6 - Data Project – Team Winrate - Neural Networks - Summer 2019

June 1, 2020

```
[1]: import numpy as np
     import pandas as pd
     pd.options.display.max_columns=100
     from sklearn.model_selection import train_test_split, cross_val_score,_
      →cross_validate
     import sklearn.metrics
     from sklearn.preprocessing import StandardScaler as SSc
     import torch
     from torch import nn, optim
     from torch.autograd import Variable
     import torch.nn.functional as F
     from torch.utils.data import TensorDataset, DataLoader
     from keras.wrappers.scikit_learn import KerasClassifier
     import matplotlib.pyplot as plt
     import graphviz as gviz
     %matplotlib inline
     #set width of window to preference
     from IPython.core.display import display, HTML
     display(HTML("<style>.container { width:90% !important; }</style>"))
    Using TensorFlow backend.
    C:\Users\Triplea657\anaconda3\lib\site-
    packages\tensorflow\python\framework\dtypes.py:516: FutureWarning: Passing
    (type, 1) or '1type' as a synonym of type is deprecated; in a future version of
    numpy, it will be understood as (type, (1,)) / '(1,)type'.
      _{np\_qint8} = np.dtype([("qint8", np.int8, 1)])
    C:\Users\Triplea657\anaconda3\lib\site-
    packages\tensorflow\python\framework\dtypes.py:517: FutureWarning: Passing
    (type, 1) or '1type' as a synonym of type is deprecated; in a future version of
    numpy, it will be understood as (type, (1,)) / '(1,)type'.
      _np_quint8 = np.dtype([("quint8", np.uint8, 1)])
    C:\Users\Triplea657\anaconda3\lib\site-
    packages\tensorflow\python\framework\dtypes.py:518: FutureWarning: Passing
    (type, 1) or '1type' as a synonym of type is deprecated; in a future version of
    numpy, it will be understood as (type, (1,)) / '(1,)type'.
```

```
_{np\_qint16} = np.dtype([("qint16", np.int16, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorflow\python\framework\dtypes.py:519: FutureWarning: Passing
(type, 1) or '1type' as a synonym of type is deprecated; in a future version of
numpy, it will be understood as (type, (1,)) / (1,)type'.
  _{np\_quint16} = np.dtype([("quint16", np.uint16, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorflow\python\framework\dtypes.py:520: FutureWarning: Passing
(type, 1) or '1type' as a synonym of type is deprecated; in a future version of
numpy, it will be understood as (type, (1,)) / '(1,)type'.
  _np_qint32 = np.dtype([("qint32", np.int32, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorflow\python\framework\dtypes.py:525: FutureWarning: Passing
(type, 1) or '1type' as a synonym of type is deprecated; in a future version of
numpy, it will be understood as (type, (1,)) / '(1,)type'.
  np_resource = np.dtype([("resource", np.ubyte, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorboard\compat\tensorflow_stub\dtypes.py:541: FutureWarning:
Passing (type, 1) or '1type' as a synonym of type is deprecated; in a future
version of numpy, it will be understood as (type, (1,)) / '(1,)type'.
  _{np\_qint8} = np.dtype([("qint8", np.int8, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorboard\compat\tensorflow_stub\dtypes.py:542: FutureWarning:
Passing (type, 1) or '1type' as a synonym of type is deprecated; in a future
version of numpy, it will be understood as (type, (1,)) / '(1,)type'.
  _np_quint8 = np.dtype([("quint8", np.uint8, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorboard\compat\tensorflow_stub\dtypes.py:543: FutureWarning:
Passing (type, 1) or '1type' as a synonym of type is deprecated; in a future
version of numpy, it will be understood as (type, (1,)) / '(1,)type'.
  _{np\_qint16} = np.dtype([("qint16", np.int16, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorboard\compat\tensorflow_stub\dtypes.py:544: FutureWarning:
Passing (type, 1) or '1type' as a synonym of type is deprecated; in a future
version of numpy, it will be understood as (type, (1,)) / '(1,)type'.
  _{np\_quint16} = np.dtype([("quint16", np.uint16, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorboard\compat\tensorflow_stub\dtypes.py:545: FutureWarning:
Passing (type, 1) or '1type' as a synonym of type is deprecated; in a future
version of numpy, it will be understood as (type, (1,)) / '(1,)type'.
  _np_qint32 = np.dtype([("qint32", np.int32, 1)])
C:\Users\Triplea657\anaconda3\lib\site-
packages\tensorboard\compat\tensorflow_stub\dtypes.py:550: FutureWarning:
Passing (type, 1) or '1type' as a synonym of type is deprecated; in a future
version of numpy, it will be understood as (type, (1,)) / '(1,)type'.
  np_resource = np.dtype([("resource", np.ubyte, 1)])
<IPython.core.display.HTML object>
```

```
[2]: #year = "2019"
                                                                         #choose year_
     →to get data from
     #split = "summer"
                                                                         #choose split_
      →to get data from(spring, summer, worlds)
     \#infile = r"C: \Users \Triplea657 \000 \MSCS-335 \2020 \Datasets \League\_"\#path"
     #inf = "-Wrangled.csv"
                                                                         #file to read
     #filein = infile+year+" \setminus "+year+'-'+split+'-'+inf
     #data = pd.read_csv(filein,low_memory=False)
     #data.head(10)
     #changed for submission version
     data = pd.read_csv("Datasets/League_2019/2019-summer-Wrangled.csv", index_col=0,_
      →low_memory=False)
     data.head()
[2]:
        league_CBLoL league_LCK league_LCS league_LEC
                                                          league_LMS gamelength \
                 0.0
                             0.0
                                         1.0
                                                     0.0
                                                                 0.0
