

Spring 2020 Introduction to Deep Learning

Homework Assignment 3

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Problem Build a FC layer-based neural network to recognize handwritten digits .(NN structure- 784-200-50-10)

Q1: Using the NumPy

Q2: Using Pytorch or other in-Built Frameworks

Code , Discussion and Output(Note Separate Code Files are attached also for testing)

(Q2)_Part 2: Output

```
C:\Users\vikhyat\data_structures_algo\deep_learning_homework>python nn_part2.py
-----Training and Testing using Neural Network----- :
C:\Users\vikhyat\AppData\Local\Programs\Python\Python37\lib\site-packages\torch\nn\modules\container.py:100: UserWarning: Implicit dimension choice for softmax has been deprecated. Change the call to include dim
=X as an argument.
  input = module(input)
The loss is : -0.80729892578125
The success_rate is : 83.41
The loss is : -0.8370771484375
The success_rate is : 85.11
The loss is : -0.9037685546875
The success_rate is : 91.71
The loss is : -0.91907861328125
The success_rate is : 93.17
The loss is : -0.92746943359375
The success_rate is : 93.84
The loss is : -0.93371572265625
The success_rate is : 94.45
The loss is : -0.9373806640625
The success_rate is : 94.89
The loss is : -0.9434142578125
The success_rate is : 95.33
The loss is : -0.94624853515625
The success_rate is : 95.59
The loss is : -0.9489859375
The success_rate is : 95.82
The loss is : -0.9525298828125
The success_rate is : 96.14
The loss is : -0.95251943359375
The success_rate is : 96.2
Total Time taken to train finally at such accuracy : 224.91852283477783
```

Description:

- ✓ Layers as suggested(784-200-50-10)
- ✓ Learning Rate: 0.01
- ✓ Number of epochs=12
- ✓ Momentum used to fasten the training and hence optimisation
- ✓ Cross entropy loss used
- ✓ Achieved more than 96 percent accuracy in about 3 minutes using the above model as target set was for 95 percent

Note :

- a. The code has been attached(nn_part2_vd283.py)
- b. Please take care of the data in the same file etc for proper execution

Q1:-

Part 3 (Using the batch based method for training with several optimisations of momentum , reularisation error) :

Using Numpy:

```
C:\Users\vikhyat\data_structures_algo\deep_learning_homework>python nn_part3.py
The Total average loss after the epoch number 0 is : 1.3460591576958802
The Total average loss after the epoch number 1 is : 0.5211988734654709
The Total average loss after the epoch number 2 is : 0.36518327105380083
The Total average loss after the epoch number 3 is : 0.2836718869999016
The Total average loss after the epoch number 4 is : 0.22552029754277828
The Total average loss after the epoch number 5 is : 0.1816339393686411
The Total average loss after the epoch number 6 is : 0.14854695709213922
The Total average loss after the epoch number 7 is : 0.12606105804484005
The Total average loss after the epoch number 8 is : 0.10591229768404455
The Total average loss after the epoch number 9 is : 0.09419987002470027
Training accuracy : 0.9743
Training Time taken: 38.8444926738739
```

Description:

- ✓ Layers as suggested(784-200-50-10)
- ✓ Learning Rate: 0.01
- ✓ Number of epochs=10
- ✓ Momentum used to fasten the training and hence optimisation parameter=0.8
- ✓ Regularisation error has also been added with parameter
- ✓ Cross entropy loss used

Achieved more than 97 percent accuracy in just 38 seconds using the above model as target set was for 95 percent

Note :

- a. The code has been attached.(nn_part3_vd283.py)
- b. Please take care of the data in the same file etc for proper execution
- c. Note that I have transposed the images of size 784 in the columns not as rows so much W matrices sizes will be like this only.
- d. Layers of relu , softmax etc used as asked in the neural networks requirements

Part 1:

In this , I have done is the plain vanilla – NUMPY based Neural Network:-

Where there is :

- a. Regularistaion error added for optimisation
- b. Whole Training batch is used in One epoch so it is not the Batch based training
- c. Structure is same
- d. Learning Rate: 0.01
- e. Regularistaion parameter : 1e-3
- f. Total 500 iterations have been tried
- g. Above 96 percent accuracy achieved.

