```
In [1]: # Library imports.
    import matplotlib.pyplot as plt
    import numpy as np
    import torch
    from mpl_toolkits.mplot3d import Axes3D

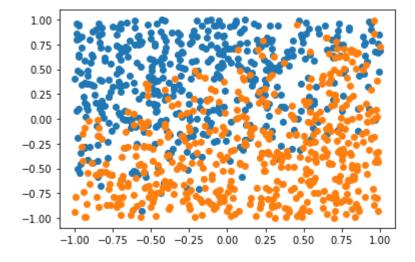
# Repository imports.
    import DataGenerator
    import LocalNetBase
    import network
    import train
```

## Visualize random halfspace data

Note: For the clearest separation, set dim = 2 (we only plot the first two dimensions here).

```
In [2]: dim = 3
    n = 1000
    points, labels = DataGenerator.random_halfspace_data(dim, n)
    print('points:', points.shape, points.dtype)
    print('labels:', labels.shape, labels.dtype)
    ones = labels
    zeros = np.invert(labels)
    plt.scatter(points[:, 0][ones], points[:, 1][ones])
    plt.scatter(points[:, 0][zeros], points[:, 1][zeros])
    plt.show()
```

points: (1000, 3) float64
labels: (1000,) bool

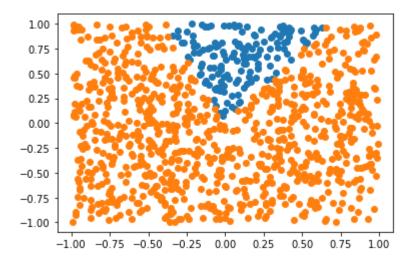


### Visualize random ReLU data

Note: Sometimes, all points end up having the same label.

```
In [13]: dim = 2
    n = 1000
    k = 10
    points, labels = DataGenerator.layer_relu_data(dim, n, k)
    print('points:', points.shape, points.dtype)
    print('labels:', labels.shape, labels.dtype)
    ones = labels.astype(np.bool)
    zeros = np.invert(ones)
# ax.scatter(points[:, 0][ones], points[:, 1][ones], labels[ones])
# ax.scatter(points[:, 0][zeros], points[:, 1][zeros], labels[zeros])
    plt.scatter(points[:, 0][zeros], points[:, 1][ones])
    plt.scatter(points[:, 0][zeros], points[:, 1][zeros])
    plt.show()
```

points: (1000, 2) float32 labels: (1000,) int64



### **Visualize MNIST**

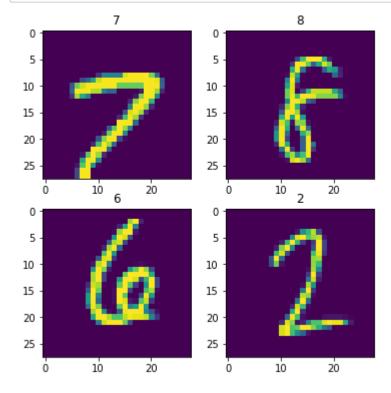
```
In [4]: import torchvision
    import torchvision.datasets
    mnist_train = torchvision.datasets.MNIST(root='./data', train=True, download=T
    rue, transform=None)
    mnist_test = torchvision.datasets.MNIST(root='./data', train=False, download=T
    rue, transform=None)
    print('mnist_train:', len(mnist_train))
    print('mnist_test:', len(mnist_test))
```

mnist\_train: 60000
mnist\_test: 10000

```
In [5]: X = np.array([np.array(pair[0]) for pair in mnist_train]) / 255.0
    y = np.array([pair[1] for pair in mnist_train])
    X_test = np.array([np.array(pair[0]) for pair in mnist_test]) / 255.0
    y_test = np.array([pair[1] for pair in mnist_test])
    print('X:', X.shape)
    print('y:', y.shape)
    print('Y_test:', X_test.shape)
    print('y_test:', y_test.shape)
    mnist_X, mnist_y, mnist_X_test, mnist_y_test = X, y, X_test, y_test

X: (60000, 28, 28)
    y: (60000,)
    X_test: (10000, 28, 28)
```

```
In [6]: fig, ax = plt.subplots(2, 2, figsize=(6, 6))
    ax[0, 0].imshow(X[123])
    ax[0, 0].set_title(y[123])
    ax[0, 1].imshow(X[456])
    ax[0, 1].set_title(y[456])
    ax[1, 0].imshow(X_test[123])
    ax[1, 0].set_title(y_test[123])
    ax[1, 1].imshow(X_test[456])
    ax[1, 1].set_title(y_test[456])
    plt.show()
```



y test: (10000,)

# **Instantiate and inspect RNN**

This is based on the README. Notes:

- The "rounds" parameter seems to be defined as T-1, so rounds=1 <=> T=2!
- The word "graph" in the code refers to the recurrent portion of the RNN, i.e. the randomly, sparsely connected part, excluding input and output neurons.
- I'm not sure as to what the best options are for which scenario, feel free to experiment with this.

```
In [10]: options = LocalNetBase.Options(
            use input rule = False, # Use an input rule to update input layer weigh
            use_output_rule = False, # Use an output rule to update input layer weig
         hts.
            gd_output_rule = False, # Learn an output rule, or use fixed one. If GD
         is used, set 'use output rule' to True as well.
            use graph rule = True,
            gd_graph_rule = True,
            scheme = LocalNetBase.UpdateScheme(
            cross entropy loss = True, # By default, uses cross entropy loss.
            mse loss = False,
            update misclassified = True, # By default only update weights when we m
         isclassify.
            update_all_edges = False)  # For output rule, update all edges, or on
         ly edge to correct and predicted label.
         local_net = network.LocalNet(n = 4, # number of input features (= dimension)
                                    m = 2, # number of possible labels
                                    num_v = 100, # number of nodes in graph
                                    p = .5, # probability that an edge exists in the
         graph
                                    cap = 50, # choose top 'cap' nodes which fire
                                    rounds = 1, # number of times the graph 'fires'
                                    options = options, update scheme = scheme)
         print('local_net input_rule:')
         print(local net.input_rule) # 2^T, randomly initialized
         print('local net rnn rule:')
         print(local net.get rnn rule()) # 2^T x 2^T, randomly initialized
         print('local_net output_rule:')
         print(local net.get output rule()) # 2^T x 2, all zero
         local net input rule:
         tensor([-0.0347, 0.4027, -1.2018, -0.1318])
        local_net rnn_rule:
         tensor([[ 1.4585, 0.6048, 2.1276, -0.3497],
                [ 0.0055, 2.4536, 0.2799, 0.0368],
                [0.0706, -1.4677, -1.3575, 0.3159],
                [-0.8956, 1.1856, 1.0928, 0.7184]])
         local net output rule:
         tensor([[0., 0.],
                [0., 0.],
                [0., 0.],
                [0., 0.]])
```

## Meta-learn rules using gradient descent on halfspace

```
In [11]: # Generate data.
         dimension = 4
         n = 1000
         X, y = DataGenerator.random halfspace data(dim = dimension, n = 2*n)
         X \text{ test} = X[:n]
         y_{test} = y[:n]
         X = X[n:]
         y = y[n:]
         # Learn rules.
         losses, train_accuracies, test_accuracies = train.train_local_rule(
                                    # Training Examples
             Χ,
                                    # Training Labels
             у,
                                    # The BrainNet
             local net,
             X test = X test,
             y_test = y_test,
             rule_epochs = 100,  # Number of times to run through the data
             epochs = 1,
                                   # Number of time to run through a single batch for
         a single training pass
             batch = 100,
                                   # Number of examples in a batch.
             lr = 1e-2,
                                    # Learning Rate
             verbose = True) # If True, evaluates network on test/train data ea
         ch epoch, otherwise, only once at the end
```

Starting Train Outer epoch 1 Acc of class 0:0.5392 Acc of class 1:0.6899 Train Accuracy: 0.6150 Acc of class 0:0.4865 Acc of class 1:0.7148 Test Accuracy: 0.6050 Current loss: 0.596109508526911 Mean loss so far: 0.596109508526911 Outer epoch 2 Acc of class 0 :0.3722 Acc of class 1:0.8330 Train Accuracy: 0.6040 Acc of class 0:0.3825 Acc of class 1:0.8266 Test Accuracy: 0.6130 Current loss: 0.6663743206130077 Mean loss so far: 0.6312419145699594 Outer epoch 3 Acc of class 0:0.5734 Acc of class 1:0.9066 Train Accuracy: 0.7410 Acc of class 0:0.6258 Acc of class 1:0.8940 Test Accuracy: 0.7650 Current loss: 0.6512995014411166 Mean loss so far: 0.6379277768603452 Outer epoch 4 Acc of class 0 :0.5694 Acc of class 1:0.9642 Train Accuracy: 0.7680 Acc of class 0:0.6112 Acc of class 1:0.9807 Test Accuracy: 0.8030 Current loss: 0.5439445080354621 Mean loss so far: 0.6144319596541243 Outer epoch 5 Acc of class 0:0.6761 Acc of class 1:0.9642 Train Accuracy: 0.8210 Acc of class 0:0.6944 Acc of class 1:0.9518 Test Accuracy: 0.8280 Current loss: 0.6391638048709526 Mean loss so far: 0.61937832869749 Outer epoch 6 Acc of class 0:0.4990 Acc of class 1:0.9503 Train Accuracy: 0.7260 Acc of class 0:0.5239 Acc of class 1:0.9653 Test Accuracy: 0.7530 Current loss: 0.5925962263763748 Mean loss so far: 0.6149146449773041 Outer epoch 7

Acc of class 0 :0.6861

Acc of class 1:0.9404 Train Accuracy: 0.8140 Acc of class 0:0.7006 Acc of class 1:0.9595 Test Accuracy: 0.8350

Current loss: 0.5880016321994728 Mean loss so far: 0.6110699288661854

Outer epoch 8

Acc of class 0:0.5694 Acc of class 1:0.9722 Train Accuracy: 0.7720 Acc of class 0:0.6175 Acc of class 1:0.9750 Test Accuracy: 0.8030