                                                                       35.500000
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                                                                 0.0
                                                                        29.700000
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                                                                       31.983333
        result
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                                   fb
                                                                      fd \
                         d
                               а
                                            kpm
                                                     okpm
                                                               ckpm
     0
           1.0 21.0 14.0 52.0 0.0
                                      0.591549 0.394366
                                                          0.985915 0.0
           0.0 14.0 21.0 32.0 1.0 0.394366 0.591549 0.985915 1.0
     1
     2
           1.0
               11.0
                      4.0 25.0 1.0 0.370370 0.134680 0.505051 1.0
                 4.0 11.0 10.0 0.0 0.134680 0.370370 0.505051 0.0
           1.0
                       3.0 26.0 1.0 0.375195 0.093799 0.468994 0.0
           fdtime teamdragkills oppdragkills elementals oppelementals
       12.556633
                             2.0
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     1 12.556633
                             2.0
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     2 12.306967
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     3 12.306967
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     4 10.158933
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        firedrakes waterdrakes earthdrakes airdrakes elders
                                                                oppelders
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                                         1.0
                                                    1.0
                                                            0.0
                                                                       0.0
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                                                                                1.0
     3
               0.0
                            1.0
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                                                                       0.0
               1.0
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                                                    2.0
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        heraldtime ft
                            fttime firstmidouter firsttothreetowers
         13.369417 1.0 15.162683
                                              1.0
                                                                  0.0
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13.369417 0.0 15.162683
                                           0.0
                                                               1.0
    1
    2
        12.377433 1.0 12.791600
                                            1.0
                                                               1.0
        12.377433 0.0 12.791600
                                            0.0
                                                               0.0
    3
        12.242783 0.0 14.386333
                                            1.0
                                                               1.0
       teambaronkills oppbaronkills dmgtochamps dmgtochampsperminute wards \
    0
                  1.0
                                0.0
                                         70545.0
                                                          1987.183099
                                                                      109.0
    1
                  0.0
                                1.0
                                         71736.0
                                                          2020.732394 108.0
    2
                                0.0
                  1.0
                                         51538.0
                                                          1735.286195
                                                                       96.0
    3
                  0.0
                                1.0
                                         38185.0
                                                          1285.690236
                                                                       93.0
    4
                                0.0
                  1.0
                                         49421.0
                                                          1545.211047 143.0
            wpm wardkills
                               wcpm totalgold
                                                 earnedgpm goldspent
                                                                          gspd \
                                       69022.0 1293.464789
    0 3.070423
                     51.0 1.436620
                                                              65108.0 0.110966
    1 3.042254
                     37.0 1.042254
                                       61541.0 1082.732394
                                                              58263.0 -0.110966
                     44.0 1.481481
                                      59081.0 1330.861953
    2 3.232323
                                                           50910.0 0.135867
    3 3.131313
                     41.0 1.380471
                                    45794.0