Note :

- a. The code has been attached.(nn_part1_vd283.py)
- b. Please take care of the data in the same file etc for proper execution
- c. Note that I have transposed the images of size 784 in the columns not as rows so much W matrices sizes will be like this only.
- d. Layers of relu , softmax etc used as asked in the neural networks requirements
- e. Note : As suggested I will use the further optimistaions like moving avearges , RMS Prop , Drop Outs , Adams Optimisation etc on it with batch Normalisation etc to make it better.
- f. Note This is my observation only that learning rate is still high as some jitters in loss patern are seen so – In further projects where we have to do deep analysis then I will come forward with that.
- g. Further its trace has been attached.

```
The Total loss in these 498 iterations is : 0.11653542107016293
The Total loss in these 499 iterations is : 0.11636491575379192
Training accuracy : 0.9652
Training Time taken: 686.9028334617615
Testing Time taken: 0.1478290557861328
C:\Users\vikhyat\data_structures_algo\deep_learning_homework>
```

Thanks professor that in such quick time learn so much about deep learning/neural network , I have really learnt a lot.I personally request Professor to provide the feedback for this homework. Thanks again.

Trace:

```
C:\Users\vikhyat\data_structures_algo\deep_learning_homework>python nn_part1.py
```

The Total loss in these 0 iterations is : 2.3072621842095367

The Total loss in these 1 iterations is : 2.2772959366218464

The Total loss in these 2 iterations is : 2.2480381763375616

The Total loss in these 3 iterations is : 2.216407784333007

The Total loss in these 4 iterations is : 2.179919570653319

The Total loss in these 5 iterations is : 2.136448539443011

The Total loss in these 6 iterations is : 2.0839830031687794

The Total loss in these 7 iterations is : 2.0207405637297855

The Total loss in these 8 iterations is : 1.9452677190392749

The Total loss in these 9 iterations is : 1.856293609462743

The Total loss in these 10 iterations is : 1.7530803607121572

The Total loss in these 11 iterations is : 1.636161730424199

The Total loss in these 12 iterations is : 1.508514850593647

The Total loss in these 13 iterations is : 1.376122024236836

The Total loss in these 14 iterations is : 1.2470986662892867

The Total loss in these 15 iterations is : 1.1291114011162688

The Total loss in these 16 iterations is : 1.026950545435767

The Total loss in these 17 iterations is : 0.9424469342938476

The Total loss in these 18 iterations is : 0.8844054896131262

The Total loss in these 19 iterations is : 0.9949911597438221

The Total loss in these 20 iterations is : 2.3501395359947774

The Total loss in these 21 iterations is : 2.7727780000689215

The Total loss in these 22 iterations is : 2.365452173093601

The Total loss in these 23 iterations is : 1.724744982676587

The Total loss in these 24 iterations is : 1.5061714521058667

The Total loss in these 25 iterations is : 1.2974869967435443

The Total loss in these 26 iterations is : 1.12572217857574

The Total loss in these 27 iterations is : 0.9889654079114194

The Total loss in these 28 iterations is : 0.8842498533300809

The Total loss in these 29 iterations is : 0.8034649013803127

The Total loss in these 30 iterations is : 0.742291309546154

The Total loss in these 31 iterations is : 0.6951157726396716

The Total loss in these 32 iterations is : 0.6569096813505519

The Total loss in these 33 iterations is : 0.6255196359301465

The Total loss in these 34 iterations is : 0.6014288025523833

The Total loss in these 35 iterations is : 0.5958857502383645

The Total loss in these 36 iterations is : 0.68094526370787

The Total loss in these 37 iterations is : 1.2357782427603987

The Total loss in these 38 iterations is : 1.6553432938011348

The Total loss in these 39 iterations is : 0.9062698948899125

The Total loss in these 40 iterations is : 0.6708990715429843

The Total loss in these 41 iterations is : 0.591000070032827

The Total loss in these 42 iterations is : 0.5520920002497405

The Total loss in these 43 iterations is : 0.5257185083250246

The Total loss in these 44 iterations is : 0.505738386459662

The Total loss in these 45 iterations is : 0.4898798485694904

The Total loss in these 46 iterations is : 0.4773454602915049

The Total loss in these 47 iterations is : 0.46790172314340495

The Total loss in these 48 iterations is : 0.46285175278688656

The Total loss in these 49 iterations is : 0.4652845468611694

The Total loss in these 50 iterations is : 0.48491098336886923

The Total loss in these 51 iterations is : 0.540382739302381

The Total loss in these 52 iterations is : 0.6605760681103587

The Total loss in these 53 iterations is : 0.7621963886836574

The Total loss in these 54 iterations is : 0.7074167491351286

The Total loss in these 55 iterations is : 0.5213442250326171

The Total loss in these 56 iterations is : 0.4431456150686585

The Total loss in these 57 iterations is : 0.4213448879688484

The Total loss in these 58 iterations is : 0.40953778447918276

The Total loss in these 59 iterations is : 0.40134197335881927

The Total loss in these 60 iterations is : 0.3947167152328633

The Total loss in these 61 iterations is : 0.38896636519283295

The Total loss in these 62 iterations is : 0.3838706257452824

The Total loss in these 63 iterations is : 0.3792519779746831

The Total loss in these 64 iterations is : 0.37503514152077827

The Total loss in these 65 iterations is : 0.3711526140968364

The Total loss in these 66 iterations is : 0.36754962660972784

The Total loss in these 67 iterations is : 0.36421893684409934

The Total loss in these 68 iterations is : 0.36112494135289724

The Total loss in these 69 iterations is : 0.35827104607835725

The Total loss in these 70 iterations is : 0.355669356007157

The Total loss in these 71 iterations is : 0.35337495307161154

The Total loss in these 72 iterations is : 0.35141749403107697

The Total loss in these 73 iterations is : 0.34996170930447335

The Total loss in these 74 iterations is : 0.3490768146105553

The Total loss in these 75 iterations is : 0.3491842066701691

The Total loss in these 76 iterations is : 0.35041308375858077

The Total loss in these 77 iterations is : 0.35369564861613123

The Total loss in these 78 iterations is : 0.3594196293860782

The Total loss in these 79 iterations is : 0.3693180296869453

The Total loss in these 80 iterations is : 0.38379015260654203

The Total loss in these 81 iterations is : 0.40547399569759807

The Total loss in these 82 iterations is : 0.43024507472959905

The Total loss in these 83 iterations is : 0.4554316363571376

The Total loss in these 84 iterations is : 0.46162120713255406

The Total loss in these 85 iterations is : 0.43842830292656987

The Total loss in these 86 iterations is : 0.3978719797547037

The Total loss in these 87 iterations is : 0.35630415597532916

The Total loss in these 88 iterations is : 0.33360260492972527

The Total loss in these 89 iterations is : 0.3218294886775249

The Total loss in these 90 iterations is : 0.3163138689159465

The Total loss in these 91 iterations is : 0.3128595704143997

The Total loss in these 92 iterations is : 0.3102797813477763

The Total loss in these 93 iterations is : 0.3080739788908886

The Total loss in these 94 iterations is : 0.3060551929380482

The Total loss in these 95 iterations is : 0.3041602989907416

The Total loss in these 96 iterations is : 0.3023495984320807

The Total loss in these 97 iterations is : 0.30060547499539925

The Total loss in these 98 iterations is : 0.2989146461682395

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The Total loss in these 100 iterations is : 0.29567186602400525

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The Total loss in these 102 iterations is : 0.29258761879566897

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The Total loss in these 287 iterations is : 0.16723779897578997

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The Total loss in these 289 iterations is : 0.16654929500668386

The Total loss in these 290 iterations is : 0.16620684591747034

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The Total loss in these 295 iterations is : 0.16451869415473422

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The Total loss in these 297 iterations is : 0.16385436602085243

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The Total loss in these 299 iterations is : 0.16319657311635927

The Total loss in these 300 iterations is : 0.16286992203547696

The Total loss in these 301 iterations is : 0.1625447820077953

The Total loss in these 302 iterations is : 0.1622211253499752

The Total loss in these 303 iterations is : 0.1618987892415743

The Total loss in these 304 iterations is : 0.16157773162441702

The Total loss in these 305 iterations is : 0.16125808434215025

The Total loss in these 306 iterations is : 0.1609397716585468

The Total loss in these 307 iterations is : 0.16062266473790074

The Total loss in these 308 iterations is : 0.16030685790735796

The Total loss in these 309 iterations is : 0.159992609115439

The Total loss in these 310 iterations is : 0.15967978701153665

The Total loss in these 311 iterations is : 0.15936828873592088

The Total loss in these 312 iterations is : 0.15905799973697768

The Total loss in these 313 iterations is : 0.15874887278642485

The Total loss in these 314 iterations is : 0.1584410321013849

The Total loss in these 315 iterations is : 0.15813444220638442

The Total loss in these 316 iterations is : 0.15782894362748093

The Total loss in these 317 iterations is : 0.15752462348137242

The Total loss in these 318 iterations is : 0.15722176751810285

The Total loss in these 319 iterations is : 0.1569200225584976

The Total loss in these 320 iterations is : 0.1566197369262634

The Total loss in these 321 iterations is : 0.1563206139790314

The Total loss in these 322 iterations is : 0.15602293934511957

The Total loss in these 323 iterations is : 0.15572651818012476

The Total loss in these 324 iterations is : 0.15543089803502547

The Total loss in these 325 iterations is : 0.1551366391116815

The Total loss in these 326 iterations is : 0.15484373354068623

The Total loss in these 327 iterations is : 0.1545519956434919

The Total loss in these 328 iterations is : 0.15426159030439596

The Total loss in these 329 iterations is : 0.1539726322839046

The Total loss in these 330 iterations is : 0.15368477109496348

The Total loss in these 331 iterations is : 0.15339802168455957

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The Total loss in these 335 iterations is : 0.15226168384154856

The Total loss in these 336 iterations is : 0.15198061740527008

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