Current loss: 0.5405420637928365 Mean loss so far: 0.6022539457320167

Outer epoch 9

Acc of class 0:0.4769 Acc of class 1:1.0000 Train Accuracy: 0.7400 Acc of class 0:0.5031 Acc of class 1:1.0000 Test Accuracy: 0.7610

Current loss: 0.5120288097304491 Mean loss so far: 0.5922289306207315

Outer epoch 10

Acc of class 0:0.6439 Acc of class 1:0.9125 Train Accuracy: 0.7790 Acc of class 0:0.6819 Acc of class 1:0.9017 Test Accuracy: 0.7960

Current loss: 0.4922573344398608 Mean loss so far: 0.5822317710026443

Outer epoch 11

Acc of class 0:0.5332 Acc of class 1:0.8787 Train Accuracy: 0.7070 Acc of class 0:0.5759 Acc of class 1:0.9152 Test Accuracy: 0.7520

Current loss: 0.5368887363012552 Mean loss so far: 0.5781096769388817

Outer epoch 12

Acc of class 0:0.6700 Acc of class 1:0.9622 Train Accuracy: 0.8170 Acc of class 0:0.7006 Acc of class 1:0.9692 Test Accuracy: 0.8400

Current loss: 0.5069898366851933 Mean loss so far: 0.5721830235844076

Outer epoch 13

Acc of class 0:0.6197 Acc of class 1:0.9423 Train Accuracy: 0.7820 Acc of class 0:0.6549 Acc of class 1:0.9615 Test Accuracy: 0.8140

Current loss: 0.5092796291014715 Mean loss so far: 0.5673443009318742

Outer epoch 14

Acc of class 0:0.7505 Acc of class 1:0.9085 Train Accuracy: 0.8300 Acc of class 0:0.7963 Acc of class 1:0.9287 Test Accuracy: 0.8650

Current loss: 0.4716275105486762 Mean loss so far: 0.5605073873330743

Outer epoch 15

Acc of class 0:0.5614 Acc of class 1:0.9881 Train Accuracy: 0.7760 Acc of class 0:0.6195 Acc of class 1:0.9942 Test Accuracy: 0.8140

Current loss: 0.4710138503492586 Mean loss so far: 0.5545411515341532

Outer epoch 16

Acc of class 0:0.8169 Acc of class 1:0.8549 Train Accuracy: 0.8360 Acc of class 0:0.8545 Acc of class 1:0.8555 Test Accuracy: 0.8550

Current loss: 0.4758845405435837 Mean loss so far: 0.5496251133472426

Outer epoch 17

Acc of class 0:0.6700 Acc of class 1:0.9702 Train Accuracy: 0.8210 Acc of class 0:0.7235 Acc of class 1:0.9807 Test Accuracy: 0.8570

Current loss: 0.46415896060883916 Mean loss so far: 0.5445976925979248

Outer epoch 18

Acc of class 0:0.7002 Acc of class 1:0.8489 Train Accuracy: 0.7750 Acc of class 0:0.6902 Acc of class 1:0.8748 Test Accuracy: 0.7860

Current loss: 0.4722021232371425 Mean loss so far: 0.5405757165223258

Outer epoch 19

Acc of class 0 :0.6922 Acc of class 1 :0.9483 Train Accuracy: 0.8210 Acc of class 0 :0.7505 Acc of class 1 :0.9403 Test Accuracy: 0.8490

Current loss: 0.4577093580002208

Mean loss so far: 0.5362143292316887

Outer epoch 20

Acc of class 0:0.8390 Acc of class 1:0.8787 Train Accuracy: 0.8590 Acc of class 0:0.8857 Acc of class 1:0.8902 Test Accuracy: 0.8880

Current loss: 0.45034233633747994 Mean loss so far: 0.5319207295869782

Outer epoch 21

Acc of class 0:0.8149
Acc of class 1:0.9085
Train Accuracy: 0.8620
Acc of class 0:0.8836
Acc of class 1:0.9441
Test Accuracy: 0.9150

Current loss: 0.45723583861790756 Mean loss so far: 0.5283643062074987

Outer epoch 22

Acc of class 0:0.8028 Acc of class 1:0.8847 Train Accuracy: 0.8440 Acc of class 0:0.8628 Acc of class 1:0.9037 Test Accuracy: 0.8840

Current loss: 0.4521414168084624 Mean loss so far: 0.5248996294166335

Outer epoch 23

Acc of class 0:0.8008 Acc of class 1:0.9105 Train Accuracy: 0.8560 Acc of class 0:0.8524 Acc of class 1:0.9364 Test Accuracy: 0.8960

Current loss: 0.444857911761814 Mean loss so far: 0.5214195547359891

Outer epoch 24

Acc of class 0:0.8008 Acc of class 1:0.8847 Train Accuracy: 0.8430 Acc of class 0:0.8669 Acc of class 1:0.8960 Test Accuracy: 0.8820

Current loss: 0.4478932690018885 Mean loss so far: 0.5183559594970683

Outer epoch 25

Acc of class 0:0.8672 Acc of class 1:0.8986 Train Accuracy: 0.8830 Acc of class 0:0.9064 Acc of class 1:0.9191 Test Accuracy: 0.9130

Current loss: 0.46215890260472714 Mean loss so far: 0.5161080772213746

Outer epoch 26

Acc of class 0:0.8913

Acc of class 1:0.9046 Train Accuracy: 0.8980 Acc of class 0:0.9252 Acc of class 1:0.9249 Test Accuracy: 0.9250

Current loss: 0.44336352049154104 Mean loss so far: 0.5133102096548426

Outer epoch 27

Acc of class 0:0.8109 Acc of class 1:0.9662 Train Accuracy: 0.8890 Acc of class 0:0.8378 Acc of class 1:0.9730 Test Accuracy: 0.9080

Current loss: 0.45299815237598623 Mean loss so far: 0.5110764297556257

Outer epoch 28

Acc of class 0:0.8169 Acc of class 1:0.9185 Train Accuracy: 0.8680 Acc of class 0:0.8462 Acc of class 1:0.9249 Test Accuracy: 0.8870

Current loss: 0.45059688611435994 Mean loss so far: 0.5089164460541519

Outer epoch 29

Acc of class 0:0.8672 Acc of class 1:0.8767 Train Accuracy: 0.8720 Acc of class 0:0.8898 Acc of class 1:0.8940 Test Accuracy: 0.8920

Current loss: 0.4562283423018353 Mean loss so far: 0.507099614890279

Outer epoch 30

Acc of class 0 :0.8008 Acc of class 1 :0.9185 Train Accuracy: 0.8600 Acc of class 0 :0.8358 Acc of class 1 :0.9306 Test Accuracy: 0.8850

Current loss: 0.45777075550479945 Mean loss so far: 0.5054553195774296

Outer epoch 31

Acc of class 0:0.7646 Acc of class 1:0.9543 Train Accuracy: 0.8600 Acc of class 0:0.8420 Acc of class 1:0.9672 Test Accuracy: 0.9070

Current loss: 0.43328481740832414 Mean loss so far: 0.5031272388622973

Outer epoch 32

Acc of class 0 :0.8209 Acc of class 1 :0.8191 Train Accuracy: 0.8200 Acc of class 0 :0.8669 Acc of class 1:0.8459 Test Accuracy: 0.8560

Current loss: 0.45885495124578907 Mean loss so far: 0.5017437298742813

Outer epoch 33

Acc of class 0:0.9115 Acc of class 1:0.8827 Train Accuracy: 0.8970 Acc of class 0:0.9543 Acc of class 1:0.9037 Test Accuracy: 0.9280

Current loss: 0.4539834325780707 Mean loss so far: 0.5002964481380324

Outer epoch 34

Acc of class 0:0.7988 Acc of class 1:0.7972 Train Accuracy: 0.7980 Acc of class 0:0.8462 Acc of class 1:0.7900 Test Accuracy: 0.8170

Current loss: 0.45433750559131647 Mean loss so far: 0.49894471453371725

Outer epoch 35

Acc of class 0:0.7022 Acc of class 1:0.9503 Train Accuracy: 0.8270 Acc of class 0:0.7256 Acc of class 1:0.9557 Test Accuracy: 0.8450

Current loss: 0.4536479759462836 Mean loss so far: 0.4976505220026477

Outer epoch 36

Acc of class 0:0.7847 Acc of class 1:0.8588 Train Accuracy: 0.8220 Acc of class 0:0.8462 Acc of class 1:0.8497 Test Accuracy: 0.8480

Current loss: 0.4554556479594397 Mean loss so far: 0.4964784421681141

Outer epoch 37

Acc of class 0:0.8129 Acc of class 1:0.8966 Train Accuracy: 0.8550 Acc of class 0:0.8607 Acc of class 1:0.8979 Test Accuracy: 0.8800

Current loss: 0.4560492598021953 Mean loss so far: 0.49538576156362985

Outer epoch 38

Acc of class 0:0.7988 Acc of class 1:0.9006 Train Accuracy: 0.8500 Acc of class 0:0.8378 Acc of class 1:0.9171 Test Accuracy: 0.8790

Current loss: 0.47304919723186617

Mean loss so far: 0.49479795723910974

Outer epoch 39

Acc of class 0:0.8048 Acc of class 1:0.8748 Train Accuracy: 0.8400 Acc of class 0:0.8482 Acc of class 1:0.8844 Test Accuracy: 0.8670

Current loss: 0.4673420533998085 Mean loss so far: 0.49409395970476866

Outer epoch 40

Acc of class 0:0.7485 Acc of class 1:0.8529 Train Accuracy: 0.8010 Acc of class 0:0.7859 Acc of class 1:0.8709 Test Accuracy: 0.8300

Current loss: 0.47213378996714156 Mean loss so far: 0.4935449554613281

Outer epoch 41

Acc of class 0:0.8229 Acc of class 1:0.7555 Train Accuracy: 0.7890 Acc of class 0:0.8462 Acc of class 1:0.7457 Test Accuracy: 0.7940

Current loss: 0.4818017053103789

Mean loss so far: 0.49325853472593906

Outer epoch 42

Acc of class 0:0.7324 Acc of class 1:0.9304 Train Accuracy: 0.8320 Acc of class 0:0.7796 Acc of class 1:0.9576 Test Accuracy: 0.8720

