

```
1 import torch
2 import torch.nn as nn
3 import torch.nn.functional as F
4 import torch.optim as optim
5 from torch.utils.data import DataLoader, Subset
6
7 import torchvision
8 from torchvision.datasets import MNIST
9 from torchvision import transforms
10
11 import numpy as np
12 import pandas as pd
13 import seaborn as sns
14
15 DEBUG_MODE = True
16 def pp(s):
17     if(DEBUG_MODE):
18         print(s)
19
20 class Net(nn.Module):
21
22     def __init__(self, depth, alpha, width, initVariance):
23         super(Net, self).__init__()
24         self.alpha = alpha
25
26         #self.conv1 = nn.Conv2d(1, 6, 5)
27         #self.conv2 = nn.Conv2d(6, 16, 5)
28
29         self.preLayers = nn.ModuleList()
30         for _ in range(depth):
31             newLayer = nn.Linear(width, width)
32             #pp(f"initVariance: {initVariance}")
33             nn.init.normal_(newLayer.weight, 0, np.sqrt(initVariance))
34             self.preLayers.append(newLayer)
35
36         self.outputLayer = nn.Linear(width, 1)
37         self.outSig = nn.Sigmoid()
38
39     def forward(self, x):
40
41         x = torch.flatten(x, 2, 3)
42
43         for l in self.preLayers:
44             x = F.leaky_relu(l(x), self.alpha)
45
46         x = F.leaky_relu(self.outputLayer(x), self.alpha)
47
48         return torch.squeeze(self.outSig(x))
49
50
```

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51     def fit(self, batches, learningRate, epochs_n=5): # TODO: change back to 10
52         loss_per_epoch = []
53
54         optimizer = optim.SGD(self.parameters(), lr=learningRate)
55         lossFn = nn.BCELoss()
56
57         for i in range(epochs_n):
58             batch_loss = 0
59
60             self.train()
61             for image, label in batches:
62                 optimizer.zero_grad()
63                 y_hat = self(image)
64                 #pp(f"y_hat: {y_hat}" )
65                 #pp(f"label: {label}" )
66                 loss = lossFn(y_hat, label.float())
67                 loss.backward()
68                 optimizer.step()
69                 #pp(f"loss: {loss}")
70                 batch_loss += loss.item()
71
72             loss_per_epoch.append(batch_loss)
73
74         return loss_per_epoch
75
76 # setup data
77 trainDataRaw = MNIST(
78     root='data',
79     train=True,
80     transform=transforms.Compose([
81         transforms.Resize(16),
82         transforms.ToTensor(),
83     ]),
84     download=True
85 )
86
87
88 def addToDf(df: pd.DataFrame, history, actType):
89     for i, loss in enumerate(history):
90         new_row = pd.DataFrame(columns=df.columns)
91         new_row.loc[0] = [i, loss, actType]
92         df = pd.concat([df, new_row], ignore_index=True)
93
94     return df
95
96 def plotResults(df, d, a, lr):
97     sns.color_palette("Set2")
98
99     df['Loss'] = np.log(df['Loss'].astype(float))
100

```

```
101     title = f"Loss per Epoch with alpha={a} and depth={d}"
102     plot = sns.lineplot(
103         data=df, x="Epoch", y="Loss", hue="ActivationType", ci=None
104     ).set_title(title)
105     plot.figure.savefig(f"{title}_{d}_{a}.png")
106     plot.figure.clf()
107
108     ##### DO THE STUFF #####
109     batchSize = 64
110     width = 256
111     depths = [10, 20, 30, 40]
112     alphas = [2, 1, 0.5, 0.1]
113
114     keepIdxs = (trainDataRaw.targets==0) | (trainDataRaw.targets==1)
115     trainDataRaw.targets = trainDataRaw.targets[keepIdxs]
116     trainDataRaw.data = trainDataRaw.data[keepIdxs]
117
118     trainBatches = DataLoader(trainDataRaw, batch_size=batchSize, shuffle=True)
119
120     initFuncs = {
121         "relu": (lambda alpha: 2/width),
122         "prelu": (lambda alpha: 2/(width*(1 + alpha**2))),
123     }
124
125     history = []
126     learningRate = 0.01
127
128     for depth in depths:
129         for alpha in alphas:
130
131             historyDf = pd.DataFrame(columns=[
132                 "Epoch", "Loss", "ActivationType"
133             ])
134
135             for activationType, initFunc in initFuncs.items():
136                 net = Net(depth, alpha, width, initFunc(alpha))
137                 losses = net.fit(trainBatches, learningRate, epochs_n=5)
138                 pp(f"Losses: {losses}")
139                 historyDf = addToDf(historyDf, losses, activationType) # TODO
140
141             print(historyDf.head())
142             plotResults(historyDf, d=depth, a=alpha, lr=learningRate)
```