                                               883.488215 44433.0 -0.135867
                     44.0 1.375717
    4 4.471079
                                       61326.0 1262.351225 54340.0 0.158169
       monsterkillsownjungle monsterkillsenemyjungle
                                                          cspm goldat10 \
    0
                      151.0
                                               24.0 31.802817
                                                                16118.0
                      155.0
                                                4.0 32.985915
    1
                                                                15436.0
    2
                       102.0
                                               56.0 35.656566
                                                               16270.0
    3
                       82.0
                                                0.0 33.265993
                                                               14985.0
                                               18.0 34.299114
    4
                       128.0
                                                               16157.0
       oppgoldat10 gdat10 goldat15 oppgoldat15 gdat15 xpat10 oppxpat10 \
    0
           15436.0
                   682.0
                           24287.0
                                         23616.0
                                                 671.0 19260.0
                                                                   18621.0
           16118.0 -682.0
                                         24287.0 -671.0 18621.0
    1
                           23616.0
                                                                   19260.0
    2
           14985.0 1285.0 27399.0
                                         23026.0 4373.0 19015.0
                                                                  18226.0
    3
           16270.0 -1285.0 23026.0
                                         27399.0 -4373.0 18226.0
                                                                  19015.0
           14365.0 1792.0 26339.0
                                         22782.0 3557.0 19284.0
                                                                  18656.0
       xpdat10 csat10 oppcsat10 csdat10 csat15 oppcsat15
                                                            csdat15
        639.0
                 334.0
                                    18.0
                                            548.0
                           316.0
                                                      535.0
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    1
       -639.0
                 316.0
                           334.0
                                    -18.0
                                            535.0
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       789.0
                316.0
                                  -19.0
                                            509.0
                                                                3.0
    2
                           335.0
                                                      506.0
    3
        -789.0
                 335.0
                           316.0
                                    19.0
                                            506.0
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                                                                -3.0
    4
         628.0
                           305.0
                                    17.0
                                            512.0
                                                    470.0
                                                                42.0
                 322.0
[3]: var = []
    for i in data:
        var.append(i)
    print(var)
    for i, v in enumerate(var):
        print(i, v)
```

```
['league_CBLoL', 'league_LCK', 'league_LCS', 'league_LEC', 'league_LMS',
'gamelength', 'result', 'k', 'd', 'a', 'fb', 'kpm', 'okpm', 'ckpm', 'fd',
'fdtime', 'teamdragkills', 'oppdragkills', 'elementals', 'oppelementals',
'firedrakes', 'waterdrakes', 'earthdrakes', 'airdrakes', 'elders', 'oppelders',
'herald', 'heraldtime', 'ft', 'fttime', 'firstmidouter', 'firsttothreetowers',
'teambaronkills', 'oppbaronkills', 'dmgtochamps', 'dmgtochampsperminute',
'wards', 'wpm', 'wardkills', 'wcpm', 'totalgold', 'earnedgpm', 'goldspent',
'gspd', 'monsterkillsownjungle', 'monsterkillsenemyjungle', 'cspm', 'goldat10',
'oppgoldat10', 'gdat10', 'goldat15', 'oppgoldat15', 'gdat15', 'xpat10',
'oppxpat10', 'xpdat10', 'csat10', 'oppcsat10', 'csat15', 'oppcsat15',
'csdat15']
O league_CBLoL
1 league_LCK
2 league_LCS
3 league_LEC
4 league_LMS
5 gamelength
6 result
7 k
8 d
9 a
10 fb
11 kpm
12 okpm
13 ckpm
14 fd
15 fdtime
16 teamdragkills
17 oppdragkills
18 elementals
19 oppelementals
20 firedrakes
21 waterdrakes
22 earthdrakes
23 airdrakes
24 elders
25 oppelders
26 herald
27 heraldtime
28 ft
29 fttime
30 firstmidouter
31 firsttothreetowers
32 teambaronkills
33 oppbaronkills
34 dmgtochamps
35 dmgtochampsperminute
36 wards
```

```
37 wpm
    38 wardkills
    39 wcpm
    40 totalgold
    41 earnedgpm
    42 goldspent
    43 gspd
    44 monsterkillsownjungle
    45 monsterkillsenemyjungle
    46 cspm
    47 goldat10
    48 oppgoldat10
    49 gdat10
    50 goldat15
    51 oppgoldat15
    52 gdat15
    53 xpat10
    54 oppxpat10
    55 xpdat10
    56 csat10
    57 oppcsat10
    58 csdat10
    59 csat15
    60 oppcsat15
    61 csdat15
[4]: X = data.iloc[:,data.columns != 'gamelength']
     Y = data.iloc[:,data.columns == 'gamelength']
     #transform input data (normalize scaling)
     ssc = SSc()
     Xft = ssc.fit_transform(X)
     X = pd.DataFrame(Xft)
     print("Xtr(Xtrain), Xtst(Xtest), Ytr(Ytrain), Ytst(Ytest) shapes: ")