Current loss: 0.4536787048298262 Mean loss so far: 0.4923161578236507

Outer epoch 43

Acc of class 0:0.5252 Acc of class 1:0.9622 Train Accuracy: 0.7450 Acc of class 0:0.5364 Acc of class 1:0.9846 Test Accuracy: 0.7690

Current loss: 0.46667562810833985 Mean loss so far: 0.49171986643492255

Outer epoch 44

Acc of class 0:0.7284 Acc of class 1:0.8887 Train Accuracy: 0.8090 Acc of class 0:0.7796 Acc of class 1:0.9114 Test Accuracy: 0.8480

Current loss: 0.48173698322039077 Mean loss so far: 0.49149298272550135

Outer epoch 45

Acc of class 0 :0.7545

Acc of class 1:0.8847 Train Accuracy: 0.8200 Acc of class 0:0.8108 Acc of class 1:0.9114 Test Accuracy: 0.8630

Current loss: 0.46742310564560413 Mean loss so far: 0.4909580965681703

Outer epoch 46

Acc of class 0:0.7324 Acc of class 1:0.8429 Train Accuracy: 0.7880 Acc of class 0:0.7900 Acc of class 1:0.8671 Test Accuracy: 0.8300

Current loss: 0.4707168866704368 Mean loss so far: 0.49051807026604566

Outer epoch 47

Acc of class 0:0.6700 Acc of class 1:0.9602 Train Accuracy: 0.8160 Acc of class 0:0.7443 Acc of class 1:0.9827 Test Accuracy: 0.8680

Current loss: 0.45343786648027723 Mean loss so far: 0.4897291297599655

Outer epoch 48

Acc of class 0:0.8008 Acc of class 1:0.8211 Train Accuracy: 0.8110 Acc of class 0:0.8669 Acc of class 1:0.8189 Test Accuracy: 0.8420

Current loss: 0.4677232140292672 Mean loss so far: 0.48927067318224254

Outer epoch 49

Acc of class 0:0.7485 Acc of class 1:0.9901 Train Accuracy: 0.8700 Acc of class 0:0.7963 Acc of class 1:1.0000 Test Accuracy: 0.9020

Current loss: 0.4698464959763311 Mean loss so far: 0.4888742614025301

Outer epoch 50

Acc of class 0:0.8531 Acc of class 1:0.8151 Train Accuracy: 0.8340 Acc of class 0:0.8815 Acc of class 1:0.8131 Test Accuracy: 0.8460

Current loss: 0.4524223229418311 Mean loss so far: 0.4881452226333161

Outer epoch 51

Acc of class 0:0.7425 Acc of class 1:0.8489 Train Accuracy: 0.7960 Acc of class 0:0.7963 Acc of class 1:0.8632 Test Accuracy: 0.8310

Current loss: 0.46059508284471706 Mean loss so far: 0.4876050238139318

Outer epoch 52

Acc of class 0:0.9034 Acc of class 1:0.8986 Train Accuracy: 0.9010 Acc of class 0:0.9148 Acc of class 1:0.9306 Test Accuracy: 0.9230

Current loss: 0.45136959328516546 Mean loss so far: 0.4869081886114555

Outer epoch 53

Acc of class 0:0.6700 Acc of class 1:0.9026 Train Accuracy: 0.7870 Acc of class 0:0.6819 Acc of class 1:0.9422 Test Accuracy: 0.8170

Current loss: 0.45893336038830945 Mean loss so far: 0.486380361663849

Outer epoch 54

Acc of class 0:0.7767 Acc of class 1:0.9404 Train Accuracy: 0.8590 Acc of class 0:0.8046 Acc of class 1:0.9422 Test Accuracy: 0.8760

Current loss: 0.46078032184262163 Mean loss so far: 0.48590628685234477

Outer epoch 55

Acc of class 0:0.8048 Acc of class 1:0.9105 Train Accuracy: 0.8580 Acc of class 0:0.8565 Acc of class 1:0.9383 Test Accuracy: 0.8990

Current loss: 0.45186108026611577 Mean loss so far: 0.48528728309623154

Outer epoch 56

Acc of class 0:0.7907 Acc of class 1:0.8946 Train Accuracy: 0.8430 Acc of class 0:0.8503 Acc of class 1:0.9056 Test Accuracy: 0.8790

Current loss: 0.45748093909361476 Mean loss so far: 0.484790741239042

Outer epoch 57

Acc of class 0:0.7968 Acc of class 1:0.8748 Train Accuracy: 0.8360 Acc of class 0:0.8524 Acc of class 1:0.9171 Test Accuracy: 0.8860

Current loss: 0.465065300709644

Mean loss so far: 0.4844446808788771

Outer epoch 58

Acc of class 0:0.8189 Acc of class 1:0.9205 Train Accuracy: 0.8700

Acc of class 0 :0.8690

Acc of class 1:0.9326 Test Accuracy: 0.9020

Current loss: 0.4467477571081947 Mean loss so far: 0.4837947339173136

Outer epoch 59

Acc of class 0 :0.8229
Acc of class 1 :0.9006
Train Accuracy: 0.8620
Acc of class 0 :0.8545
Acc of class 1 :0.9480
Test Accuracy: 0.9030

Current loss: 0.4470867633302751 Mean loss so far: 0.483172564924313

Outer epoch 60

Acc of class 0:0.7465 Acc of class 1:0.8986 Train Accuracy: 0.8230 Acc of class 0:0.8150 Acc of class 1:0.9287 Test Accuracy: 0.8740

Current loss: 0.47483982540716874 Mean loss so far: 0.48303368593236057

Outer epoch 61

Acc of class 0:0.7948 Acc of class 1:0.9304 Train Accuracy: 0.8630 Acc of class 0:0.8545 Acc of class 1:0.9383 Test Accuracy: 0.8980

Current loss: 0.4613775267799425 Mean loss so far: 0.4826786669298619

Outer epoch 62

Acc of class 0:0.7847 Acc of class 1:0.8608 Train Accuracy: 0.8230 Acc of class 0:0.8212 Acc of class 1:0.8671 Test Accuracy: 0.8450

Current loss: 0.4669033809955769 Mean loss so far: 0.48242422683414765

Outer epoch 63

Acc of class 0:0.6922 Acc of class 1:0.9105 Train Accuracy: 0.8020 Acc of class 0:0.7277 Acc of class 1:0.9306 Test Accuracy: 0.8330

Current loss: 0.4767349107883896 Mean loss so far: 0.48233392023024674

Outer epoch 64

Acc of class 0 :0.8672

Acc of class 1:0.8907 Train Accuracy: 0.8790 Acc of class 0:0.9044 Acc of class 1:0.8728 Test Accuracy: 0.8880

Current loss: 0.4695239544889895 Mean loss so far: 0.4821337645155395

Outer epoch 65

Acc of class 0:0.8229 Acc of class 1:0.9384 Train Accuracy: 0.8810 Acc of class 0:0.8815 Acc of class 1:0.9595 Test Accuracy: 0.9220

Current loss: 0.4690889137675379 Mean loss so far: 0.48193307450403183

Outer epoch 66

Acc of class 0:0.7606 Acc of class 1:0.9006 Train Accuracy: 0.8310 Acc of class 0:0.8004 Acc of class 1:0.9056 Test Accuracy: 0.8550

Current loss: 0.48173073444724385 Mean loss so far: 0.4819300087455956

Outer epoch 67

Acc of class 0:0.8390 Acc of class 1:0.9105 Train Accuracy: 0.8750 Acc of class 0:0.8794 Acc of class 1:0.9306 Test Accuracy: 0.9060

Current loss: 0.46951119585939

Mean loss so far: 0.48174465332938365

Outer epoch 68

Acc of class 0:0.7364 Acc of class 1:0.8767 Train Accuracy: 0.8070 Acc of class 0:0.8191 Acc of class 1:0.8979 Test Accuracy: 0.8600

Current loss: 0.4598479178813101 Mean loss so far: 0.4814226425139708

Outer epoch 69

Acc of class 0:0.9074 Acc of class 1:0.9384 Train Accuracy: 0.9230 Acc of class 0:0.9127 Acc of class 1:0.9441 Test Accuracy: 0.9290

Current loss: 0.4524302657831744 Mean loss so far: 0.4810024631410607

Outer epoch 70

Acc of class 0:0.7887 Acc of class 1:0.9583 Train Accuracy: 0.8740 Acc of class 0:0.8462 Acc of class 1:0.9730 Test Accuracy: 0.9120

Current loss: 0.44454599335040246 Mean loss so far: 0.4804816564297656

Outer epoch 71

Acc of class 0:0.9557 Acc of class 1:0.8270 Train Accuracy: 0.8910 Acc of class 0:0.9688 Acc of class 1:0.8266 Test Accuracy: 0.8950

Current loss: 0.45963532284091724 Mean loss so far: 0.4801880460975283

Outer epoch 72

Acc of class 0:0.8712 Acc of class 1:0.8370 Train Accuracy: 0.8540 Acc of class 0:0.8940 Acc of class 1:0.8247 Test Accuracy: 0.8580

Current loss: 0.47160528404188085 Mean loss so far: 0.4800688410689775

Outer epoch 73

Acc of class 0:0.7042 Acc of class 1:0.9642 Train Accuracy: 0.8350 Acc of class 0:0.7775 Acc of class 1:0.9846 Test Accuracy: 0.8850

Current loss: 0.4681047482702345

Mean loss so far: 0.47990494938680295

Outer epoch 74

Acc of class 0:0.7465 Acc of class 1:0.8350 Train Accuracy: 0.7910 Acc of class 0:0.8087 Acc of class 1:0.8671 Test Accuracy: 0.8390

Current loss: 0.4710422351450628 Mean loss so far: 0.4797851829781308

Outer epoch 75

Acc of class 0:0.8229 Acc of class 1:0.9423 Train Accuracy: 0.8830 Acc of class 0:0.8524 Acc of class 1:0.9653 Test Accuracy: 0.9110

