix is:
W =
2 1
0 1
1 1
1 1
Done
>>>
                                                           Ln: 16 Col: 0
```

## **B] Implement Delta Rule**

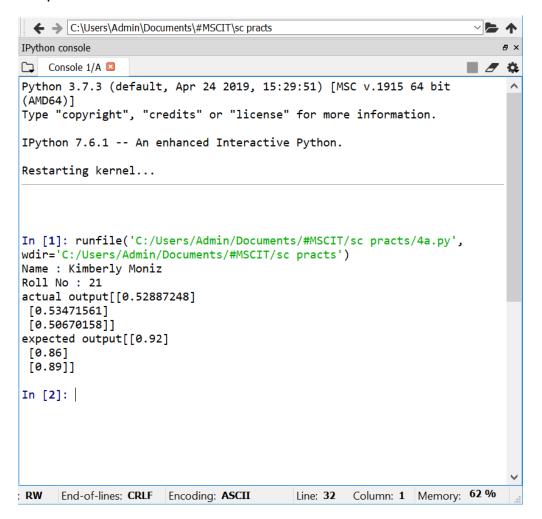
```
print("Name : Kimberly Moniz")
print("Roll No: 21")
import math
print("Using 3 inputs 3 weights 1 output.")
x1=[0.3,0.5,0.8] #inputs
w1=[0.1,0.1,0.1] #weights
           #TARGET
t=1
a = 0.1
         #alpha
diff=1
         #initial difference
yin=0
         #initial net input
while(diff>0.4):
  for i in range(0,3):
    yin = yin + (x1[i]*w1[i])
  yin = yin + 0.25
  yin=round(yin,3)
  print("Yin = ",yin)
  print("target = ",t)
  diff=t-yin
  diff=round(diff,3)
  diff=math.fabs(diff)
  print("error = ",diff)
  neww1=[]
  for i in range(0,3): #update weights
   w1new=w1[i] + a*diff*x1[i]
   w1new=round(w1new,2)
   neww1.append(w1new)
  print("w1new = ",neww1)
  w1=neww1
  print()
```

```
Python 3.7.4 Shell
                                                                               X
<u>File Edit Shell Debug Options Window Help</u>
Python 3.7.4 (tags/v3.7.4:e09359112e, Jul 8 2019, 19:29:22) [MSC v.1916 32 bit 🔨
(Intel)] on win32
Type "help", "copyright", "credits" or "license()" for more information.
>>>
RESTART: C:\Users\Admin\Documents\#MSCIT\Soft Computing\Soft Computing Practica
ls by Kimberly\P3B.py
Name : Kimberly Moniz
Roll No : 21
Using 3 inputs 3 weights 1 output.
Yin = 0.41
target = 1
error = 0.59
wlnew = [0.12, 0.13, 0.15]
Yin = 0.881
target = 1
error = 0.119
wlnew = [0.12, 0.14, 0.16]
>>>
                                                                                Ln: 18 Col: 4
```

## A] Write a program for Back Propogation Algorithm

```
Code :
```

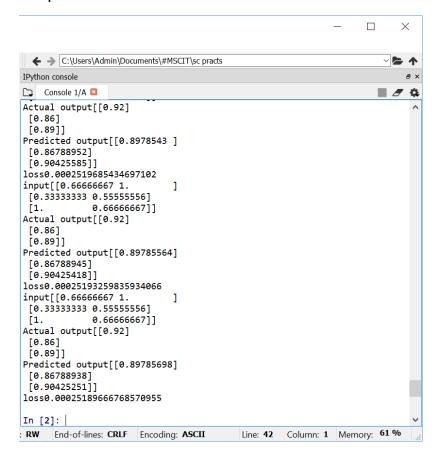
```
print("Name : Kimberly Moniz")
print("Roll No : 21")
import numpy as np
X=np.array(([2,9],[1,5],[3,6]),dtype=float)
Y=np.array(([92],[86],[89]),dtype=float)
#scale units
X=X/np.amax(X,axis=0)
Y=Y/100;
class NN(object):
       def __init__(self):
              self.inputsize=2
              self.outputsize=1
              self.hiddensize=3
              self.W1=np.random.randn(self.inputsize,self.hiddensize)
              self.W2=np.random.randn(self.hiddensize,self.outputsize)
       def forward(self,X):
              self.z=np.dot(X,self.W1)
              self.z2=self.sigmoidal(self.z)
              self.z3=np.dot(self.z2,self.W2)
              op=self.sigmoidal(self.z3)
              return op;
       def sigmoidal(self,s):
              return 1/(1+np.exp(-s))
obj=NN()
op=obj.forward(X)
print("actual output"+str(op))
print("expected output"+str(Y))
```



## B] Write a program for error Backpropagation algorithm

```
print("Name : Kimberly Moniz")
print("Roll No: 21")
import numpy as np
X=np.array(([2,9],[1,5],[3,6]),dtype=float)
Y=np.array(([92],[86],[89]),dtype=float)
X=X/np.amax(X,axis=0)
Y=Y/100;
class NN(object):
  def __init__(self):
    self.inputsize=2
    self.outputsize=1
    self.hiddensize=3
    self.W1=np.random.randn(self.inputsize,self.hiddensize)
    self.W2=np.random.randn(self.hiddensize,self.outputsize)
  def forward(self,X):
    self.z=np.dot(X,self.W1)
    self.z2=self.sigmoidal(self.z)
    self.z3=np.dot(self.z2,self.W2)
    op=self.sigmoidal(self.z3)
    return op;
  def sigmoidal(self,s):
    return 1/(1+np.exp(-s))
  def sigmoidalprime(self,s):
    return s* (1-s)
  def backward(self,X,Y,o):
    self.o error=Y-o
    self.o delta=self.o error * self.sigmoidalprime(o)
    self.z2 error=self.o delta.dot(self.W2.T)
    self.z2 delta=self.z2 error * self.sigmoidalprime(self.z2)
    self.W1 = self.W1 + X.T.dot(self.z2 delta)
    self.W2= self.W2+ self.z2.T.dot(self.o delta)
  def train(self,X,Y):
    o=self.forward(X)
    self.backward(X,Y,o)
obj=NN()
for i in range(2000):
```