     Xtr,Xtst,Ytr,Ytst = train_test_split(X,Y.values.ravel(),test_size=0.
      \rightarrow2, random_state=2020)
     print(Xtr.shape, Xtst.shape, Ytr.shape, Ytst.shape)
     Ytr = pd.DataFrame(Ytr)
    Xtr(Xtrain), Xtst(Xtest), Ytr(Ytrain), Ytst(Ytest) shapes:
    (1155, 61) (289, 61) (1155,) (289,)
[5]: x_tr = torch.tensor(Xtr.values.astype(np.float64))
     y_tr = torch.tensor(Ytr.values.astype(np.float32))
     x_tst = torch.tensor(Xtst.values.astype(np.float64))
     y_tst = torch.tensor(Ytst.astype(np.float32))
     btch_sz = 20
```

```
tr_dset = TensorDataset(x_tr,y_tr)
tr_dload = DataLoader(dataset=tr_dset, batch_size=btch_sz, shuffle=True)

tst_dset = TensorDataset(x_tst,y_tst)
tst_dload = DataLoader(dataset=tst_dset, batch_size=btch_sz)
```

```
[6]: '''
     class Swish(torch.autograd.Function):
         @staticmethod
         def forward(ctx, i):
             result = i * torch.sigmoid(i)
             ctx.save_for_backward(i)
             return result
         @staticmethod
         def backward(ctx, grad_output):
             i = ctx.saved\_variables[0]
             sigmoid_i = torch.sigmoid(i)
             return\ grad\_output\ *\ (sigmoid\_i\ *\ (1\ +\ i\ *\ (1\ -\ sigmoid\_i)))
     class swish(nn.Module):
         def forward(self, input_tensor):
             return Swish.apply(input_tensor)
     111
     class resultNet(nn.Module):
         def __init__(self, X_sz, Y_sz, a=0, b=0, c=0, d=0):
             super(resultNet, self).__init__()
             self.inputSize = len(X.columns)
             self.outputSize = len(Y.columns)
             self.hiddenOSize = a
             self.hidden1Size = b
             self.hidden2Size = c
             self.hidden3Size = d
             self.activation = F.selu
             self.outactivation = F.selu
             self.outsquish = torch.sigmoid
             #Connect network
             self.dpth = 0
             if (self.hiddenOSize != 0):
                 self.c1 = nn.Linear(self.inputSize,self.hiddenOSize)
                 self.dpth += 1
                 print("adding layer 1")
```

```
if (self.hidden1Size != 0):
            self.c2 = nn.Linear(self.hiddenOSize,self.hidden1Size)
            self.dpth += 1
            print("adding layer 2")
            if (self.hidden2Size != 0):
                self.c3 = nn.Linear(self.hidden1Size,self.hidden2Size)
                self.dpth += 1
                print("adding layer 3")
                if (self.hidden3Size != 0):
                    self.c4 = nn.Linear(self.hidden2Size,self.hidden3Size)
                    self.dpth += 1
                    print("adding layer 4")
                    self.c5 = nn.Linear(self.hidden3Size,self.outputSize)
                else:
                    self.c4 = nn.Linear(self.hidden2Size,self.outputSize)
            else:
                self.c3 = nn.Linear(self.hidden1Size,self.outputSize)
            self.c2 = nn.Linear(self.hiddenOSize,self.outputSize)
    else:
        self.c1 = nn.Linear(self.inputSize, self.outputSize)
def forward(self, x):
    if (self.dpth == 0):
        out = self.outsquish(self.outactivation(self.c1(x)))
        #print("fwd dpth 0")
    elif (self.dpth == 1):
        x = self.activation(self.c1(x))
        out = self.outsquish(self.outactivation(self.c2(x)))
        #print("fwd dpth 1")
    elif (self.dpth == 2):
        x = self.activation(self.c1(x))
        x = self.activation(self.c2(x))
        out = self.outsquish(self.outactivation(self.c3(x)))
        #print("fwd dpth 2")
    elif (self.dpth == 3):
        x = self.activation(self.c1(x))
        x = self.activation(self.c2(x))
        x = self.activation(self.c3(x))
        out = self.outsquish(self.outactivation(self.c4(x)))
        #print("fwd dpth 3")
    elif (self.dpth == 4):
        x = self.activation(self.c1(x))
        x = self.activation(self.c2(x))
        x = self.activation(self.c3(x))
        x = self.activation(self.c4(x))
```

```
out = self.outsquish(self.outactivation(self.c5(x)))
                 #print("fwd dpth 4")
             return out
     h_{size} = 12
     testNet = resultNet(len(Xtr.columns),len(Ytr.columns),25)
     for p in testNet.parameters():
         print(p)
    adding layer 1
    Parameter containing:
    tensor([[ 0.0388, 0.1013, 0.1157, ..., -0.1052, -0.0967, -0.0428],
            [-0.0092, 0.0366, -0.0787, \dots, 0.0367, -0.0146, -0.0793],
            [0.0820, -0.1232, -0.0910, \ldots, 0.0141, 0.0855, 0.0146],
            [0.0277, 0.0616, -0.0854, \dots, -0.1273, -0.0461, -0.0347],
            [-0.0885, -0.0376, -0.1153, \ldots, 0.0691, 0.1215, -0.0200],
            [0.0332, 0.1149, -0.0170, \dots, -0.0568, -0.1111, -0.0625]],
           requires_grad=True)
    Parameter containing:
    tensor([ 0.0934,  0.0152, -0.0124, -0.1057, -0.0228, -0.0982, -0.1204, -0.0362,
            -0.1142, 0.0463, 0.1173, 0.0019, 0.0323, 0.0397, 0.1117, 0.0472,
            -0.1130, -0.1237, -0.0743, -0.0341, 0.0063, -0.0447, -0.1101, -0.0155,
             0.0611], requires_grad=True)
    Parameter containing:
    tensor([[ 0.1282, 0.1975, -0.1186, 0.1294, -0.0736, 0.1879, -0.0985, 0.0556,
              0.1742, 0.1811, -0.1557, -0.0775, 0.1162, 0.0522, 0.1669, -0.0156,
             -0.0307, -0.1315, -0.0123, -0.1643, -0.0633, -0.1234, -0.0986, -0.1840,
             -0.0619]], requires_grad=True)
    Parameter containing:
    tensor([-0.0972], requires_grad=True)
[7]: def test(model, lss_fn, tst_dload):
         scores = []
         with torch.no_grad():
             model.eval()
             for (x_btch, y_btch) in tst_dload:
                 out_btch = model(x_btch.float())
                 lss = lss_fn(out_btch.float()[:,0], y_btch.long())
                 scores.append(lss.item())
             model.train()
         return np.array(scores).mean()
     test(testNet, nn.MSELoss(), tst_dload)
```