Current loss: 0.47790371279737737 Mean loss so far: 0.47976009670905406

Outer epoch 76

Acc of class 0:0.7726 Acc of class 1:0.9026 Train Accuracy: 0.8380 Acc of class 0:0.8274 Acc of class 1:0.9056 Test Accuracy: 0.8680

Current loss: 0.4685338468444785

Mean loss so far: 0.47961238289504654

Outer epoch 77

Acc of class 0:0.8008 Acc of class 1:0.8509 Train Accuracy: 0.8260 Acc of class 0:0.8378 Acc of class 1:0.8709 Test Accuracy: 0.8550

Current loss: 0.471065126486213 Mean loss so far: 0.4795013795650617

Outer epoch 78

Acc of class 0:0.8350 Acc of class 1:0.8370 Train Accuracy: 0.8360 Acc of class 0:0.8815 Acc of class 1:0.8054 Test Accuracy: 0.8420

Current loss: 0.46646111853640837 Mean loss so far: 0.479334196731361

Outer epoch 79

Acc of class 0:0.8068 Acc of class 1:0.9046 Train Accuracy: 0.8560 Acc of class 0:0.8607 Acc of class 1:0.9441 Test Accuracy: 0.9040

Current loss: 0.4780167839408224 Mean loss so far: 0.4793175206200884

Outer epoch 80

Acc of class 0:0.9296 Acc of class 1:0.8310 Train Accuracy: 0.8800 Acc of class 0:0.9543 Acc of class 1:0.8651 Test Accuracy: 0.9080

Current loss: 0.47283540592370077 Mean loss so far: 0.4792364941863836

Outer epoch 81

Acc of class 0:0.7706 Acc of class 1:0.7535 Train Accuracy: 0.7620 Acc of class 0:0.8087 Acc of class 1:0.7572 Test Accuracy: 0.7820

Current loss: 0.4634248871910412 Mean loss so far: 0.4790412891617497

Outer epoch 82

Acc of class 0:0.8129 Acc of class 1:0.8728 Train Accuracy: 0.8430 Acc of class 0:0.8545 Acc of class 1:0.8690 Test Accuracy: 0.8620

Current loss: 0.48941471800030334 Mean loss so far: 0.47916779439148816

Outer epoch 83

Acc of class 0:0.8189

Acc of class 1:0.8986 Train Accuracy: 0.8590 Acc of class 0:0.8669 Acc of class 1:0.8902 Test Accuracy: 0.8790

Current loss: 0.4639268817931074 Mean loss so far: 0.4789841689384956

Outer epoch 84

Acc of class 0:0.7887 Acc of class 1:0.8907 Train Accuracy: 0.8400 Acc of class 0:0.8628 Acc of class 1:0.9171 Test Accuracy: 0.8910

Current loss: 0.4649642247843258 Mean loss so far: 0.4788172648414222

Outer epoch 85

Acc of class 0:0.7143 Acc of class 1:0.8390 Train Accuracy: 0.7770 Acc of class 0:0.7755 Acc of class 1:0.8208 Test Accuracy: 0.7990

Current loss: 0.46903569079713303 Mean loss so far: 0.47870218749972465

Outer epoch 86

Acc of class 0:0.8753 Acc of class 1:0.9384 Train Accuracy: 0.9070 Acc of class 0:0.9189 Acc of class 1:0.9075 Test Accuracy: 0.9130

Current loss: 0.47521929071956404 Mean loss so far: 0.47866168869995535

Outer epoch 87

Acc of class 0:0.7445 Acc of class 1:0.8449 Train Accuracy: 0.7950 Acc of class 0:0.8150 Acc of class 1:0.8593 Test Accuracy: 0.8380

Current loss: 0.48528684162871977 Mean loss so far: 0.47873783988304464

Outer epoch 88

Acc of class 0:0.8551 Acc of class 1:0.8449 Train Accuracy: 0.8500 Acc of class 0:0.8960 Acc of class 1:0.8208 Test Accuracy: 0.8570

Current loss: 0.460223837815271

Mean loss so far: 0.47852745349591075

Outer epoch 89

Acc of class 0 :0.8390 Acc of class 1 :0.8509 Train Accuracy: 0.8450 Acc of class 0 :0.8836 Acc of class 1:0.8825 Test Accuracy: 0.8830

Current loss: 0.46372903454862574 Mean loss so far: 0.4783611791257166

Outer epoch 90

Acc of class 0:0.8089 Acc of class 1:0.8370 Train Accuracy: 0.8230 Acc of class 0:0.8503 Acc of class 1:0.8613 Test Accuracy: 0.8560

Current loss: 0.4647389806533905 Mean loss so far: 0.47820982136491297

Outer epoch 91

Acc of class 0:0.8491 Acc of class 1:0.9364 Train Accuracy: 0.8930 Acc of class 0:0.8690 Acc of class 1:0.9653 Test Accuracy: 0.9190

Current loss: 0.45647342496845084 Mean loss so far: 0.47797095986605076

Outer epoch 92

Acc of class 0:0.7887 Acc of class 1:0.8787 Train Accuracy: 0.8340 Acc of class 0:0.8545 Acc of class 1:0.8728 Test Accuracy: 0.8640

Current loss: 0.4648892146822763 Mean loss so far: 0.47782876698361837

Outer epoch 93

Acc of class 0:0.8350 Acc of class 1:0.8449 Train Accuracy: 0.8400 Acc of class 0:0.8732 Acc of class 1:0.8401 Test Accuracy: 0.8560

Current loss: 0.4654724293169682 Mean loss so far: 0.4776959031377404

Outer epoch 94

Acc of class 0:0.7606 Acc of class 1:0.7495 Train Accuracy: 0.7550 Acc of class 0:0.8191 Acc of class 1:0.7322 Test Accuracy: 0.7740

Current loss: 0.48596111266871633 Mean loss so far: 0.4777838308987083

Outer epoch 95

Acc of class 0:0.8189 Acc of class 1:0.8628 Train Accuracy: 0.8410 Acc of class 0:0.8503 Acc of class 1:0.8786 Test Accuracy: 0.8650

Current loss: 0.45670061088758374

Mean loss so far: 0.4775619022670122

Outer epoch 96

Acc of class 0:0.7404 Acc of class 1:0.9463 Train Accuracy: 0.8440 Acc of class 0:0.7859 Acc of class 1:0.9538 Test Accuracy: 0.8730

Current loss: 0.4725946518211397 Mean loss so far: 0.4775101600748677

Outer epoch 97

Acc of class 0:0.6620 Acc of class 1:0.9066 Train Accuracy: 0.7850 Acc of class 0:0.7277 Acc of class 1:0.9326 Test Accuracy: 0.8340

Current loss: 0.4467186725229679

Mean loss so far: 0.47719272205886876

Outer epoch 98

Acc of class 0:0.7545 Acc of class 1:0.9622 Train Accuracy: 0.8590 Acc of class 0:0.7963 Acc of class 1:0.9499 Test Accuracy: 0.8760

Current loss: 0.47274224060579667 Mean loss so far: 0.477147308982817

Outer epoch 99

Acc of class 0:0.7565 Acc of class 1:0.8231 Train Accuracy: 0.7900 Acc of class 0:0.8067 Acc of class 1:0.8516 Test Accuracy: 0.8300

Current loss: 0.47120464772262977 Mean loss so far: 0.47708728210140094

Outer epoch 100

Acc of class 0:0.8209 Acc of class 1:0.8668 Train Accuracy: 0.8440 Acc of class 0:0.8753 Acc of class 1:0.8940 Test Accuracy: 0.8850

Current loss: 0.4633908818166005 Mean loss so far: 0.47695031809855293

```
In [14]:
         # Print rules.
         print('local net input rule:')
         print(local_net.input_rule) # Same as before (cannot be Learned?).
         print('local net rnn rule:')
         print(local net.get rnn rule()) # Learned.
         print('local_net output_rule:')
         print(local net.get output rule()) # Same as before (we specified not to lear
         n this).
         local net input rule:
         tensor([-0.0347, 0.4027, -1.2018, -0.1318])
         local net rnn rule:
         tensor([[ 0.2473, 0.7085,
                                      0.1168,
                                               0.53871,
                  [-0.0520, 0.2540, 0.1201,
                                               0.2609],
                 [-0.1856, -0.0168, 0.4250, 0.1244],
                 [-0.0237, -0.2087,
                                      0.5390, 0.3937]], dtype=torch.float64)
         local_net output_rule:
         tensor([[0., 0.],
                  [0., 0.],
                  [0., 0.],
                 [0., 0.]])
In [15]: # Plot training curves.
         plt.plot(losses, label='losses')
         plt.plot(np.reshape(train_accuracies, -1), label='train_acc')
         plt.plot(np.reshape(test accuracies, -1), label='test acc')
         plt.legend()
         plt.show()
         print('Last outer epoch loss:', losses[-1])
         print('Last outer epoch train_accuracies:', train_accuracies[-1])
         print('Last outer epoch test_accuracies:', test_accuracies[-1])
          0.9
          0.8
          0.7
                                                   train acc
                                                   test acc
          0.5
                       20
                                                       100
         Last outer epoch loss: 0.4633908818166005
         Last outer epoch train accuracies: [0.844]
         Last outer epoch test accuracies: [0.885]
```

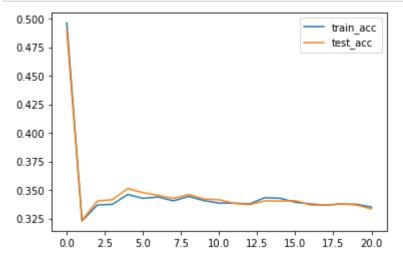
### Train with the already learned rules on a different halfspace

```
In [16]: # Generate data.
         dimension = 4
         n = 5000
         X, y = DataGenerator.random halfspace data(dim = dimension, n = 3*n)
         X \text{ test} = X[:n]
         y_{test} = y[:n]
         X = X[n:]
         y = y[n:]
         # NOTE: This method trains only once over all examples, updating the stats eve
         ry 500 steps.
         train_accuracies, test_accuracies = train.train_given_rule(
                                     # Training Examples
                                     # Training Labels
             у,
                                      # The BrainNet
             local net,
             X_test = X_test,
             y_test = y_test,
                               # If True, evaluates network on test/train data ea
             verbose = True)
         ch epoch, otherwise, only once at the end
```