```
print("input"+str(X))
print("Actual output"+str(Y))
print("Predicted output"+str(obj.forward(X)))
print("loss"+str(np.mean(np.square(Y-obj.forward(X)))))
obj.train(X,Y)
```



# A] Hopfield Network

```
Code: HFN.cpp
#include "hop.h"
#include<conio.h>
neuron::neuron(int *j)
int i;
for(i=0;i<4;i++)
  {
      weightv[i]=*(j+i); }
int neuron::act(int m, int *x)
{ int i; int a=0;
for(i=0;i<m;i++) { a += x[i]*weightv[i]; }
return a;
}
int network::threshld(int k)
{
if(k>=0)
  return (1);
else
  return (0);
network::network(int a[4],int b[4],int c[4],int d[4])
{
nrn[0] = neuron(a);
nrn[1] = neuron(b);
nrn[2] = neuron(c);
nrn[3] = neuron(d);
}
void network::activation(int *patrn)
int i,j;
for(i=0;i<4;i++)
  for(j=0;j<4;j++)
```

```
cout<<"\n nrn["<<i<<"].weightv["<<j<<"] is "
        <<nrn[i].weightv[j];
  nrn[i].activation = nrn[i].act(4,patrn);
  cout<<"\nactivation is "<<nrn[i].activation;</pre>
  output[i]=threshld(nrn[i].activation);
  cout<<"\noutput value is "<<output[i]<<"\n";</pre>
  }
}
void main ()
{
int patrn1[]= {1,0,1,0},i;
int wt1[]= \{0,-3,3,-3\};
int wt2[]= \{-3,0,-3,3\};
int wt3[]= \{3,-3,0,-3\};
int wt4[]= \{-3,3,-3,0\};
cout<<"\nTHIS PROGRAM IS FOR A HOPFIELD NETWORK WITH A SINGLE LAYER OF";
cout<<"\n4 FULLY INTERCONNECTED NEURONS. THE NETWORK SHOULD RECALL THE";
cout<<"\nPATTERNS 1010 AND 0101 CORRECTLY.\n";
//create the network by calling its constructor.
// the constructor calls neuron constructor as many times as the number of
// neurons in the network.
network h1(wt1,wt2,wt3,wt4);
//present a pattern to the network and get the activations of the neurons
h1.activation(patrn1);
//check if the pattern given is correctly recalled and give message
for(i=0;i<4;i++)
  if (h1.output[i] == patrn1[i])
     cout<<"\n pattern= "<<patrn1[i]<<
     " output = "<<h1.output[i]<<" component matches";</pre>
  else
     cout<<"\n pattern= "<<patrn1[i]<<
     " output = "<<h1.output[i]<<</pre>
     " discrepancy occurred";
cout<<"\n\n";
int patrn2[]= \{0,1,0,1\};
h1.activation(patrn2);
for(i=0;i<4;i++)
```

```
if (h1.output[i] == patrn2[i])
     cout<<"\n pattern= "<<patrn2[i]<<
     " output = "<<h1.output[i]<<" component matches";</pre>
  else
     cout<<"\n pattern= "<<patrn2[i]<<
     " output = "<<h1.output[i]<<
     " discrepancy occurred";
getch();
Code: hop.h
#include <stdio.h>
#include <iostream.h>
#include <math.h>
class neuron
protected:
  int activation;
  friend class network;
public:
  int weightv[4];
  neuron() {};
  neuron(int *j);
  int act(int, int*);
};
class network
{
public:
  neuron nrn[4];
  int output[4];
  int threshld(int);
  void activation(int j[4]);
  network(int*,int*,int*,int*);
};
```

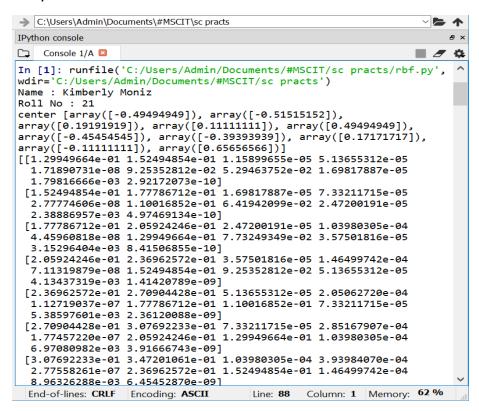
```
🚟 DOSBox 0.74, Cpu speed: max 100% cycles, Fra...
                                                                                     X
nrn[1].weightv[0] is -3
 nrn[1].weightv[1] is 0
 nrn[1].weightv[2] is -3
 nrn[1].weightv[3] is 3
activation is 3
output value is 1
 nrn[2].weightv[0] is 3
 nrn[2].weightv[1] is -3
nrn[2].weightv[2] is 0
 nrn[2].weightv[3] is -3
activation is -6
output value is 0
 nrn[3].weightv[0] is -3
 nrn[3].weightv[1] is 3
 nrn[3].weightv[2] is -3
nrn[3].weightv[3] is 0
activation is 3
output value is 1
 pattern= 0 output = 0 component matches
pattern= 1 output = 1 component matches
pattern= 0 output = 0 component matches
pattern= 1 output = 1 component matches
```

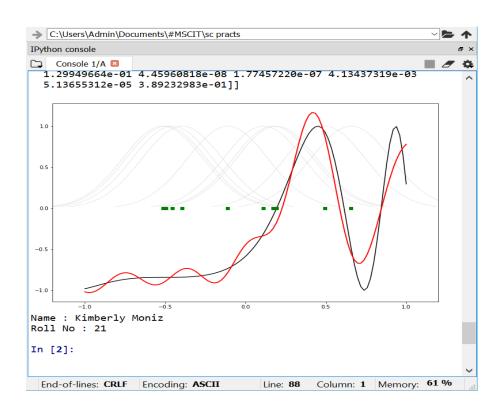
## **B]** Radial Basis