[7]: 1093.6089640299479

```
[8]: rnet = resultNet(Xtr,Ytr)
      print(rnet)
      learn_rate = 1
      inertia = .8
      criterion = nn.MSELoss()
      optimizer = optim.SGD(rnet.parameters(), lr=learn_rate, momentum = inertia)
      gpu_rdy = torch.cuda.is_available()
      if gpu_rdy:
          print("Using GPU")
      else:
          print("Using CPU")
     resultNet(
       (c1): Linear(in_features=61, out_features=1, bias=True)
     Using GPU
 [9]: device = torch.device("cuda" if gpu_rdy else "cpu")
      OGscr = test(rnet, criterion, tst_dload)
      n_{epochs} = 201
      idx = 0
      tr_shp = Xtr.shape[0]
      X_tr = torch.from_numpy(Xtr.values)
      X_tr.to(device)
      t_epochs = 0
[10]: #you can keep iterating this block to continue training the network
      if gpu_rdy:
          print("On_GPU")
      print("\nDisplayed score is MSE on 289 test data points while model is trained ⊔
      →on 1155 training data points\n")
      rnet.train() #just in case
      print("\nUntrained score: {}\n".format(OGscr))
      lr_{-} = lambda epoch: (0.95 ** epoch)/10
```

```
scheduler = optim.lr_scheduler.LambdaLR(optimizer, lr_lambda=lr_)
for epoch in range(n_epochs):
    111
    if idx + btch_sz >= tr_shp:
        idx = 0
    else:
        idx += btch_sz
    x_tr = Variable(x_tr[idx:(idx+btch_sz)].clone())
    1.1.1
    for i, (x_btch, y_btch) in enumerate(tr_dload):
        if gpu_rdy:
            rnet.to(device)
            x_btch = x_btch.cuda()
            y_btch = y_btch.cuda()
        optimizer.zero_grad()
        out_btch = rnet(x_btch.float())
        out_lss = criterion(out_btch, y_btch)
        out_lss.backward()
        optimizer.step()
    t_{epochs} += 1
    rnet.to('cpu')
    scr = test(rnet, criterion, tst_dload)
    if (epoch \%5) == 0:
        print("epoch {:06d} test data score: {}".format(t_epochs,scr))
    t_epochs += 1
```