Train on 0 examples. Acc of class 0 :1.0000 Acc of class 1:0.0000 Train Accuracy: 0.4964 Acc of class 0 :1.0000 Acc of class 1:0.0000 Test Accuracy: 0.4898 Train on 500 examples. Acc of class 0:0.0367 Acc of class 1:0.6050 Train Accuracy: 0.3229 Acc of class 0:0.0433 Acc of class 1:0.5919 Test Accuracy: 0.3232 Train on 1000 examples. Acc of class 0:0.0485 Acc of class 1:0.6207 Train Accuracy: 0.3367 Acc of class 0:0.0519 Acc of class 1:0.6170 Test Accuracy: 0.3402 Train on 1500 examples. Acc of class 0:0.0397 Acc of class 1:0.6309 Train Accuracy: 0.3374 Acc of class 0:0.0445 Acc of class 1:0.6264 Test Accuracy: 0.3414 Train on 2000 examples. Acc of class 0:0.0479 Acc of class 1:0.6398 Train Accuracy: 0.3460 Acc of class 0:0.0531 Acc of class 1:0.6374 Test Accuracy: 0.3512 Train on 2500 examples. Acc of class 0:0.0373 Acc of class 1:0.6436 Train Accuracy: 0.3426 Acc of class 0:0.0416 Acc of class 1:0.6413 Test Accuracy: 0.3476 Train on 3000 examples. Acc of class 0:0.0260 Acc of class 1:0.6571 Train Accuracy: 0.3438 Acc of class 0:0.0298 Acc of class 1:0.6480 Test Accuracy: 0.3452 Train on 3500 examples. Acc of class 0:0.0274 Acc of class 1:0.6489 Train Accuracy: 0.3404 Acc of class 0:0.0306 Acc of class 1:0.6421 Test Accuracy: 0.3426 Train on 4000 examples. Acc of class 0 :0.0258 Acc of class 1:0.6583 Train Accuracy: 0.3443 Acc of class 0:0.0265 Acc of class 1:0.6527 Test Accuracy: 0.3460 Train on 4500 examples. Acc of class 0:0.0230 Acc of class 1:0.6537 Train Accuracy: 0.3406 Acc of class 0:0.0237 Acc of class 1:0.6476 Test Accuracy: 0.3420 Train on 5000 examples. Acc of class 0:0.0232 Acc of class 1:0.6493 Train Accuracy: 0.3385 Acc of class 0:0.0249 Acc of class 1:0.6452 Test Accuracy: 0.3414 Train on 5500 examples. Acc of class 0:0.0210 Acc of class 1:0.6513 Train Accuracy: 0.3384 Acc of class 0:0.0212 Acc of class 1:0.6425 Test Accuracy: 0.3382 Train on 6000 examples. Acc of class 0:0.0193 Acc of class 1:0.6517 Train Accuracy: 0.3378 Acc of class 0:0.0188 Acc of class 1:0.6429 Test Accuracy: 0.3372 Train on 6500 examples. Acc of class 0:0.0203 Acc of class 1:0.6614 Train Accuracy: 0.3432 Acc of class 0:0.0184 Acc of class 1:0.6495 Test Accuracy: 0.3404 Train on 7000 examples. Acc of class 0:0.0222 Acc of class 1:0.6587 Train Accuracy: 0.3427 Acc of class 0:0.0212 Acc of class 1:0.6464 Test Accuracy: 0.3402 Train on 7500 examples. Acc of class 0:0.0224 Acc of class 1:0.6515 Train Accuracy: 0.3392 Acc of class 0:0.0233 Acc of class 1:0.6452 Test Accuracy: 0.3406 Train on 8000 examples. Acc of class 0:0.0234

Acc of class 1:0.6475 Train Accuracy: 0.3377 Acc of class 0:0.0249 Acc of class 1:0.6362 Test Accuracy: 0.3368 Train on 8500 examples. Acc of class 0:0.0240 Acc of class 1:0.6448 Train Accuracy: 0.3366 Acc of class 0:0.0269 Acc of class 1:0.6343 Test Accuracy: 0.3368 Train on 9000 examples. Acc of class 0:0.0232 Acc of class 1:0.6477 Train Accuracy: 0.3377 Acc of class 0:0.0257 Acc of class 1:0.6374 Test Accuracy: 0.3378 Train on 9500 examples. Acc of class 0:0.0236 Acc of class 1:0.6467 Train Accuracy: 0.3374 Acc of class 0:0.0241 Acc of class 1:0.6370 Test Accuracy: 0.3368 Train on 9999 examples. Acc of class 0:0.0238 Acc of class 1:0.6418 Train Accuracy: 0.3350 Acc of class 0:0.0249 Acc of class 1:0.6296 Test Accuracy: 0.3334

# In [17]: # Plot training curves. plt.plot(np.reshape(train\_accuracies, -1), label='train\_acc') plt.plot(np.reshape(test\_accuracies, -1), label='test\_acc') plt.legend() plt.show()



# Meta-learn rules on halfspace, train with fixed rules on MNIST

NOTE: the reason this doesn't work too well is because the actual procedures in the paper are a little more complicated, see **Appendix A.2**. I suspect the halfspace dimension is much less than 28 x 28 (and the number of classes should obviously be 2, not 10), and then the rules are copied across different networks.

Interestingly, even if the upstream accuracy is chance (50%), the downstream training still works...

```
In [18]: options = LocalNetBase.Options(
            use input rule = False, # Use an input rule to update input layer weigh
         ts.
            use output rule = True, # Use an output rule to update input layer weigh
         ts.
            gd output rule = True, # Learn an output rule, or use fixed one. If GD
          is used, set 'use output rule' to True as well.
            use graph rule = True,
            gd_graph_rule = True,
            # ==== TODO: create different upstream (halfspace) vs downstream (MNIST) netwo
         rk! ====
         # Initialize new network.
         dimension = 28 * 28
         local_net = network.LocalNet(n = dimension, # number of input features (= dim
         ension)
                                    m = 10, # number of possible labels
                                    num v = 100, # number of nodes in graph
                                    p = .5, # probability that an edge exists in the
         graph
                                    cap = 50, # choose top 'cap' nodes which fire
                                    rounds = 1, # number of times the graph 'fires'
                                    options = options, update scheme = scheme)
         # Generate halfspace data.
         X, y = DataGenerator.random halfspace data(dim = dimension, n = 3*n)
         X \text{ test} = X[:n]
         y \text{ test} = y[:n]
         X = X[n:]
         y = y[n:]
         # Learn rules.
         losses, train_accuracies, test_accuracies = train.train_local_rule(
                                   # Training Examples
            Χ,
                                   # Training Labels
            у,
            local_net,
                                  # The BrainNet
            X test = X test,
            y_test = y_test,
            rule_epochs = 100,  # Number of times to run through the data
                                  # Number of time to run through a single batch for
            epochs = 1,
         a single training pass
            batch = 100,
                                  # Number of examples in a batch.
            lr = 1e-2,
                                  # Learning Rate
            verbose = True) # If True, evaluates network on test/train data ea
         ch epoch, otherwise, only once at the end
```

```
Starting Train
Outer epoch 1
Acc of class 0:0.7419
Acc of class 1:0.2682
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5088
Acc of class 0:0.7386
Acc of class 1:0.2701
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5020
Current loss: 1.972556997760708
Mean loss so far: 1.972556997760708
Outer epoch 2
Acc of class 0:0.7033
Acc of class 1:0.3392
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5241
Acc of class 0:0.7083
Acc of class 1:0.3446
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5246
Current loss: 1.867345326480033
Mean loss so far: 1.9199511621203706
Outer epoch 3
Acc of class 0:0.3601
Acc of class 1:0.6669
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
```

```
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5111
Acc of class 0:0.3527
Acc of class 1:0.6578
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5068
Current loss: 1.8957090615397114
Mean loss so far: 1.9118704619268174
Outer epoch 4
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.1173533979016743
Mean loss so far: 1.9632411959205318
Outer epoch 5
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
```

```
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.196702831041534
Mean loss so far: 2.009933522944732
Outer epoch 6
Acc of class 0 :0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.456747259084768
Mean loss so far: 2.0844024789680717
Outer epoch 7
Acc of class 0:0.3302
Acc of class 1:0.7208
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5224
Acc of class 0:0.3451
Acc of class 1:0.7176
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
```

Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.5332 Current loss: 2.0437996459718986 Mean loss so far: 2.0786020742543325 Outer epoch 8 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.0000 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.0000 Current loss: 2.2539345268002773 Mean loss so far: 2.1005186308225756 Outer epoch 9 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.0000 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.0000 Current loss: 2.461146667872958 Mean loss so far: 2.140588412717063 Outer epoch 10

Acc of class 0:0.0000

```
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.4611233661232714
Mean loss so far: 2.1726419080576838
Outer epoch 11
Acc of class 0:0.8854
Acc of class 1:0.1357
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5165
Acc of class 0:0.8824
Acc of class 1:0.1251
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5000
Current loss: 2.0976047550915347
Mean loss so far: 2.1658203486971246
Outer epoch 12
Acc of class 0:0.1837
Acc of class 1:0.8382
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
```

```
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5058
Acc of class 0:0.1798
Acc of class 1:0.8400
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5132
Current loss: 1.8874693448639324
Mean loss so far: 2.1426244317110252
Outer epoch 13
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.3383975643975
Mean loss so far: 2.1576839034561384
Outer epoch 14
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
```

```
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.4611467419120037
Mean loss so far: 2.1793598204887004
Outer epoch 15
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.461137229959023
Mean loss so far: 2.198144981120055
Outer epoch 16
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0 :0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
```