```
Code:
from scipy import *
from scipy.linalg import norm, pinv
from matplotlib import pyplot as plt
print("Name : Kimberly Moniz")
print("Roll No : 21")
class RBF:
    def _init__(self, indim, numCenters, outdim):
    self.indim = indim
    self.outdim = outdim
    self.numCenters = numCenters
    self.centers = [random.uniform(-1, 1, indim) for i in range(numCenters)]
    self.beta = 8
    self.W = random.random((self.numCenters, self.outdim))
  def basisfunc(self, c, d):
    assert len(d) == self.indim
    return exp(-self.beta * norm(c-d)**2)
  def calcAct(self, X):
    # calculate activations of RBFs
    G = zeros((X.shape[0], self.numCenters), float)
    for ci, c in enumerate(self.centers):
      for xi, x in enumerate(X):
         G[xi,ci] = self. basisfunc(c, x)
    return G
```

```
def train(self, X, Y):
    """ X: matrix of dimensions n x indim
      y: column vector of dimension n x 1 """
    # choose random center vectors from training set
    rnd idx = random.permutation(X.shape[0])[:self.numCenters]
    self.centers = [X[i,:] for i in rnd idx]
    print ("center", self.centers)
    # calculate activations of RBFs
    G = self. calcAct(X)
    print (G)
    # calculate output weights (pseudoinverse)
    self.W = dot(pinv(G), Y)
  def test(self, X):
    """ X: matrix of dimensions n x indim """
    G = self._calcAct(X)
    Y = dot(G, self.W)
    return Y
if name == ' main ':
  # ---- 1D Example -----
  n = 100
  x = mgrid[-1:1:complex(0,n)].reshape(n, 1)
  # set y and add random noise
```

```
y = \sin(3*(x+0.5)**3 - 1)
# y += random.normal(0, 0.1, y.shape)
# rbf regression
rbf = RBF(1, 10, 1)
rbf.train(x, y)
z = rbf.test(x)
# plot original data
plt.figure(figsize=(12, 8))
plt.plot(x, y, 'k-')
# plot learned model
plt.plot(x, z, 'r-', linewidth=2)
# plot rbfs
plt.plot(rbf.centers, zeros(rbf.numCenters), 'gs')
for c in rbf.centers:
  # RF prediction lines
  cx = arange(c-0.7, c+0.7, 0.01)
  cy = [rbf._basisfunc(array([cx_]), array([c])) for cx_ in cx]
  plt.plot(cx, cy, '-', color='gray', linewidth=0.2)
plt.xlim(-1.2, 1.2)
plt.show()
print("Name : Kimberly Moniz")
print("Roll No: 21")
```





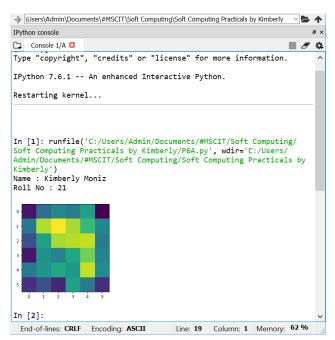
## A] Kohonen

### Pip install minisom

#### Code:

```
from minisom import MiniSom import matplotlib.pyplot as plt print("Name: Kimberly Moniz") print("Roll No: 21") data = [[ 0.80, 0.55, 0.22, 0.03], [ 0.82, 0.50, 0.23, 0.03], [ 0.80, 0.54, 0.22, 0.03], [ 0.80, 0.53, 0.26, 0.03], [ 0.79, 0.56, 0.22, 0.03], [ 0.75, 0.60, 0.25, 0.03], [ 0.77, 0.59, 0.22, 0.03]]
```

som = MiniSom(6, 6, 4, sigma=0.3, learning\_rate=0.5) # initialization of 6x6 SOM som.train\_random(data, 100) # trains the SOM with 100 iterations plt.imshow(som.distance\_map())



## **B]** Adaptive Resonance Theory

```
from future import print function
from __future__ import division
import numpy as np
print("Name : Kimberly Moniz")
print("Roll No: 21")
class ART:
  def init (self, n=5, m=10, rho=.5):
    # Comparison layer
    self.F1 = np.ones(n)
    # Recognition layer
    self.F2 = np.ones(m)
    # Feed-forward weights
    self.Wf = np.random.random((m,n))
    # Feed-back weights
    self.Wb = np.random.random((n,m))
    # Vigilance
    self.rho = rho
    # Number of active units in F2
    self.active = 0
  def learn(self, X):
    # Compute F2 output and sort them (I)
    self.F2[...] = np.dot(self.Wf, X)
    I = np.argsort(self.F2[:self.active].ravel())[::-1]
    for i in I:
      # Check if nearest memory is above the vigilance level
      d = (self.Wb[:,i]*X).sum()/X.sum()
      if d >= self.rho:
        # Learn data
        self.Wb[:,i] *= X
        self.Wf[i,:] = self.Wb[:,i]/(0.5+self.Wb[:,i].sum())
         return self.Wb[:,i], i
    # No match found, increase the number of active units
```

```
# and make the newly active unit to learn data
    if self.active < self.F2.size:
      i = self.active
      self.Wb[:,i] *= X
      self.Wf[i,:] = self.Wb[:,i]/(0.5+self.Wb[:,i].sum())
      self.active += 1
      return self.Wb[:,i], i
    return None, None
if __name__ == '__main__':
  np.random.seed(1)
  network = ART( 5, 10, rho=0.5)
  data = [" O ",
      " 00",
      " O",
      " 00",
      " O",
      " 00",
      " O",
      "000",
      "00 ",
      " 00 0",
      "00 ",
      "000 ",
      "00 ",
      "0 ",
      "00 ",
      "000 ",
      "0000",
      "00000",
      "O ",
      "O",
      " O ",
      " O",
      " O",
      " 00",
      "000",
      "00 ",
      "000 ",
      "00 ",
```

```
"OOOO",

"OOOO"]

X = np.zeros(len(data[0]))

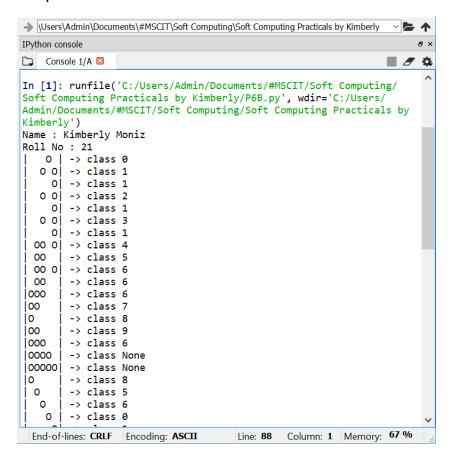
for i in range(len(data)):

for j in range(len(data[i])):

X[j] = (data[i][j] == 'O')

Z, k = network.learn(X)

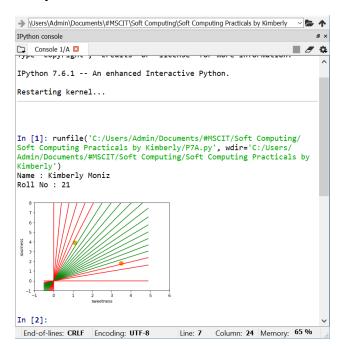
print("|%s|"%data[i],"-> class", k)
```



# A] Write a program for Linear Separation

```
import numpy as np
import matplotlib.pyplot as plt
print("Name : Kimberly Moniz")
print("Roll No: 21")
def create distance function(a, b, c):
  """ 0 = ax + by + c """
  def distance(x, y):
    """ returns tuple (d, pos)
       d is the distance
       If pos == -1 point is below the line,
       0 on the line and +1 if above the line
    nom = a * x + b * y + c
    if nom == 0:
       pos = 0
    elif (nom<0 and b<0) or (nom>0 and b>0):
       pos = -1
    else:
    return (np.absolute(nom) / np.sqrt( a ** 2 + b ** 2), pos)
  return distance
points = [ (3.5, 1.8), (1.1, 3.9) ]
fig, ax = plt.subplots()
ax.set_xlabel("sweetness")
ax.set_ylabel("sourness")
ax.set xlim([-1, 6])
ax.set ylim([-1, 8])
X = np.arange(-0.5, 5, 0.1)
colors = ["r", ""] # for the samples
size = 10
for (index, (x, y)) in enumerate(points):
  if index== 0:
    ax.plot(x, y, "o",
         color="darkorange",
         markersize=size)
```

```
else:
    ax.plot(x, y, "oy",
         markersize=size)
step = 0.05
for x in np.arange(0, 1+step, step):
  slope = np.tan(np.arccos(x))
  dist4line1 = create_distance_function(slope, -1, 0)
  #print("x: ", x, "slope: ", slope)
  Y = slope * X
  results = []
  for point in points:
    results.append(dist4line1(*point))
  #print(slope, results)
  if (results[0][1] != results[1][1]):
    ax.plot(X, Y, "g-")
  else:
    ax.plot(X, Y, "r-")
plt.show()
```



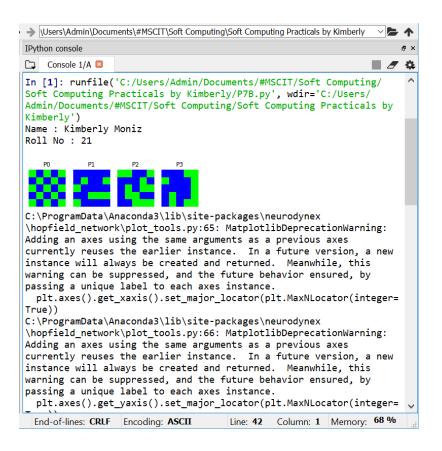
## **B] Hopfield for Associative Memory**

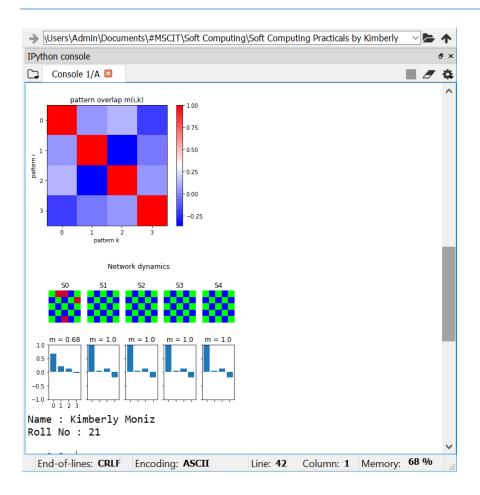
```
Pip install –upgrade neurodynex
Replace
Import matplotlib.pyplot as plt
Code:
import matplotlib.pyplot as plt
from neurodynex.hopfield network import network, pattern tools, plot tools
print("Name : Kimberly Moniz")
print("Roll No: 21")
pattern_size = 5
# create an instance of the class HopfieldNetwork
hopfield net = network.HopfieldNetwork(nr neurons= pattern size**2)
# instantiate a pattern factory
factory = pattern tools.PatternFactory(pattern size, pattern size)
# create a checkerboard pattern and add it to the pattern list
checkerboard = factory.create checkerboard()
pattern list = [checkerboard]
# add random patterns to the list
pattern list.extend(factory.create random pattern list(nr_patterns=3, on_probability=0.5))
plot tools.plot pattern list(pattern list)
# how similar are the random patterns and the checkerboard? Check the overlaps
overlap matrix = pattern tools.compute overlap matrix(pattern list)
plot tools.plot overlap matrix(overlap matrix)
# let the hopfield network "learn" the patterns. Note: they are not stored
# explicitly but only network weights are updated!
hopfield net.store patterns(pattern list)
# create a noisy version of a pattern and use that to initialize the network
noisy init state = pattern tools.flip n(checkerboard, nr of flips=4)
hopfield net.set state from pattern(noisy init state)
# from this initial state, let the network dynamics evolve.
states = hopfield net.run with monitoring(nr steps=4)
```

# each network state is a vector. reshape it to the same shape used to create the patterns.
states\_as\_patterns = factory.reshape\_patterns(states)
# plot the states of the network
plot\_tools.plot\_state\_sequence\_and\_overlap(states\_as\_patterns, pattern\_list,
reference\_idx=0, suptitle="Network dynamics")

print("Name : Kimberly Moniz")

print("Roll No: 21")





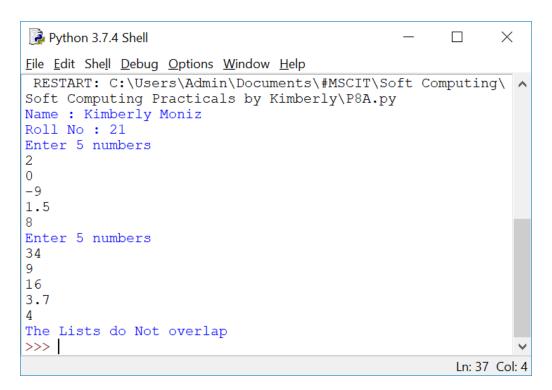
## **Practical 8**

## A] Membership and Identity Operators in and not in

# **Code for IN OPERATOR:**

```
print("Name : Kimberly Moniz")
print("Roll No : 21")
list1=[]
print("Enter 5 numbers")
for i in range(0,5):
  v=input()
  list1.append(v)
list2=[]
print("Enter 5 numbers")
for i in range(0,5):
  v=input()
  list2.append(v)
flag=0
for i in list1:
  if i in list2:
    flag=1
if(flag==1):
 print("The Lists Overlap")
else:
 print("The Lists do Not overlap")
```

```
Python 3.7.4 Shell
                                                           X
                                                     <u>File Edit Shell Debug Options Window Help</u>
Python 3.7.4 (tags/v3.7.4:e09359112e, Jul 8 2019, 19:29:
22) [MSC v.1916 32 bit (Intel)] on win32
Type "help", "copyright", "credits" or "license()" for mo
re information.
>>>
RESTART: C:\Users\Admin\Documents\#MSCIT\Soft Computing\
Soft Computing Practicals by Kimberly\P8A.py
Name : Kimberly Moniz
Roll No : 21
Enter 5 numbers
2
5.3
-9
15
24
Enter 5 numbers
3
-9
15
-2
The Lists Overlap
>>>
                                                      Ln: 20 Col: 4
```



## Code for NOT IN operator:

```
print("Name : Kimberly Moniz")
print("Roll No: 21")
list1=[]
print("Enter 5 numbers")
for i in range(0,5):
  v=input()
  list1.append(v)
list2=[]
print("Enter 5 numbers")
for i in range(0,5):
  v=input()
  list2.append(v)
flag=0
print("The elements in the first list not in second list are")
for i in list1:
  if i not in list2:
    print(i)
```

```
Python 3.7.4 Shell
                                                        \times
<u>File Edit Shell Debug Options Window Help</u>
RESTART: C:\Users\Admin\Documents\#MSCIT\Soft Computing\
Soft Computing Practicals by Kimberly\P8A2.py
Name : Kimberly Moniz
Roll No: 21
Enter 5 numbers
23
8.7
0
-10
5
Enter 5 numbers
3
-10
8.7
2
9
The elements in the first list not in second list are
23
0
5
>>>
                                                         Ln: 23 Col: 4
```

## B] Membership and Identity Operators IS and IS NOT

## Code for IS OPERATOR:

```
print("Name : Kimberly Moniz")
print("Roll No : 21")
details =[]
name=input("Enter your name : ")
details.append(name)
age=float(input("Enter your exact age : "))
details.append(age)
roll_no=int(input("Enter your roll no : "))
details.append(roll_no)

for i in details:
    print(i)
    print("Int = ",type(i) is int)
    print("Float = ",type(i) is float)
    print("String = ",type(i) is str)
    print()
```

```
Python 3.7.4 Shell
                                                     \times
<u>File Edit Shell Debug Options Window Help</u>
RESTART: C:/Users/Admin/Documents/#MSCIT/Soft Computing/ ^
Soft Computing Practicals by Kimberly/P8B.py
Name : Kimberly Moniz
Roll No : 21
Enter your name : Kimberly
Enter your exact age: 21.9
Enter your roll no: 21
Kimberly
Int = False
Float = False
String = True
21.9
Int = False
Float = True
String = False
21
Int = True
Float = False
String = False
>>>
                                                      Ln: 98 Col: 4
```

## **Code for IS NOT OPERATOR:**

```
print("Name : Kimberly Moniz")
print("Roll No: 21")
details =[]
name=input("Enter your name : ")
details.append(name)
age=float(input("Enter your exact age : "))
details.append(age)
roll no=int(input("Enter your roll no : "))
details.append(roll_no)
print()
for i in details:
  print(i)
  print("Not Int = ",type(i) is not int)
  print("Not Float = ",type(i) is not float)
  print("Not String = ",type(i) is not str)
  print()
```

```
Python 3.7.4 Shell
                                                     X
<u>File Edit Shell Debug Options Window Help</u>
RESTART: C:/Users/Admin/Documents/#MSCIT/Soft Computing/ ^
Soft Computing Practicals by Kimberly/P8B.py
Name : Kimberly Moniz
Roll No : 21
Enter your name : Kimberly
Enter your exact age : 21.9
Enter your roll no : 21
Kimberly
Not Int = True
Not Float = True
Not String = False
21.9
Not Int = True
Not Float = False
Not String = True
21
Not Int = False
Not Float = True
Not String = True
>>>
                                                     Ln: 26 Col: 4
```

#### **Practical 9**

## A] Find ratios using fuzzy logic

#### Code:

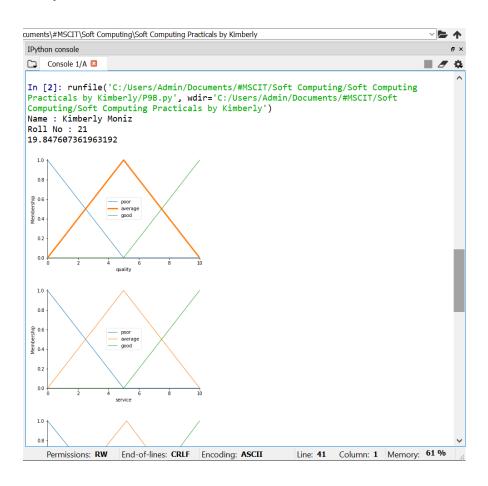
```
from fuzzywuzzy import fuzz
from fuzzywuzzy import process
print("Name : Kimberly Moniz")
print("Roll No: 21")
s1 = "I love fuzzysforfuzzys"
s2 = "I am loving fuzzysforfuzzys"
print ("FuzzyWuzzy Ratio:", fuzz.ratio(s1, s2))
print ("FuzzyWuzzyPartialRatio: ", fuzz.partial ratio(s1, s2))
print ("FuzzyWuzzyTokenSortRatio: ", fuzz.token sort ratio(s1, s2))
print ("FuzzyWuzzyTokenSetRatio: ", fuzz.token set ratio(s1, s2))
print ("FuzzyWuzzyWRatio: ", fuzz.WRatio(s1, s2),'\n\n')
# for process library,
query = 'fuzzys for fuzzys'
choices = ['fuzzy for fuzzy', 'fuzzy fuzzy', 'g. for fuzzys']
print ("List of ratios: ")
print (process.extract(query, choices), '\n')
print ("Best among the above list: ",process.extractOne(query, choices))
```

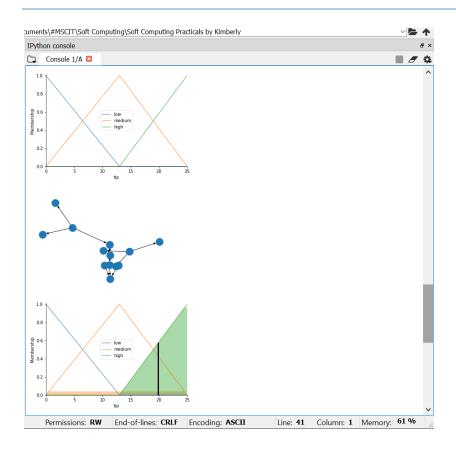
```
ocuments\#MSCIT\Soft Computing\Soft Computing Practicals by Kimberly
                                                                                                                   5 1
IPython console
Console 1/A
In [1]: runfile('C:/Users/Admin/Documents/#MSCIT/Soft Computing/Soft Computing
Practicals by Kimberly/P9A.py', wdir='C:/Users/Admin/Documents/#MSCIT/Soft
Computing/Soft Computing Practicals by Kimberly')
Name : Kimberly Moniz
Roll No : 21
FuzzyWuzzy Ratio: 86
FuzzyWuzzyPartialRatio: 86
FuzzyWuzzyTokenSortRatio: 86
FuzzyWuzzyTokenSetRatio: 87
 FuzzyWuzzyWRatio: 86
List of ratios:
[('g. for fuzzys', 95), ('fuzzy for fuzzy', 94), ('fuzzy fuzzy', 86)]
Best among the above list: ('g. for fuzzys', 95)
C:\ProgramData\Anaconda3\lib\site-packages\fuzzywuzzy\fuzz.py:11: UserWarning: Using slow pure-python SequenceMatcher. Install python-Levenshtein to remove this warning
  warnings.warn('Using slow pure-python SequenceMatcher. Install python-Levenshtein
 to remove this warning')
 In [2]:
         Permissions: RW End-of-lines: LF Encoding: ASCII
                                                                           Line: 4 Column: 22 Memory: 62 %
```

```
B] Solve Tipping problem using fuzzy logic
Code:
import numpy as np
import skfuzzy as fuzz
from skfuzzy import control as ctrl
# New Antecedent/Consequent objects hold universe variables and membership
# functions
quality = ctrl.Antecedent(np.arange(0, 11, 1), 'quality')
service = ctrl.Antecedent(np.arange(0, 11, 1), 'service')
tip = ctrl.Consequent(np.arange(0, 26, 1), 'tip')
# Auto-membership function population is possible with .automf(3, 5, or 7)
quality.automf(3)
service.automf(3)
# Custom membership functions can be built interactively with a familiar,
# Pythonic API
print("Name : Kimberly Moniz")
print("Roll No : 21")
tip['low'] = fuzz.trimf(tip.universe, [0, 0, 13])
tip['medium'] = fuzz.trimf(tip.universe, [0, 13, 25])
tip['high'] = fuzz.trimf(tip.universe, [13, 25, 25])
quality['average'].view()
service.view()
tip.view()
rule1 = ctrl.Rule(quality['poor'] | service['poor'], tip['low'])
rule2 = ctrl.Rule(service['average'], tip['medium'])
rule3 = ctrl.Rule(service['good'] | quality['good'], tip['high'])
rule1.view()
tipping ctrl = ctrl.ControlSystem([rule1, rule2, rule3])
tipping = ctrl.ControlSystemSimulation(tipping ctrl)
tipping.input['quality'] = 6.5
```

# tipping.input['service'] = 9.8

# Crunch the numbers
tipping.compute()
print (tipping.output['tip'])
tip.view(sim=tipping)





#### **Practical 10**

## A] Implementation of Simple genetic algorithm

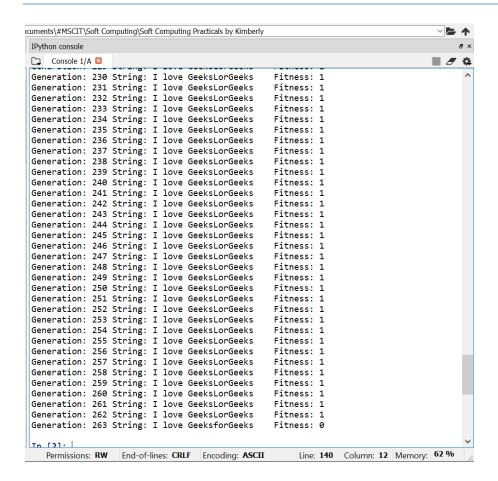
#### Code:

```
import random
print("Name : Kimberly Moniz")
print("Roll No: 21")
# Number of individuals in each generation
POPULATION SIZE = 100
 # Valid genes
GENES = "abcdefghijklmnopqrstuvwxyzABCDEFGHIJKLMNOP
QRSTUVWXYZ 1234567890, .-;: !"#%&/()=?@${[]}'''
# Target string to be generated
TARGET = "I love GeeksforGeeks"
 class Individual(object):
  Class representing individual in population
  def init (self, chromosome):
    self.chromosome = chromosome
    self.fitness = self.cal fitness()
  @classmethod
  def mutated genes(self):
    create random genes for mutation
    global GENES
    gene = random.choice(GENES)
    return gene
  @classmethod
  def create gnome(self):
    create chromosome or string of genes
    global TARGET
    gnome len = len(TARGET)
    return [self.mutated genes() for in range(gnome len)]
  def mate(self, par2):
```

```
ш
  Perform mating and produce new offspring
  # chromosome for offspring
  child_chromosome = []
  for gp1, gp2 in zip(self.chromosome, par2.chromosome):
    # random probability
    prob = random.random()
    # if prob is less than 0.45, insert gene
    # from parent 1
    if prob < 0.45:
      child chromosome.append(gp1)
    # if prob is between 0.45 and 0.90, insert
    # gene from parent 2
    elif prob < 0.90:
      child chromosome.append(gp2)
    # otherwise insert random gene(mutate),
    # for maintaining diversity
    else:
      child chromosome.append(self.mutated genes())
  # create new Individual(offspring) using
  # generated chromosome for offspring
  return Individual(child_chromosome)
def cal_fitness(self):
  Calculate fittness score, it is the number of
  characters in string which differ from target
  string.
  global TARGET
  fitness = 0
  for gs, gt in zip(self.chromosome, TARGET):
    if gs != gt: fitness+= 1
  return fitness
```

```
# Driver code
def main():
  global POPULATION SIZE
  #current generation
  generation = 1
  found = False
  population = []
  # create initial population
  for in range(POPULATION SIZE):
        gnome = Individual.create gnome()
        population.append(Individual(gnome))
  while not found:
     # sort the population in increasing order of fitness score
    population = sorted(population, key = lambda x:x.fitness)
    # if the individual having lowest fitness score ie.
    # 0 then we know that we have reached to the target
    # and break the loop
    if population[0].fitness <= 0:
      found = True
      break
    # Otherwise generate new offsprings for new generation
    new_generation = []
    # Perform Elitism, that mean 10% of fittest population
    # goes to the next generation
    s = int((10*POPULATION_SIZE)/100)
    new generation.extend(population[:s])
    # From 50% of fittest population, Individuals
    # will mate to produce offspring
    s = int((90*POPULATION SIZE)/100)
    for in range(s):
      parent1 = random.choice(population[:50])
      parent2 = random.choice(population[:50])
```

```
cuments\#MSCIT\Soft Computing\Soft Computing Practicals by Kimberly
Console 1/A 🗵
In [1]: runfile('C:/Users/Admin/Documents/#MSCIT/Soft Computing/Soft Computing
Practicals by Kimberly/P10A.py', wdir='C:/Users/Admin/Documents/#MSCIT/Soft Computing/Soft Computing Practicals by Kimberly')
Name : Kimberly Moniz
Roll No : 21
Generation: 1
                  String: Iyp#v PySNo{)Tr!]9:n
                                                     Fitness: 17
                 String: Iep@vEOaNN/e:6r%e9M{
Generation: 2
                                                     Fitness: 16
Generation: 3
                 String: Iep0vEQqNN/e;6r%e9M{
                                                     Fitness: 16
Generation: 4
                 String: _f7}ve4AweRsSKj}T${s
                                                     Fitness: 15
Generation: 5
                 String:
                           _f7}ve4AweRsSKj}T${s
                                                     Fitness: 15
                 String: If&Sve:vFe:{norXrqM:
Generation: 6
                                                     Fitness: 14
                 String: Ifl!vedwQeR{ZDr%rR#s
                                                     Fitness: 13
Generation: 7
Generation: 8
                 String: Ifl!vedwQeR{ZDr%rR#s
                                                     Fitness: 13
Generation: 9
                 String: If/Vve4Awe:sZorKT4{s
                                                     Fitness: 12
Generation: 10
                 String: If/Vve4Awe:sZorKT4{s
                                                     Fitness: 12
                 String: I TRve3Ax6xs;orGe9Ms
                                                     Fitness: 10
Generation: 12
                 String: I TRve3Ax6xs;orGe9Ms
                                                     Fitness: 10
Generation: 13
                 String: I TRve3Ax6xs;orGe9Ms
                                                     Fitness: 10
                 String: I T9ve%Axeos;orGe9ss
Generation: 14
                                                     Fitness: 9
                 String: I T9ve%Axeos;orGe9ss
Generation: 16
                 String: I lRve3{xeosqorGeRMs
                                                     Fitness: 8
                 String: I lRve3{xeosqorGeRMs
String: I lRve3{xeosqorGeRMs
Generation: 17
                                                     Fitness: 8
Generation: 18
                                                     Fitness:
                 String: I l!ve?GYepsNorGe;Ms
Generation: 19
                                                     Fitness:
Generation: 20
                 String: I l!ve?GYepsNorGe;Ms
String: I l!ve?GYepsNorGe;Ms
                                                     Fitness:
Generation: 21
                                                     Fitness:
Generation: 22
                 String: I 1!ve?GYepsNorGe;Ms
                                                     Fitness:
Generation: 23
                 String: I 1!ve?GYepsNorGe;Ms
                                                     Fitness:
Generation: 24
                 String: I l!ve?GYepsNorGe;Ms
                                                     Fitness:
Generation: 25
                 String: I l!ve?GYepsNorGe;Ms
                                                     Fitness:
Generation: 26
                 String: I l!ve?GYepsNorGe;Ms
                                                     Fitness:
                 String: I l!ve?GYepsNorGe;Ms
Generation: 27
                                                     Fitness: 7
Generation: 28
                 String: I l!ve?GYepsNorGe;Ms
                                                     Fitness: 7
Generation: 29
                 String: I 1!ve?GYepsNorGe:Ms
                                                     Fitness:
Generation: 30
                String: I 10ve GreYs.orGeZMs
                                                     Fitness: 6
    Permissions: RW End-of-lines: CRLF Encoding: ASCII
                                                          Line: 140 Column: 12 Memory: 61 %
```



# B] Create two classes: City and Fitness using Genetic algorithm Code:

```
import numpy as np, random, operator, pandas as pd, matplotlib.pyplot as plt
print("Name : Kimberly Moniz")
print("Roll No : 21")
class City:
  def init (self, x, y):
     self.x = x
     self.y = y
  def distance(self, city):
     xDis = abs(self.x - city.x)
     yDis = abs(self.y - city.y)
     distance = np.sqrt((xDis ** 2) + (yDis ** 2))
     return distance
  def repr (self):
     return "(" + str(self.x) + "," + str(self.y) + ")"
class Fitness:
  def init (self, route):
     self.route = route
     self.distance = 0
     self.fitness= 0.0
  def routeDistance(self):
     if self.distance ==0:
       pathDistance = 0
       for i in range(0, len(self.route)):
         fromCity = self.route[i]
         toCity = None
         if i + 1 < len(self.route):
            toCity = self.route[i + 1]
         else:
            toCity = self.route[0]
          pathDistance += fromCity.distance(toCity)
       self.distance = pathDistance
     return self.distance
  def routeFitness(self):
     if self.fitness == 0:
```

```
self.fitness = 1 / float(self.routeDistance())
     return self.fitness
def createRoute(cityList):
  route = random.sample(cityList, len(cityList))
  return route
def initialPopulation(popSize, cityList):
  population = []
  for i in range(0, popSize):
     population.append(createRoute(cityList))
  return population
def rankRoutes(population):
  fitnessResults = {}
  for i in range(0,len(population)):
     fitnessResults[i] = Fitness(population[i]).routeFitness()
  return sorted(fitnessResults.items(), key = operator.itemgetter(1), reverse = True)
def selection(popRanked, eliteSize):
  selectionResults = []
  df = pd.DataFrame(np.array(popRanked), columns=["Index","Fitness"])
  df['cum sum'] = df.Fitness.cumsum()
  df['cum perc'] = 100*df.cum sum/df.Fitness.sum()
  for i in range(0, eliteSize):
     selectionResults.append(popRanked[i][0])
  for i in range(0, len(popRanked) - eliteSize):
     pick = 100*random.random()
     for i in range(0, len(popRanked)):
       if pick <= df.iat[i,3]:
         selectionResults.append(popRanked[i][0])
         break
  return selectionResults
def matingPool(population, selectionResults):
  matingpool = []
  for i in range(0, len(selectionResults)):
     index = selectionResults[i]
     matingpool.append(population[index])
  return matingpool
def breed(parent1, parent2):
  child = []
  childP1 = []
```

```
childP2 = []
  geneA = int(random.random() * len(parent1))
  geneB = int(random.random() * len(parent1))
  startGene = min(geneA, geneB)
  endGene = max(geneA, geneB)
  for i in range(startGene, endGene):
     childP1.append(parent1[i])
  childP2 = [item for item in parent2 if item not in childP1]
  child = childP1 + childP2
  return child
def breedPopulation(matingpool, eliteSize):
  children = []
  length = len(matingpool) - eliteSize
  pool = random.sample(matingpool, len(matingpool))
  for i in range(0,eliteSize):
     children.append(matingpool[i])
  for i in range(0, length):
     child = breed(pool[i], pool[len(matingpool)-i-1])
     children.append(child)
  return children
def mutate(individual, mutationRate):
  for swapped in range(len(individual)):
     if(random.random() < mutationRate):</pre>
       swapWith = int(random.random() * len(individual))
       city1 = individual[swapped]
       city2 = individual[swapWith]
       individual[swapped] = city2
       individual[swapWith] = city1
  return individual
```

```
def mutatePopulation(population, mutationRate):
  mutatedPop = []
  for ind in range(0, len(population)):
     mutatedInd = mutate(population[ind], mutationRate)
     mutatedPop.append(mutatedInd)
  return mutatedPop
def nextGeneration(currentGen, eliteSize, mutationRate):
  popRanked = rankRoutes(currentGen)
  selectionResults = selection(popRanked, eliteSize)
  matingpool = matingPool(currentGen, selectionResults)
  children = breedPopulation(matingpool, eliteSize)
  nextGeneration = mutatePopulation(children, mutationRate)
  return nextGeneration
def geneticAlgorithm(population, popSize, eliteSize, mutationRate, generations):
  pop = initialPopulation(popSize, population)
  print("Initial distance: " + str(1 / rankRoutes(pop)[0][1]))
  for i in range(0, generations):
     pop = nextGeneration(pop, eliteSize, mutationRate)
  print("Final distance: " + str(1 / rankRoutes(pop)[0][1]))
  bestRouteIndex = rankRoutes(pop)[0][0]
  bestRoute = pop[bestRouteIndex]
  return bestRoute
cityList = []
for i in range(0,25):
  cityList.append(City(x=int(random.random() * 200), y=int(random.random() * 200)))
geneticAlgorithm(population=cityList, popSize=100, eliteSize=20, mutationRate=0.01,
generations=500)
def geneticAlgorithmPlot(population, popSize, eliteSize, mutationRate, generations):
  pop = initialPopulation(popSize, population)
  progress = []
  progress.append(1 / rankRoutes(pop)[0][1])
  for i in range(0, generations):
     pop = nextGeneration(pop, eliteSize, mutationRate)
     progress.append(1 / rankRoutes(pop)[0][1])
  plt.plot(progress)
```

```
plt.ylabel('Distance')
plt.xlabel('Generation')
plt.show()
geneticAlgorithmPlot(population=cityList, popSize=100, eliteSize=20, mutationRate=0.01,
generations=500)
```