On_GPU

Displayed score is MSE on 289 test data points while model is trained on 1155 training data points

Untrained score: 1092.8280598958333

epoch 000001 test data score: 1059.9759399414063
epoch 000011 test data score: 1059.7825439453125
epoch 000021 test data score: 1059.7604410807292
epoch 000031 test data score: 1059.7499674479166
epoch 000041 test data score: 1059.7434895833333
epoch 000051 test data score: 1059.7392252604166

```
epoch 000061 test data score: 1059.7361083984374
     epoch 000071 test data score: 1059.733837890625
     epoch 000081 test data score: 1059.732071940104
     epoch 000091 test data score: 1059.7306396484375
     epoch 000101 test data score: 1059.7294759114584
     epoch 000111 test data score: 1059.7285237630208
     epoch 000121 test data score: 1059.7277180989583
     epoch 000131 test data score: 1059.7269856770833
     epoch 000141 test data score: 1059.726416015625
     epoch 000151 test data score: 1059.7258707682292
     epoch 000161 test data score: 1059.7254150390625
     epoch 000171 test data score: 1059.7250244140625
     epoch 000181 test data score: 1059.7246500651042
     epoch 000191 test data score: 1059.72431640625
     epoch 000201 test data score: 1059.724031575521
     epoch 000211 test data score: 1059.7237630208333
     epoch 000221 test data score: 1059.7235188802083
     epoch 000231 test data score: 1059.7233072916667
     epoch 000241 test data score: 1059.7230875651042
     epoch 000251 test data score: 1059.7229085286458
     epoch 000261 test data score: 1059.7227376302083
     epoch 000271 test data score: 1059.7225830078125
     epoch 000281 test data score: 1059.7224283854166
     epoch 000291 test data score: 1059.7222981770833
     epoch 000301 test data score: 1059.72216796875
     epoch 000311 test data score: 1059.7220540364583
     epoch 000321 test data score: 1059.7219401041666
     epoch 000331 test data score: 1059.721834309896
     epoch 000341 test data score: 1059.7217366536458
     epoch 000351 test data score: 1059.7216471354166
     epoch 000361 test data score: 1059.7215576171875
     epoch 000371 test data score: 1059.7214762369792
     epoch 000381 test data score: 1059.7213948567708
     epoch 000391 test data score: 1059.7213216145833
     epoch 000401 test data score: 1059.7212565104167
[11]: tr_scr = test(rnet, criterion, tr_dload)
      print("Score on training data for comparison: {}".format(tr_scr))
```

Score on training data for comparison: 1031.466375942888

C:\Users\Triplea657\anaconda3\lib\site-packages\torch\nn\modules\loss.py:432: UserWarning: Using a target size (torch.Size([20, 1])) that is different to the input size (torch.Size([20])). This will likely lead to incorrect results due to broadcasting. Please ensure they have the same size.

return F.mse_loss(input, target, reduction=self.reduction)

C:\Users\Triplea657\anaconda3\lib\site-packages\torch\nn\modules\loss.py:432: UserWarning: Using a target size (torch.Size([15, 1])) that is different to the input size (torch.Size([15])). This will likely lead to incorrect results due to
broadcasting. Please ensure they have the same size.
 return F.mse_loss(input, target, reduction=self.reduction)

[]: