```
1 import numpy as np
 2 import h5py
 3 import random
 4 import matplotlib as plt
 5 from random import seed
 6 from random import randrange
 7 from random import random
 8 from csv import reader
 9 from math import exp
10 import random
11 import time
12 import sys
13 import matplotlib.pyplot as plt
14 from tempfile import TemporaryFile
15
16 def formonehot(data,i):
17
      data = np.array(data)
18
      onehot = np.array(data/i)
19
      onehot[onehot != 1] = 0
       return onehot
20
21
22 def crossentropyloss(predicted,label):
      sum = 0
23
      for i in range(len(predicted)):
24
25
           labels = onehotlabel(label)
26
           sum += -1*np.sum(labels*np.log(np.amax(predicted[i])))
27
       return sum/372500
28
29 def onehotlabel(label):
30
      onehot = np.zeros(250)
31
       onehot[label] = 1
32
       return onehot
33
34 def softmax(predicteds):
       softmaxs = np.exp(predicteds - np.max(predicteds))/np.sum(np.exp(predicteds - np.ma
35
       return softmaxs
36
37
38 def calculatemse(error,o,flag =False):
39
      mse = 0
40
      err= 0
41
      error = error.T
42
      for errorofiteration in error:
43
           for column in errorofiteration:
44
               err+=column
45
           mse = mse + err*err
      mse = mse/np.array(o).shape[0]
46
47
      return mse
48
49 def classError(o,lbls):
50
      acc = accuracy(o,lbls)
51
      return acc
52
53 def accuracy(o,lbls):
       count = 0
```

```
__
 55
       predict = np.argmax(o,axis=1)
       for i in range(lbls.shape[0]):
 56
 57
            if predict[i]==lbls[i]:
                count = count + 1
 58
 59
        return count/lbls.shape[0]*100
 60
 61 def organizeInput(image):
 62
       x = np.ones(32*32)
 63
       index = 0
       for row in image:
 64
 65
            for column in row:
 66
                x[index]=((column))
 67
                index = index + 1
 68
        return x
 69
 70 def activation(inn,deriv =False):
 71
       inn = np.tanh(inn)
 72
        if deriv == True:
            return 1-inn*inn
 73
        return inn
 74
 75
 76 # Rescale dataset columns to the range 0-1
 77 def normalize_dataset(arr):
        arr = arr - np.amin(arr,axis=0)
 78
        arr = arr / np.amax(arr,axis = 0)
 79
        return arr
 80
 81
 82 # Find the min and max values for each column
 83 def organizeData(dataPath):
        data = h5py.File(dataPath,'r+')
 84
 85
       trainims =(data['trainims'])
 86
       trainlbls =(data['trainlbls'])
       testims=(data['testims'])
 87
       testlbls =(data['testlbls'])
 88
 89
        return trainims, trainlbls, testims, testlbls
 90
 91 def organizeData2(dataPath):
        data = h5py.File(dataPath,'r+')
 92
        trainx =np.array((data['trainx']))
 93
       traind =np.array((data['traind']))
 94
       valx=(data['valx'])
 95
 96
       vald =(data['vald'])
       testx=(data['testx'])
 97
       testd =(data['testd'])
 98
       words = data['words']
 99
100
        return trainx, traind, valx, vald, testx, testd, words
101
102 def addBiasToDataset(dataset):
103
       size = dataset.shape[0]
104
       biasInDataset = -1*np.ones(size)
        return np.hstack((dataset,(biasInDataset.reshape(-1,1))))
105
106
107 def addbiasToInputs(layerInput):
108
        return np.hstack((layerInput,[-1]))
109
```

```
110 def forwardpropagate(W1,W2,testdata):
        outputs = list()
111
112
        for img in testdata:
            output = activation(np.dot(W2,activation(addbiasToInputs(np.dot(W1,img)))))
113
            outputs.append(output)
114
115
        return np.array(outputs)
116
117 def normalize(v):
118
        norm = np.linalg.norm(v)
119
        if norm == 0:
120
           return v
121
        return v / norm
122
123 def shuffle(data, lbls):
124
        deck = ((np.hstack((data,lbls.reshape(1,-1).T))))
125
        deck = np.array(sorted(deck, key=lambda k: random.random()))
        data = deck.T[:-1].T
126
        lbls = deck.T[-1]
127
128
        return data, lbls
129
130 def shuffle3(data, lbls):
        deck = ((np.hstack((data,lbls.reshape(1,-1).T))))
131
132
        deck = np.array(sorted(deck, key=lambda k: random.random()))
133
       data = deck.T[:-1].T
134
       lbls = deck.T[-1]
135
       return data, lbls
136
137 def formdata():
        Q2data =("/content/assign2_data1.h5")
138
139
        trainims,trainlbls,testims,testlbls = organizeData(Q2data)
140
        traindata = list()
        testdata = list()
141
142
143
        for image in trainims:
144
            inputs = organizeInput(image)
145
            traindata.append(inputs)
146
        for image in testims:
147
148
            inputs = organizeInput(image)
149
            testdata.append(inputs)
150
151
        traindata = np.array(traindata,dtype = float)
        trainlbls = np.array(trainlbls,dtype = float)
152
153
        testdata = np.array(testdata,dtype = float)
154
        testlbls = np.array(testlbls,dtype = float)
155
       traindata = (normalize dataset(traindata))
156
157
       testdata = (normalize dataset(testdata))
158
       traindata = addBiasToDataset(traindata)
159
        testdata = addBiasToDataset(testdata)
160
        return traindata, trainlbls, testdata, testlbls
  1 def runNetwork(hiddenNo,epochno,miniBatchno,learningrate,alpha=0):
        print("Hidden layer number:"+str(hiddenNo)+" Learning rate:"+str(learningrate)+" Ep
```

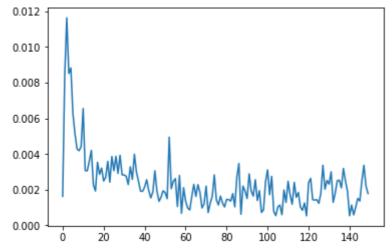
```
12.02.2020
                                              NN2.ipynb - Colaboratory
    3
          # handling array constructions
    4
          # trainx,traind,valx,vald,testx,testd = formdata2()
    5
          traindata,trainlbls,testdata,testlbls = formdata()
    6
    7
          What= np.random.normal(0, 1/1025,(hiddenNo,1024))
    8
          bhat = np.random.normal(0, 1/1025,(hiddenNo)).reshape(-1,1)
    9
          What =np.hstack((What, bhat))
   10
   11
          W= np.random.normal(0, 1/hiddenNo,(2,hiddenNo))
          b = np.random.normal(0, 1/hiddenNo,(2)).reshape(1,-1)
   12
          W =np.hstack((W, b.T))
   13
   14
   15
          errorsFormse = list()
          errorsForClassification = list()
   16
   17
          errorsForTestClassifications = list()
          errorsForTestmse = list()
   18
          # Start training process
   19
   20
          for epoch in range(epochno):
              errorsForEpochs = list()
   21
   22
              # display epoch index and current time
              if epoch==0:
   23
   24
                  print("Training started. Time: "+time.ctime())
              title = ("\r"+"Epoch no: "+str(epoch)+" in "+str(epochno))
   25
              sys.stdout.write(title +" Time: " +time.ctime())
   26
   27
              sys.stdout.flush()
              time.sleep(1)
   28
   29
              trainouts = list()#-----
              lblss = list()
   30
              for iterateno in range(1900):
   31
   32
                  # forward propagate
   33
                  # handling array constructions
   34
                  i = iterateno
                  img = traindata[i]
   35
   36
                  d = np.zeros(2)
   37
                  lbl = trainlbls[i]
                  lblss.append(lbl)
   38
                  d[int(lbl)] = 1
   39
                  # activate hidden layer
   40
                  vhat = list(np.dot(What,img))
   41
   42
                  vhat.append(-1)
   43
                  vhat = np.array(vhat,dtype = float)
   44
                  y = activation(vhat).T
   45
                  # activate output layer
                  v = np.dot(W,y)
   46
                  o = activation(v)
   47
   48
                  e = (d-o)/1900
   49
                  trainouts.append(o)#-----
   50
                  # store the error
                  errorsForEpochs.append(e)
   51
   52
                  # back propagate
   53
                  # back propagate the output layer
                  Tprime = activation(v,deriv = True)*np.identity(2,dtype=float)
   54
   55
                   gradient = (np.dot(Tprime,e))
                  # back propagate the hidden layer
   56
   57
                   Tprimehat = activation(vhat,deriv = True)*np.identity(hiddenNo+1,dtype = fl
                                    1 . / /
                                             1 . / - 1 . . . - . .
```

```
12.02.2020
                                               NN2.ipynb - Colaboratory
                   gradienthat = (np.dot((np.dot(Tprimehat,W.T))),gradient))
   58
   59
                   # mini batch updates
   60
                   if iterateno%miniBatchno== 0:
                       if not(iterateno==0 and epoch==0):#The first iteration of the first epo
   61
                           W +=learningrate*normalize(Wupdate)/miniBatchno
   62
                           What+=learningrate*normalize(Whatupdate)/miniBatchno
   63
                       Wupdate = (np.dot(gradient.reshape(-1,1),y.reshape(1,-1)))
   64
                       Whatupdate = (np.dot(gradienthat.reshape(-1,1),img.reshape(-1,1).T)[:-1
   65
   66
                   else:
                       Wupdate += (np.dot(gradient.reshape(-1,1),y.reshape(1,-1)))
   67
                       Whatupdate += (np.dot(gradienthat.reshape(-1,1),img.reshape(-1,1).T)[:-
   68
               lblss = np.array(lblss)
   69
   70
               trainouts = np.array(trainouts)
   71
               classificationError = classError(trainouts, lblss)
               errorsForClassification.append(classificationError)
   72
   73
   74
               errorsForEpochs = np.array(errorsForEpochs)
   75
               mse=calculatemse(errorsForEpochs,o).reshape(-1,1)
   76
               errorsFormse.append(float(mse))
   77
               WtT = W.T[:-1].T
   78
               WthatT = (What.T[:-1]).T
   79
   80
               errorsForEpochsTest = list()
   81
               testouts = list()
               for i in range(testdata.shape[0]):
   82
   83
                   # forward propagate
   84
                   imgT = testdata[i][:-1]
                   lblT = testlbls[i]
   85
   86
                   #
   87
                   dT = np.zeros(2)
                   lblT = trainlbls[i]
   88
                   dT[int(lblT)] = 1
   89
   90
   91
                   vhatT =np.dot(WthatT,imgT).reshape(1,-1)
   92
                   yT = activation(vhatT).T
   93
   94
                   vT = np.dot(WtT, yT)
   95
                   oT = activation(vT)
   96
   97
                   eT = dT - oT
   98
                   testouts.append(oT)
   99
                   errorsForEpochsTest.append(eT)
               # lbls = np.array(lbls)
  100
  101
               testouts = np.array(testouts)
  102
               testclassifications = classError(testouts, testlbls)
               errorsForTestClassifications.append(testclassifications)
  103
  104
  105
               errorsForEpochsTest = np.array(errorsForEpochsTest)
  106
               msetest = calculatemse(errorsForEpochsTest,o).reshape(-1,1)
               errorsForTestmse.append(float(mse))
  107
               if testclassifications>72:
  108
  109
                   break
  110
           # Adjusting weight matrices by de-concetanating the bias term
  111
           print("Train mean squared errors for epochs")
  112
           errorsFormse= np.array(errorsFormse)
            14 1 4/
```

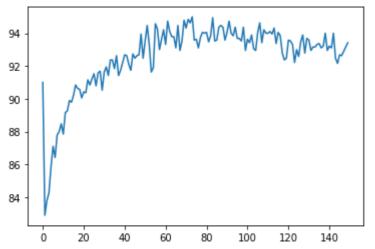
```
12.02.2020
                                              NN2.ipynb - Colaboratory
          plt.plot(errorsFormse)
  113
  114
          plt.show()
  115
          print("Train percentage classification errors for epochs")
  116
          errorsForClassification = np.array(errorsForClassification)
          plt.plot(errorsForClassification)
  117
  118
          plt.show()
  119
          print("Test mean squared errors for epochs")
  120
          errorsForTestmse = np.array(errorsForTestmse)
  121
          plt.plot(errorsForTestmse)
  122
          plt.show()
  123
          print("Test percentage classification errors for epochs")
  124
          errorsForTestClassifications = np.array(errorsForTestClassifications)
  125
          plt.plot(errorsForTestClassifications)
  126
          plt.show()
          print("Maximum accuracy is obtained at epoch:"+str(np.argmax(errorsForTestClassific
  127
    1 # hiddenNo,epochno,minibatchno,learningrate,alpha
    3 runNetwork(30,100,30,0.3,0)
    4 runNetwork(150,200,40,0.5,0)
    5 runNetwork(30,300,60,0.3,0)
```

Hidden layer number:50 Learning rate:0.2 Epoch number:150 Batch size:10 Training started. Time: Sun Nov 17 19:24:33 2019

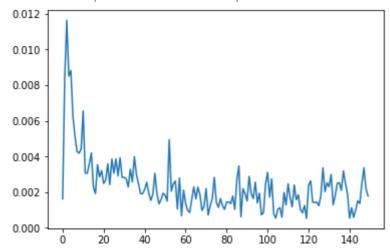
Epoch no: 149 in 150 Time: Sun Nov 17 19:29:00 2019Train mean squared errors for epoc



Train percentage classification errors for epochs

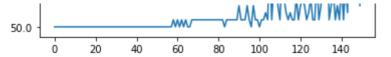


Test mean squared errors for epochs



Test percentage classification errors for epochs



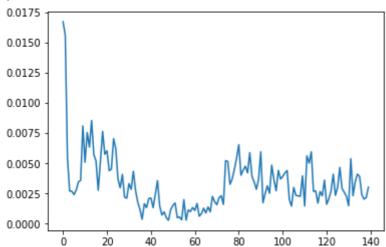


Maximum accuracy is obtained at epoch:144 as 52.8000000000000004%

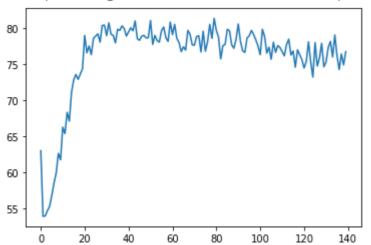
Hidden layer number:30 Learning rate:0.3 Epoch number:140 Batch size:30

Training started. Time: Sun Nov 17 19:29:04 2019

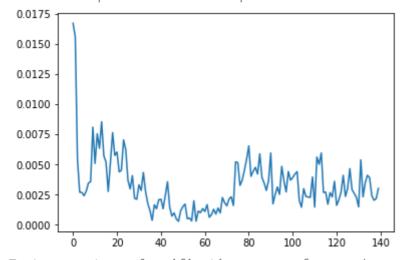
Epoch no: 139 in 140 Time: Sun Nov 17 19:32:17 2019Train mean squared errors for epoc



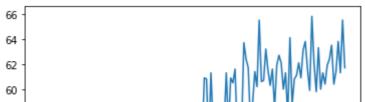
Train percentage classification errors for epochs

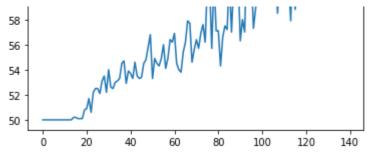


Test mean squared errors for epochs



Test percentage classification errors for epochs



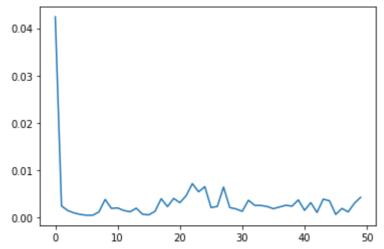


Maximum accuracy is obtained at epoch:124 as 65.8%

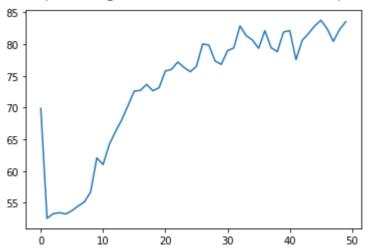
Hidden layer number:150 Learning rate:0.5 Epoch number:50 Batch size:40

Training started. Time: Sun Nov 17 19:32:20 2019

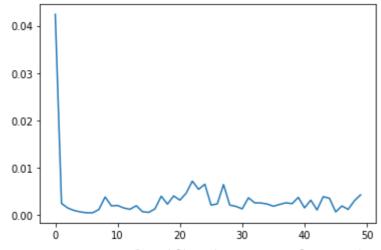
Epoch no: 49 in 50 Time: Sun Nov 17 19:34:41 2019Train mean squared errors for epochs



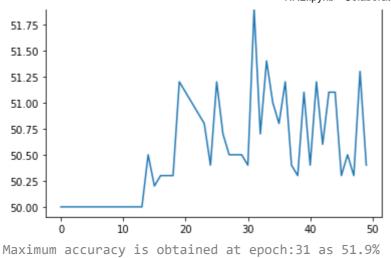
Train percentage classification errors for epochs



Test mean squared errors for epochs



Test percentage classification errors for epochs

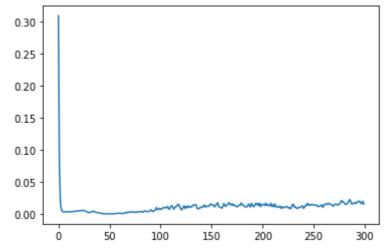


1 runNetwork(30,300,60,0.3,0)

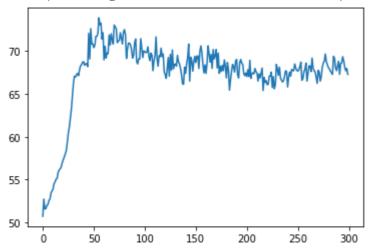
Ŀ

Hidden layer number:30 Learning rate:0.3 Epoch number:300 Batch size:60 Training started. Time: Sun Nov 17 19:58:30 2019

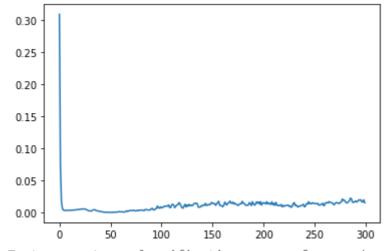
Epoch no: 299 in 300 Time: Sun Nov 17 20:05:25 2019Train mean squared errors for epoc



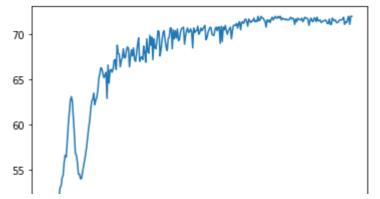
Train percentage classification errors for epochs



Test mean squared errors for epochs



Test percentage classification errors for epochs



```
50 - 0 50 100 150 200 250 300
```

Maximum accuracy is obtained at epoch: 207 as 72.0%

```
1 def runNetwork2(hidden1No,hidden2No,epochno,miniBatchno,learningrate,alpha):
       print("Hidden1 layer number:"+str(hidden1No)+" Hidden2 layer number:"+str(hidden2No
 2
 3
       # handling array constructions
       traindata,trainlbls,testdata,testlbls = formdata()
 4
 5
      What1= np.random.normal(0, 1/1025,(hidden1No,1024))
 6
       bhat1 = np.random.normal(0, 1/1025,(hidden1No)).reshape(-1,1)
 7
       What1 =np.hstack((What1, bhat1))
 8
 9
      What2= np.random.normal(0, 1/hidden1No,(hidden2No,hidden1No))
10
       bhat2 = np.random.normal(0, 1/1/hidden1No,(hidden2No)).reshape(-1,1)
11
      What2 =np.hstack((What2, bhat2))
12
13
14
      W= np.random.normal(0, 1/hidden2No,(2,hidden2No))
15
       b = np.random.normal(0, 1/hidden2No,(2)).reshape(1,-1)
      W =np.hstack((W, b.T))
16
17
18
       errorsFormse = list()
19
       errorsForClassification = list()
20
       errorsForTestClassifications = list()
       errorsForTestmse = list()
21
       # Start training process
22
23
       for epoch in range(epochno):
           errorsForEpochs = list()
24
25
           # display epoch index and current time
           if epoch==0:
26
27
               print("Training started. Time: "+time.ctime())
           title = ("\r"+"Epoch no: "+str(epoch)+" in "+str(epochno))
28
           sys.stdout.write(title +" Time: " +time.ctime())
29
           sys.stdout.flush()
30
31
           time.sleep(1)
           lbls = list()
32
           trainouts = list()#-----
33
34
           for iterateno in range(1900):
35
               # forward propagate
               # handling array constructions
36
               i = random.randrange(traindata.shape[0])
37
38
               img = traindata[i]
               d = np.zeros(2)
39
               lbl = trainlbls[i]
40
41
               lbls.append(lbl)
               d[int(lbl)] = 1
42
43
               # activate hidden1 layer
44
               vhat1 = list(np.dot(What1,img))
45
               vhat1.append(-1)
               vhat1 = np.array(vhat1,dtype = float)
46
47
               y1 = activation(vhat1).T
               # activate hidden2 layer
48
49
               vhat2 = list(np.dot(What2,y1))
50
               vhat2.append(-1)
```

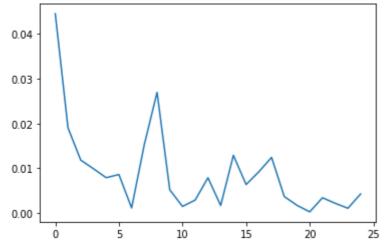
```
12.02.2020
                                              NN2.ipynb - Colaboratory
   51
                  vhat2 = np.array(vhat2,dtype = float)
   52
                  v2 = activation(vhat2).T
   53
                  # activate output layer
   54
                  v = np.dot(W,y2)
   55
                  o = activation(v)
   56
                  trainouts.append(o)#-----
   57
                  e = (d-o)/1900
   58
                  errorsForEpochs.append(e)
                  # back propagate
   59
   60
                  # back propagate the output layer
                  Tprime = activation(v,deriv = True)*np.identity(2,dtype=float)
   61
                  gradient = (np.dot(Tprime,e))
   62
   63
                  # back propagate the hidden2 layer
   64
                  Tprimehat2 = activation(vhat2,deriv = True)*np.identity(hidden2No+1,dtype =
                  gradienthat2 = (np.dot((np.dot(Tprimehat2,W.T))),gradient))
   65
                  # back propagate the hidden1 layer
   66
                  Tprimehat1 = activation(vhat1,deriv = True)*np.identity(hidden1No+1,dtype =
   67
                  gradienthat1 = (np.dot((np.dot(Tprimehat1,What2.T)),gradienthat2[:-1]))
   68
   69
                  # mini batch updates
   70
                  if iterateno%miniBatchno== 0:
   71
                       Wupdate = (np.dot(gradient.reshape(-1,1),y2.reshape(1,-1)))
   72
   73
                      What2update = (np.dot(gradienthat2.reshape(-1,1),y1.reshape(-1,1).T)[:-
   74
                      What1update = (np.dot(gradienthat1.reshape(-1,1),img.reshape(-1,1).T)[:
   75
   76
                       if not(iterateno==0 and epoch==0):#The first iteration of the first epo
   77
                       # batch updates
                          Wold = W
   78
   79
                           W +=normalize(learningrate*(Wupdate))/miniBatchno
   80
                           W = normalize(W)
                           W +=alpha*((W-Wold))
   81
                           W = normalize(W)
   82
   83
                           What2old = What2
   84
   85
                           What2+=normalize(learningrate*(What2update))/miniBatchno
                           What2 = normalize(What2)
   86
   87
                           What2+=alpha*((What2-What2old))
   88
                           What2 = normalize(What2)
   89
                           What1old = What1
   90
                           What1+= normalize(learningrate*(What1update))/miniBatchno
   91
   92
                           What1 = normalize(What1)
   93
                           What1+= alpha*((What1-What1old))
   94
                           What1 = normalize(What1)
   95
                  else:
                      Wupdate += (np.dot(gradient.reshape(-1,1),y2.reshape(1,-1)))
   96
   97
                      What2update += (np.dot(gradienthat2.reshape(-1,1),y1.reshape(1,-1))[:-1
                      What1update += (np.dot(gradienthat1.reshape(-1,1),img.reshape(-1,1).T)[
   98
              lbls = np.array(lbls)
   99
  100
              trainouts = np.array(trainouts)
              classificationError = classError(trainouts,lbls)
  101
              errorsForClassification.append(classificationError)
  102
  103
  104
              errorsForEpochs = np.array(errorsForEpochs)
  105
              mse=calculatemse(errorsForEpochs,o).reshape(-1,1)
```

```
161 plt.show()
162 print("Maximum accuracy is obtained at epoch:"+str(np.argmax(errorsForTestClassific

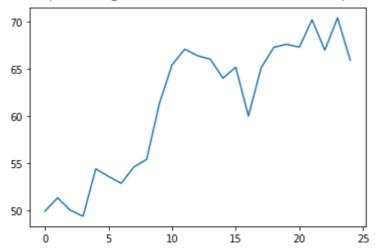
1 # hiddenNo1,hiddenNo2,epochno,minibatchno,learningrate
2 runNetwork2(300,100,600,40,0.2,0)
3
4 runNetwork2(100,75,100,60,0.15,0.1)
5
6 runNetwork2(150,50,300,100,0.13,0.15)

□
```

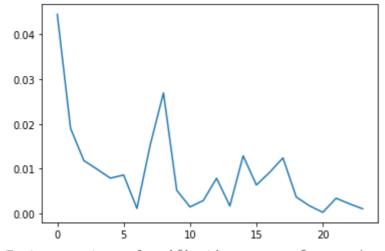
Hidden1 layer number:300 Hidden2 layer number:100 Learning rate:0.2 Epoch number:600 Training started. Time: Sun Nov 17 18:58:31 2019 Epoch no: 24 in 600 Time: Sun Nov 17 19:01:06 2019Train mean squared errors for epoch



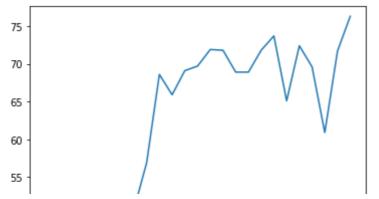
Train percentage classification errors for epochs



Test mean squared errors for epochs



Test percentage classification errors for epochs

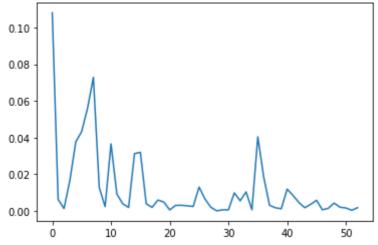




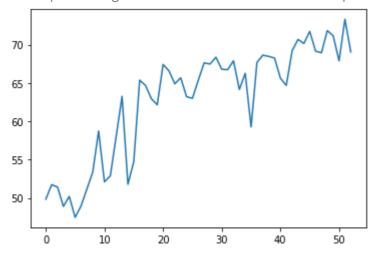
Maximum accuracy is obtained at epoch:24 as 76.3%

Hidden1 layer number:100 Hidden2 layer number:75 Learning rate:0.15 Epoch number:100 Training started. Time: Sun Nov 17 19:01:14 2019

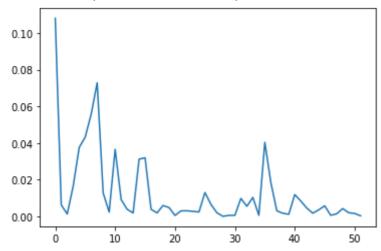
Epoch no: 52 in 100 Time: Sun Nov 17 19:03:36 2019Train mean squared errors for epoch



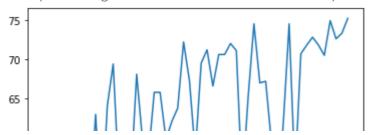
Train percentage classification errors for epochs

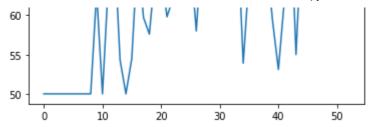


Test mean squared errors for epochs



Test percentage classification errors for epochs

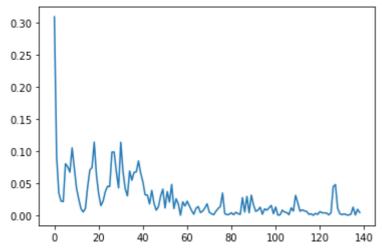




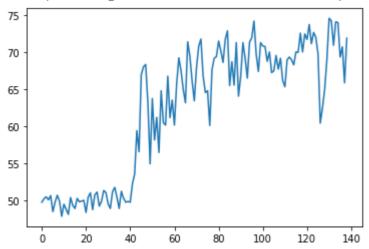
Maximum accuracy is obtained at epoch:52 as 75.2%

Hidden1 layer number:150 Hidden2 layer number:50 Learning rate:0.13 Epoch number:300 Training started. Time: Sun Nov 17 19:03:41 2019

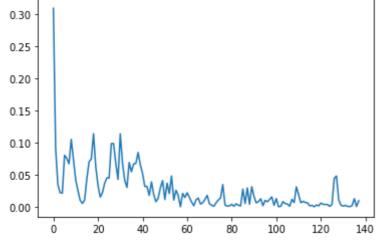
Epoch no: 138 in 300 Time: Sun Nov 17 19:11:14 2019Train mean squared errors for epoc



Train percentage classification errors for epochs

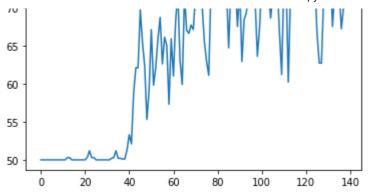


Test mean squared errors for epochs



Test percentage classification errors for epochs





Maximum accuracy is obtained at epoch:138 as 76.0%

```
1 def formdata2():
 2
       Q2data2 = ("/content/assign2_data2.h5")
 3
       trainx,traind,valx,vald,testx,testd,words = organizeData2(Q2data2)
       trainx = np.array(trainx)
 4
 5
       trainx,traind = shuffle3(trainx,traind)
       print("Data for train")
 6
 7
       onehot = []
       for k in range(250):
 8
 9
           i = k+1
10
           index = i+1
           onehot = formonehot(trainx,i)
11
12
           if i == 1:
               onehots = onehot
13
14
           else:
15
               onehots = np.concatenate((onehots, onehot),axis =1)
           title = ("\r"+"Handling dataset, creating embedding matrix:
16
                                                                           "+str(i/250*100)+
           sys.stdout.write(title +" Time: " +time.ctime())
17
           sys.stdout.flush()
18
19
           time.sleep(1)
20
       print("\nData for validation")
21
22
       onehotv = []
23
       for k in range(250):
           i = k+1
24
25
           index = i+1
26
           onehotv = formonehot(valx,i)
           if i == 1:
27
               onehotsv = onehotv
28
29
           else:
30
               onehotsv = np.concatenate((onehotsv, onehotv),axis =1)
31
           title = ("\r"+"Handling dataset, creating embedding matrix: "+str(i/250*100)+
           sys.stdout.write(title +" Time: " +time.ctime())
32
33
           sys.stdout.flush()
34
           time.sleep(1)
35
       print("\nData for test")
36
37
       onehott =[]
38
       for k in range(250):
39
           i = k+1
40
           indext= i+1
           onehott = formonehot(testx,i)
41
42
43
           if i == 1:
```

```
44
               onehotst = onehott
45
           else:
               onehotst = np.concatenate((onehotst, onehott),axis =1)
46
47
           title = ("\r"+"Handling dataset, creating embedding matrix:
                                                                           "+str(i/250*100)+
48
           sys.stdout.write(title +" Time: " +time.ctime())
49
           sys.stdout.flush()
           time.sleep(1)
50
51
       onehots = onehots.T
52
       onehotsv = onehotsv.T
53
54
       onehotst = onehotst.T
55
56
       return onehots, onehotsv, onehotst, traind, vald, testd, words
57
58 def formdata3():
       print("Constructing onehots")
59
       onehots, onehotsv, onehotst, traind, vald, testd, words = formdata2()
60
       firstWord = list()
61
       secondWord=list()
62
63
      thirdWord = list()
       print("Constructing word arrays")
64
       print("Train data")
65
       for i in range(int(len(onehots)/3)):
66
           firstWordIndex = 3*i
67
68
           secondWordIndex = 3*i+1
69
           thirdWordIndex = 3*i+2
70
           firstWord.append(onehots[firstWordIndex])
71
           secondWord.append(onehots[secondWordIndex])
72
73
           thirdWord.append(onehots[thirdWordIndex])
74
       firstWord = np.array(firstWord).T
       secondWord = np.array(secondWord).T
75
76
       thirdWord = np.array(thirdWord).T
77
       print("Validation data")
78
       firstWordv = list()
79
       secondWordv=list()
80
       thirdWordv = list()
       for i in range(int(len(onehotsv)/3)):
81
           firstWordIndex = 3*i
82
           secondWordIndex = 3*i+1
83
84
           thirdWordIndex = 3*i+2
85
           firstWordv.append(onehotsv[firstWordIndex])
86
87
           secondWordv.append(onehotsv[secondWordIndex])
           thirdWordv.append(onehotsv[thirdWordIndex])
88
89
       firstWordv = np.array(firstWordv).T
90
       secondWordv = np.array(secondWordv).T
       thirdWordv = np.array(thirdWordv).T
91
       print("Test data")
92
93
      firstWordt = list()
94
       secondWordt=list()
       thirdWordt = list()
95
96
       for i in range(int(len(onehotst)/3)):
97
           firstWordIndex = 3*i
           secondWordIndex = 3*i+1
98
```

```
12.02.2020
                                                                                                      NN2.ipynb - Colaboratory
        99
                                thirdWordIndex = 3*i+2
      100
                                firstWordt.append(onehotst[firstWordIndex])
      101
      102
                                secondWordt.append(onehotst[secondWordIndex])
                                thirdWordt.append(onehotst[thirdWordIndex])
     103
                       firstWordt = np.array(firstWordt).T
     104
     105
                       secondWordt = np.array(secondWordt).T
     106
                       thirdWordt = np.array(thirdWordt).T
     107
                       return firstWord, secondWord, thirdWord, firstWordv, secondWordv, thirdWordv, firstWordt,
     108
      109
                       # firstWord, secondWord, thirdWord, firstWordv, secondWordv, thirdWordv, firstWordt, secon
          1\ first Word, second Word, third Word, first Wordv, second Wordv, third Wordv, first Wordt, second Wordt, second Wordv, third Wordv, first Wordv, second Wo
          Constructing onehots
                   Data for train
                   Handling dataset, creating embedding matrix:
                                                                                                                             100.0% Time: Sun Nov 17 14:42:16 2019
                   Data for validation
                   Handling dataset, creating embedding matrix:
                                                                                                                             100.0% Time: Sun Nov 17 14:46:42 2019
                   Data for test
                   Handling dataset, creating embedding matrix:
                                                                                                                             100.0% Time: Sun Nov 17 14:51:08 2019C
                   Train data
                   Validation data
                   Test data
          1
          1 print(words[26])
          3 # print(firstWord.shape)
          4 # print(firstWordv.shape)
          5 # print(firstWordt.shape)
          7 # print(firstWord[0])
          8 # print(firstWordt[0])
                 b'only'
          1 # ff = list()
          2 # ss = list()
          3 \# tt = list()
          4 \# dd = list()
          5 # oo = list()
          6 def runNetwork3(D,hidden2No,epochno,miniBatchno,learningrate,alpha):
                       print("Hidden1 layer number:"+str(D)+" Hidden2 layer number:"+str(hidden2No)+" Lear
          7
          8
                       # handling array constructions
          9
        10
        11
                       What1= np.random.normal(0, 1/10,(int(D),250))
        12
                       hidden1No = D
        13
        14
                       What2= np.random.normal(0, 1/hidden1No,(hidden2No,3*D))
                       bhat2 = np.random.normal(0, 1/1/hidden1No,(hidden2No)).reshape(-1,1)
        15
                       What2 =np.hstack((What2, bhat2))
        16
```

```
12.02.2020
                                              NN2.ipynb - Colaboratory
   1/
          W= np.random.normal(0, 1/hidden2No,(250,hidden2No))
   18
          b = np.random.normal(0, 1/hidden2No,(250)).reshape(1,-1)
   19
          W =np.hstack((W, b.T))
   20
   21
   22
          errorsFormse = list()
   23
   24
          errorsForClassification = list()
   25
          errorsForTestClassifications = list()
          errorsForTestmse = list()
   26
   27
          errorsForTestClassificationst = list()
   28
          errorsForTestmset = list()
   29
   30
   31
          # Start training process
          for epoch in range(epochno):
   32
              errorsForEpochs = list()
   33
              # display epoch index and current time
   34
              if epoch==0:
   35
   36
                   print("Training started. Time: "+time.ctime())
   37
              title = ("\r\r"+"Epoch no: "+str(epoch)+" in "+str(epochno))
              sys.stdout.write(title +" Time: " +time.ctime())
   38
   39
              sys.stdout.flush()
   40
              time.sleep(1)
              trainouts = list()#-----
   41
              lbls = list()
   42
   43
              lblst = list()
              for iterateno in range(372500):
   44
                   # forward propagate
   45
   46
                   # handling array constructions
                   i = iterateno
   47
   48
                   firstw = firstWord[i]
   49
   50
                   secondw = secondWord[i]
   51
                  thirdw = thirdWord[i]
   52
   53
                  first = (np.dot(What1,firstw))
                   second = (np.dot(What1, secondw))
   54
                   third = (np.dot(What1,thirdw))
   55
   56
   57
   58
                   d = np.zeros(250)
   59
                   lbl = traind[i]-1
                   lbls.append(lbl)
   60
   61
                   d[int(lbl)] = 1
                   # activate hidden layer
   62
   63
                   vhat1 = np.append(np.concatenate((first, second, third)),([[-1]]))
   64
                   vhat1 = np.array(vhat1)
   65
                   y1 = activation(vhat1).T
   66
                   # activate hidden2 layer
   67
                   vhat2 = np.append(np.dot(What2,y1),([[-1]]))
   68
                   y2 = activation(vhat2).T
   69
   70
                   # activate output layer
   71
                   v = np.dot(W,y2)
    72
```