Current loss: 2.4611390437085943 Mean loss so far: 2.214582110031839 Outer epoch 17 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.0000 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.0000 Current loss: 2.4611331779849137 Mean loss so far: 2.2290851140290786 Outer epoch 18 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.0000 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.0000 Current loss: 2.4611380615084597 Mean loss so far: 2.2419769444445996 Outer epoch 19 Acc of class 0:0.0000 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000

```
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.4611346588283918
Mean loss so far: 2.253511560991115
Outer epoch 20
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.4611099814158717
Mean loss so far: 2.263891482012353
Outer epoch 21
Acc of class 0 :0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
```

```
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.4611304827905838
Mean loss so far: 2.273283815382745
Outer epoch 22
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.0000
Acc of class 0:0.0000
Acc of class 1:0.0000
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.0000
Current loss: 2.4610592243738414
Mean loss so far: 2.2818190612459763
Outer epoch 23
Acc of class 0:0.8354
Acc of class 1:0.0685
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4580
Acc of class 0:0.8392
Acc of class 1:0.0622
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
```

```
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4468
Current loss: 2.366082950100468
Mean loss so far: 2.2854827085874763
Outer epoch 24
Acc of class 0:0.3954
Acc of class 1:0.6074
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4997
Acc of class 0:0.3923
Acc of class 1:0.6123
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5034
Current loss: 1.9204121520940742
Mean loss so far: 2.2702714354002507
Outer epoch 25
Acc of class 0:0.3843
Acc of class 1:0.6243
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5024
Acc of class 0:0.3681
Acc of class 1:0.6273
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4990
Current loss: 1.8957531794730105
```

Mean loss so far: 2.255290705163161

Outer epoch 26

```
Acc of class 0:0.5623
Acc of class 1:0.4804
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5220
Acc of class 0:0.5511
Acc of class 1:0.4657
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5080
Current loss: 1.830756600996143
Mean loss so far: 2.2389624703875066
Outer epoch 27
Acc of class 0:0.6304
Acc of class 1:0.4093
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5216
Acc of class 0:0.6521
Acc of class 1:0.4036
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5266
Current loss: 1.792090266857229
Mean loss so far: 2.2224116480345337
Outer epoch 28
Acc of class 0:0.5466
Acc of class 1:0.4448
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
```

```
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4965
Acc of class 0:0.5333
Acc of class 1:0.4539
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4932
Current loss: 1.779332746109385
Mean loss so far: 2.206587401537207
Outer epoch 29
Acc of class 0:0.4560
Acc of class 1:0.5818
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5179
Acc of class 0:0.4618
Acc of class 1:0.5873
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5252
Current loss: 1.768636175405443
Mean loss so far: 2.19148563511887
Outer epoch 30
Acc of class 0:0.3613
Acc of class 1:0.6755
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5159
Acc of class 0:0.3451
Acc of class 1:0.6800
Acc of class 2:0.0000
```

```
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5142
Current loss: 1.7535114539061825
Mean loss so far: 2.176886495745114
Outer epoch 31
Acc of class 0:0.4326
Acc of class 1:0.6050
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5174
Acc of class 0:0.4182
Acc of class 1:0.6107
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5154
Current loss: 1.7510995315933082
Mean loss so far: 2.163151432385378
Outer epoch 32
Acc of class 0:0.4034
Acc of class 1:0.6438
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5217
Acc of class 0:0.4263
Acc of class 1:0.6384
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
```

Test Accuracy: 0.5334

Current loss: 1.7458486074286899 Mean loss so far: 2.1501107191054816

Outer epoch 33

Acc of class 0:0.4964

Acc of class 1:0.5450

Acc of class 2 :0.0000

Acc of class 3:0.0000

Acc of class 4:0.0000

Acc of class 5 :0.0000

Acc of class 6 :0.0000

ACC OI CIASS O .0.0000

Acc of class 7:0.0000

Acc of class 8:0.0000

Acc of class 9:0.0000

Train Accuracy: 0.5203 Acc of class 0:0.5014

Acc of class 1 :0.5311

Acc of class 2 :0.0000

Acc of cluss 2 .0.0000

Acc of class 3:0.0000

Acc of class 4 :0.0000

Acc of class 5 :0.0000 Acc of class 6 :0.0000

Acc of class 7 :0.0000

Acc of class 8:0.0000

Acc of class 9:0.0000

Test Accuracy: 0.5164

Current loss: 1.7492056206032816 Mean loss so far: 2.13796207975693

Outer epoch 34

Acc of class 0:0.4400

Acc of class 1 :0.5818

Acc of class 2:0.0000

Acc of class 3:0.0000

Acc of class 4:0.0000

Acc of class 5:0.0000

Acc of class 6:0.0000

Acc of class 7 :0.0000 Acc of class 8 :0.0000

Acc of class 9:0.0000

Train Accuracy: 0.5098

Acc of class 0 :0.4323

Acc of class 1:0.5850

Acc of class 2 :0.0000

Acc of class 3:0.0000

Acc of class 4:0.0000

Acc of class 5:0.0000

Acc of class 6 :0.0000

Acc of class 7 :0.0000

Acc 01 Class 7 .0.0000

Acc of class 8:0.0000

Acc of class 9:0.0000

Test Accuracy: 0.5094

Current loss: 1.7567543115248083 Mean loss so far: 2.126750086573632

Outer epoch 35

Acc of class 0:0.6094

Acc of class 1:0.4578

Acc of class 2:0.0000

```
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5348
Acc of class 0:0.5584
Acc of class 1:0.4594
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5084
Current loss: 1.7495865671318669
Mean loss so far: 2.1159739860181532
Outer epoch 36
Acc of class 0:0.3550
Acc of class 1:0.6708
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5104
Acc of class 0:0.3564
Acc of class 1:0.6531
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5062
Current loss: 1.7333126943347725
Mean loss so far: 2.1053445056936146
Outer epoch 37
Acc of class 0:0.3566
Acc of class 1:0.6590
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
```

```
Train Accuracy: 0.5054
Acc of class 0:0.3883
Acc of class 1:0.6499
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5204
Current loss: 1.7493288800983626
Mean loss so far: 2.0957224617586077
Outer epoch 38
Acc of class 0:0.5180
Acc of class 1:0.4851
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5018
Acc of class 0:0.5200
Acc of class 1:0.4970
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5084
Current loss: 1.7611115305909133
Mean loss so far: 2.086916910938405
Outer epoch 39
Acc of class 0:0.2347
Acc of class 1:0.8037
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5147
Acc of class 0:0.2501
Acc of class 1:0.7897
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
```

Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.5226 Current loss: 1.7734668403041765 Mean loss so far: 2.078879729640092 Outer epoch 40 Acc of class 0:0.6759 Acc of class 1:0.3172 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.4994 Acc of class 0:0.6788 Acc of class 1:0.3220 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.4986 Current loss: 1.7646396986120392 Mean loss so far: 2.071023728864391 Outer epoch 41 Acc of class 0:0.3749 Acc of class 1:0.6350 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.5029 Acc of class 0:0.3463 Acc of class 1:0.6356 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.4924 Current loss: 1.745148645223374

Mean loss so far: 2.063075556092659

```
Outer epoch 42
Acc of class 0:0.5869
Acc of class 1:0.4160
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5028
Acc of class 0:0.5640
Acc of class 1:0.4143
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4884
Current loss: 1.7464545655562482
Mean loss so far: 2.0555369610798873
Outer epoch 43
Acc of class 0:0.5572
Acc of class 1:0.4863
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5223
Acc of class 0:0.5677
Acc of class 1:0.4693
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5180
Current loss: 1.7524107324024145
Mean loss so far: 2.048487513901341
Outer epoch 44
Acc of class 0:0.3477
Acc of class 1:0.6722
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
```

```
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5074
Acc of class 0:0.3459
Acc of class 1:0.6804
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5148
Current loss: 1.760079645763209
Mean loss so far: 2.041932789625475
Outer epoch 45
Acc of class 0:0.4680
Acc of class 1:0.5312
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4991
Acc of class 0:0.4743
Acc of class 1:0.5263
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5006
Current loss: 1.7495997116830673
Mean loss so far: 2.035436499004532
Outer epoch 46
Acc of class 0:0.6407
Acc of class 1:0.3621
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5036
Acc of class 0:0.6335
Acc of class 1:0.3691
```

```
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5000
Current loss: 1.7491337380256275
Mean loss so far: 2.0292125259397737
Outer epoch 47
Acc of class 0:0.5007
Acc of class 1:0.5320
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5161
Acc of class 0:0.5152
Acc of class 1:0.5275
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5214
Current loss: 1.7517248688031413
Mean loss so far: 2.0233085332347387
Outer epoch 48
Acc of class 0:0.3003
Acc of class 1:0.7407
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5170
Acc of class 0:0.2796
Acc of class 1:0.7402
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
```

Acc of class 9:0.0000 Test Accuracy: 0.5122

Current loss: 1.7532392362725795 Mean loss so far: 2.017682089548027

Outer epoch 49

Acc of class 0 :0.5531 Acc of class 1:0.4914 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.5227 Acc of class 0:0.5677

Acc of class 1:0.4970 Acc of class 2:0.0000

Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000

Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000

Acc of class 9:0.0000 Test Accuracy: 0.5320

Current loss: 1.7606408330274248 Mean loss so far: 2.012436349619035

Outer epoch 50

Acc of class 0:0.3105 Acc of class 1:0.6964 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000

Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.5004 Acc of class 0:0.2974 Acc of class 1:0.6907

Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000

Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000

Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.4960

Current loss: 1.7389746207900407 Mean loss so far: 2.0069671150424555

Outer epoch 51

Acc of class 0:0.6649 Acc of class 1:0.3593

```
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5145
Acc of class 0:0.6485
Acc of class 1:0.3707
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5082
Current loss: 1.7555201662151534
Mean loss so far: 2.002036782712508
Outer epoch 52
Acc of class 0:0.4395
Acc of class 1:0.6149
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5258
Acc of class 0:0.4255
Acc of class 1:0.6099
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5186
Current loss: 1.7471262229769728
Mean loss so far: 1.997134656563748
Outer epoch 53
Acc of class 0:0.5879
Acc of class 1:0.4481
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
```

```
Acc of class 9:0.0000
Train Accuracy: 0.5191
Acc of class 0:0.5859
Acc of class 1:0.4539
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5192
Current loss: 1.7563248240856764
Mean loss so far: 1.9925910748188786
Outer epoch 54
Acc of class 0:0.6988
Acc of class 1:0.3304
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5175
Acc of class 0:0.7038
Acc of class 1:0.3414
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5208
Current loss: 1.7408268206122413
Mean loss so far: 1.9879287738150522
Outer epoch 55
Acc of class 0:0.7740
Acc of class 1:0.2713
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5266
Acc of class 0:0.7677
Acc of class 1:0.2895
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
```

```
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5262
Current loss: 1.7601243188438742
Mean loss so far: 1.9837868746337581
Outer epoch 56
Acc of class 0:0.6027
Acc of class 1:0.4471
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5261
Acc of class 0:0.6105
Acc of class 1:0.4416
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5252
Current loss: 1.7442026157783967
Mean loss so far: 1.9795085842970548
Outer epoch 57
Acc of class 0:0.5665
Acc of class 1:0.4924
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5300
Acc of class 0:0.5337
Acc of class 1:0.4871
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5102
Current loss: 1.7513938269664684
```

```
Mean loss so far: 1.9755065710105533
Outer epoch 58
Acc of class 0:0.4379
Acc of class 1:0.5635
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4997
Acc of class 0:0.4339
Acc of class 1:0.5699
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5026
Current loss: 1.7411552033821593
Mean loss so far: 1.971466030189374
Outer epoch 59
Acc of class 0:0.4202
Acc of class 1:0.5950
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5062
Acc of class 0:0.4218
Acc of class 1:0.6004
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5120
Current loss: 1.7502859311131465
Mean loss so far: 1.9677172149507938
Outer epoch 60
Acc of class 0:0.4141
Acc of class 1:0.6249
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
```

```
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5178
Acc of class 0:0.4053
Acc of class 1:0.6071
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5072
Current loss: 1.760519862142176
Mean loss so far: 1.964263925737317
Outer epoch 61
Acc of class 0:0.7427
Acc of class 1:0.2652
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5077
Acc of class 0:0.7382
Acc of class 1:0.2582
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4958
Current loss: 1.7558136530094344
Mean loss so far: 1.960846708151614
Outer epoch 62
Acc of class 0:0.5088
Acc of class 1:0.5013
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5051
Acc of class 0:0.5099
```

```
Acc of class 1:0.4974
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5036
Current loss: 1.753340131336901
Mean loss so far: 1.957499827880409
Outer epoch 63
Acc of class 0:0.4495
Acc of class 1:0.5787
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5131
Acc of class 0:0.4691
Acc of class 1:0.5513
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5106
Current loss: 1.7577649797083088
Mean loss so far: 1.9543294334649788
Outer epoch 64
Acc of class 0:0.3617
Acc of class 1:0.6547
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5059
Acc of class 0:0.3552
Acc of class 1:0.6444
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
```

Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.5012 Current loss: 1.7546911938599958 Mean loss so far: 1.9512100859711512 Outer epoch 65 Acc of class 0:0.4926 Acc of class 1:0.5393 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.5156 Acc of class 0:0.5022 Acc of class 1:0.5327 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.5176 Current loss: 1.7468609471133558 Mean loss so far: 1.9480662530656467 Outer epoch 66 Acc of class 0:0.4115 Acc of class 1:0.6054 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Train Accuracy: 0.5069 Acc of class 0:0.4166 Acc of class 1:0.5945 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.0000 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.0000 Test Accuracy: 0.5064 Current loss: 1.7381531436190192 Outer epoch 67

Mean loss so far: 1.9448857514073647

Acc of class 0:0.4446

```
Acc of class 1:0.5940
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5181
Acc of class 0:0.4590
Acc of class 1:0.5778
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5190
Current loss: 1.7376376060184675
Mean loss so far: 1.941792495506038
Outer epoch 68
Acc of class 0:0.4550
Acc of class 1:0.5718
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5125
Acc of class 0:0.4743
Acc of class 1:0.5596
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5174
Current loss: 1.758557792779337
Mean loss so far: 1.9390978675247628
Outer epoch 69
Acc of class 0:0.4932
Acc of class 1:0.5438
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
```

```
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5181
Acc of class 0:0.4784
Acc of class 1:0.5398
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5094
Current loss: 1.76016453956146
Mean loss so far: 1.9365046308876133
Outer epoch 70
Acc of class 0:0.8049
Acc of class 1:0.2087
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5115
Acc of class 0:0.8024
Acc of class 1:0.2012
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4988
Current loss: 1.7518550331211733
Mean loss so far: 1.9338667794909497
Outer epoch 71
Acc of class 0:0.3310
Acc of class 1:0.7214
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5231
Acc of class 0:0.3325
Acc of class 1:0.6994
Acc of class 2:0.0000
Acc of class 3:0.0000
```

```
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5178
Current loss: 1.75980186077462
Mean loss so far: 1.9314151609174803
Outer epoch 72
Acc of class 0:0.5237
Acc of class 1:0.5452
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5343
Acc of class 0:0.4848
Acc of class 1:0.5410
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5132
Current loss: 1.7398847886025197
Mean loss so far: 1.9287550168575502
Outer epoch 73
Acc of class 0:0.5991
Acc of class 1:0.3894
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4959
Acc of class 0:0.6044
Acc of class 1:0.3972
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4998
```

```
Current loss: 1.741414367797515
Mean loss so far: 1.926188706596454
Outer epoch 74
Acc of class 0:0.4865
Acc of class 1:0.5523
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5189
Acc of class 0:0.4816
Acc of class 1:0.5568
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5196
Current loss: 1.7511726104544303
Mean loss so far: 1.9238236242161564
Outer epoch 75
Acc of class 0:0.9049
Acc of class 1:0.1132
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5153
Acc of class 0:0.8840
Acc of class 1:0.1141
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4952
Current loss: 1.7572698880228055
Mean loss so far: 1.9216029077335786
Outer epoch 76
Acc of class 0:0.7094
Acc of class 1:0.2871
Acc of class 2:0.0000
Acc of class 3:0.0000
```

```
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5016
Acc of class 0:0.7345
Acc of class 1:0.2915
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5108
Current loss: 1.7621262129453337
Mean loss so far: 1.9195045301705753
Outer epoch 77
Acc of class 0:0.4930
Acc of class 1:0.5011
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4970
Acc of class 0:0.4921
Acc of class 1:0.5053
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4988
Current loss: 1.7552762773160646
Mean loss so far: 1.9173716957179192
Outer epoch 78
Acc of class 0:0.4200
Acc of class 1:0.6385
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5275
```

```
Acc of class 0:0.4048
Acc of class 1:0.6388
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5230
Current loss: 1.7480397650459583
Mean loss so far: 1.9152007735298169
Outer epoch 79
Acc of class 0:0.6551
Acc of class 1:0.3650
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5123
Acc of class 0:0.6586
Acc of class 1:0.3743
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5150
Current loss: 1.7473335872004723
Mean loss so far: 1.9130758724370405
Outer epoch 80
Acc of class 0:0.4958
Acc of class 1:0.5409
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5180
Acc of class 0:0.4966
Acc of class 1:0.5255
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
```

```
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5112
Current loss: 1.7472420068931067
Mean loss so far: 1.9110029491177414
Outer epoch 81
Acc of class 0:0.6653
Acc of class 1:0.3192
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4950
Acc of class 0:0.6469
Acc of class 1:0.3172
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4804
Current loss: 1.7537312175132436
Mean loss so far: 1.9090613228016364
Outer epoch 82
Acc of class 0:0.4296
Acc of class 1:0.5623
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4949
Acc of class 0:0.4263
Acc of class 1:0.5644
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4960
Current loss: 1.7454599403785573
Mean loss so far: 1.907066183991599
Outer epoch 83
```

file:///C:/Users/Basile/OneDrive/Columbia/CS008 Computation Brain/Plasticity Rules Project/paper generalization experiments.html

```
Acc of class 0:0.5879
Acc of class 1:0.4483
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5192
Acc of class 0:0.5689
Acc of class 1:0.4642
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5160
Current loss: 1.7538597438750754
Mean loss so far: 1.9052203232673035
Outer epoch 84
Acc of class 0:0.4454
Acc of class 1:0.5792
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5112
Acc of class 0:0.4335
Acc of class 1:0.5699
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5024
Current loss: 1.7551366225172602
Mean loss so far: 1.9034336125440885
Outer epoch 85
Acc of class 0:0.5397
Acc of class 1:0.4944
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
```

```
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5174
Acc of class 0:0.5560
Acc of class 1:0.5057
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5306
Current loss: 1.7530854948698427
Mean loss so far: 1.9016648111596857
Outer epoch 86
Acc of class 0:0.6543
Acc of class 1:0.3961
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5272
Acc of class 0:0.6396
Acc of class 1:0.3830
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5100
Current loss: 1.7639771711280252
Mean loss so far: 1.9000637920895502
Outer epoch 87
Acc of class 0:0.2499
Acc of class 1:0.7927
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5170
Acc of class 0:0.2251
Acc of class 1:0.7885
Acc of class 2:0.0000
```

```
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5096
Current loss: 1.7520944191353585
Mean loss so far: 1.8983629946992722
Outer epoch 88
Acc of class 0:0.3251
Acc of class 1:0.6830
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5012
Acc of class 0:0.3188
Acc of class 1:0.6677
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4950
Current loss: 1.7545626398059622
Mean loss so far: 1.8967288997573026
Outer epoch 89
Acc of class 0:0.4471
Acc of class 1:0.5810
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5130
Acc of class 0:0.4178
Acc of class 1:0.5873
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
```

Test Accuracy: 0.5034

Current loss: 1.7444632332100658 Mean loss so far: 1.8950180495713786

Outer epoch 90

Acc of class 0:0.2690

Acc of class 1 :0.7537

Acc of class 2 :0.0000

Acc of class 3 :0.0000

Acc of class 4:0.0000

Acc of class 5 :0.0000

Acc of class 6 :0.0000

ACC 01 Class 0 .0.0000

Acc of class 7:0.0000

Acc of class 8:0.0000

Acc of class 9:0.0000

Train Accuracy: 0.5075

Acc of class 0:0.2739

Acc of class 1:0.7390

Acc of class 2:0.0000

Acc of class 3:0.0000

Acc of class 4:0.0000

Acc of class 5 :0.0000

Acc of class 6 :0.0000

Acc of class 7:0.0000

Acc of class 8:0.0000

Acc of class 9:0.0000

Test Accuracy: 0.5088

Current loss: 1.753301570983205 Mean loss so far: 1.89344342203151

Outer epoch 91

Acc of class 0 :0.5202

Acc of class 1:0.4404

Acc of class 2 :0.0000

Acc of class 3:0.0000

Acc of class 4:0.0000

Acc of class 5:0.0000

Acc of class 6:0.0000

Acc of class 7:0.0000

Acc of class 8 :0.0000

Acc of class 9:0.0000

Train Accuracy: 0.4809 Acc of class 0:0.5386

Acc of class 1 :0.4519

Acc of class 2 :0.0000

Acc of class 3:0.0000

Acc of class 4:0.0000

Acc of class 5:0.0000

Acc of class 6:0.0000

Acc of class 7:0.0000

Acc of class 8:0.0000

ACC 01 C1033 0 .0.0000

Acc of class 9:0.0000

Test Accuracy: 0.4948

Current loss: 1.763028124298722

Mean loss so far: 1.8920102868915893

Outer epoch 92

Acc of class 0:0.6824

Acc of class 1:0.3717

Acc of class 2:0.0000

```
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5295
Acc of class 0:0.6861
Acc of class 1:0.3556
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5192
Current loss: 1.7546759479477851
Mean loss so far: 1.8905175223378523
Outer epoch 93
Acc of class 0:0.2248
Acc of class 1:0.7641
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4902
Acc of class 0:0.2352
Acc of class 1:0.7560
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4982
Current loss: 1.7492783485400387
Mean loss so far: 1.8889988215443274
Outer epoch 94
Acc of class 0:0.3894
Acc of class 1:0.6019
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
```

```
Train Accuracy: 0.4940
Acc of class 0:0.3838
Acc of class 1:0.6095
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.4978
Current loss: 1.7494078809207076
Mean loss so far: 1.887513811537693
Outer epoch 95
Acc of class 0:0.8738
Acc of class 1:0.1587
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5219
Acc of class 0:0.8638
Acc of class 1:0.1537
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5052
Current loss: 1.7651260653537224
Mean loss so far: 1.8862255194725985
Outer epoch 96
Acc of class 0:0.8126
Acc of class 1:0.2241
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5230
Acc of class 0:0.8129
Acc of class 1:0.2135
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
```

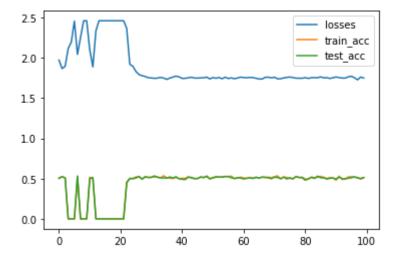
```
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5102
Current loss: 1.771654700446274
Mean loss so far: 1.8850320734410744
Outer epoch 97
Acc of class 0:0.4093
Acc of class 1:0.6310
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5184
Acc of class 0:0.4081
Acc of class 1:0.6345
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5224
Current loss: 1.7520497861258812
Mean loss so far: 1.883661122025454
Outer epoch 98
Acc of class 0:0.4552
Acc of class 1:0.5629
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5082
Acc of class 0:0.4489
Acc of class 1:0.5715
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5108
Current loss: 1.7277004927519
```

Mean loss so far: 1.8820696870328666

```
Outer epoch 99
Acc of class 0:0.0541
Acc of class 1:0.9490
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.4945
Acc of class 0:0.0461
Acc of class 1:0.9489
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5020
Current loss: 1.7621638242564917
Mean loss so far: 1.8808585167017922
Outer epoch 100
Acc of class 0:0.2829
Acc of class 1:0.7460
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Train Accuracy: 0.5108
Acc of class 0:0.2590
Acc of class 1:0.7640
Acc of class 2:0.0000
Acc of class 3:0.0000
Acc of class 4:0.0000
Acc of class 5:0.0000
Acc of class 6:0.0000
Acc of class 7:0.0000
Acc of class 8:0.0000
Acc of class 9:0.0000
Test Accuracy: 0.5140
```

Current loss: 1.7497008566585293 Mean loss so far: 1.8795469401013596

```
In [19]: # Plot training curves.
    plt.plot(losses, label='losses')
    plt.plot(np.reshape(train_accuracies, -1), label='train_acc')
    plt.plot(np.reshape(test_accuracies, -1), label='test_acc')
    plt.legend()
    plt.show()
    print('Last outer epoch loss:', losses[-1])
    print('Last outer epoch train_accuracies:', train_accuracies[-1])
    print('Last outer epoch test_accuracies:', test_accuracies[-1])
```



Last outer epoch loss: 1.7497008566585293 Last outer epoch train\_accuracies: [0.5108] Last outer epoch test\_accuracies: [0.514]

```
In [20]: # Recall MNIST data.
         X, y, X_test, y_test = mnist_X, mnist_y, mnist_X_test, mnist_y_test
          X = X.reshape(-1, 28 * 28)
          X \text{ test} = X \text{ test.reshape}(-1, 28 * 28)
          # NOTE: This method trains only once over all examples, updating the stats eve
          ry 500 steps.
          train_accuracies, test_accuracies = train.train_given_rule(
                                      # Training Examples
              Χ,
                                      # Training Labels
              у,
              local_net,
                                      # The BrainNet
              X_test = X_test,
              y_test = y_test,
              verbose = True)
                                     # If True, evaluates network on test/train data ea
          ch epoch, otherwise, only once at the end
```

Train on 0 examples. Acc of class 0:0.1774 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.2241 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.6994 Train Accuracy: 0.1071 Acc of class 0:0.1827 Acc of class 1:0.0000 Acc of class 2:0.0000 Acc of class 3:0.0000 Acc of class 4:0.0000 Acc of class 5:0.2209 Acc of class 6:0.0000 Acc of class 7:0.0000 Acc of class 8:0.0000 Acc of class 9:0.7215 Test Accuracy: 0.1104 Train on 500 examples. Acc of class 0:0.2440 Acc of class 1:0.9275 Acc of class 2:0.6108 Acc of class 3:0.6950 Acc of class 4:0.3790 Acc of class 5:0.6873 Acc of class 6:0.7325 Acc of class 7:0.8080 Acc of class 8:0.1025 Acc of class 9:0.6899 Train Accuracy: 0.5940 Acc of class 0:0.2408 Acc of class 1:0.9313 Acc of class 2:0.5824 Acc of class 3:0.7030 Acc of class 4:0.3666 Acc of class 5:0.6816 Acc of class 6:0.7599 Acc of class 7:0.7899 Acc of class 8:0.0821 Acc of class 9:0.7403 Test Accuracy: 0.5939 Train on 1000 examples. Acc of class 0:0.7810 Acc of class 1:0.8460 Acc of class 2:0.3639 Acc of class 3:0.6722 Acc of class 4:0.7729 Acc of class 5:0.4342 Acc of class 6:0.8621 Acc of class 7:0.8800 Acc of class 8:0.6621 Acc of class 9:0.2851

Train Accuracy: 0.6612 Acc of class 0:0.7908 Acc of class 1:0.8608 Acc of class 2:0.3450 Acc of class 3:0.6851 Acc of class 4:0.7851 Acc of class 5:0.4473 Acc of class 6:0.8570 Acc of class 7:0.8881 Acc of class 8:0.6366 Acc of class 9:0.3300 Test Accuracy: 0.6657 Train on 1500 examples. Acc of class 0:0.7501 Acc of class 1:0.8555 Acc of class 2:0.5554 Acc of class 3:0.7898 Acc of class 4:0.7651 Acc of class 5:0.7510 Acc of class 6:0.7751 Acc of class 7:0.5761 Acc of class 8:0.2251 Acc of class 9:0.7502 Train Accuracy: 0.6813 Acc of class 0:0.7633 Acc of class 1:0.8722 Acc of class 2:0.5320 Acc of class 3:0.7802 Acc of class 4:0.7637 Acc of class 5:0.7791 Acc of class 6:0.7735 Acc of class 7:0.5710 Acc of class 8:0.2064 Acc of class 9:0.7691 Test Accuracy: 0.6825 Train on 2000 examples. Acc of class 0:0.8761 Acc of class 1:0.8622 Acc of class 2:0.7174 Acc of class 3:0.5593 Acc of class 4:0.5149 Acc of class 5:0.8152 Acc of class 6:0.6921 Acc of class 7:0.8217 Acc of class 8:0.4662 Acc of class 9:0.7495 Train Accuracy: 0.7094 Acc of class 0:0.8898 Acc of class 1:0.8758 Acc of class 2:0.7045 Acc of class 3:0.5564 Acc of class 4:0.5163 Acc of class 5:0.8206 Acc of class 6:0.6952 Acc of class 7:0.8093 Acc of class 8:0.4784 Acc of class 9:0.7889

Test Accuracy: 0.7154 Train on 2500 examples. Acc of class 0:0.7268 Acc of class 1:0.8982 Acc of class 2:0.6032 Acc of class 3:0.7942 Acc of class 4:0.8322 Acc of class 5:0.4804 Acc of class 6:0.8008 Acc of class 7:0.8351 Acc of class 8:0.5652 Acc of class 9:0.5174 Train Accuracy: 0.7108 Acc of class 0:0.7439 Acc of class 1:0.9093 Acc of class 2:0.5640 Acc of class 3:0.8000 Acc of class 4:0.8411 Acc of class 5:0.4854 Acc of class 6:0.7954 Acc of class 7:0.8375 Acc of class 8:0.5749 Acc of class 9:0.5699 Test Accuracy: 0.7168 Train on 3000 examples. Acc of class 0:0.8099 Acc of class 1:0.9201 Acc of class 2:0.6571 Acc of class 3:0.7416 Acc of class 4:0.7473 Acc of class 5:0.6659 Acc of class 6:0.7879 Acc of class 7:0.7920 Acc of class 8:0.5996 Acc of class 9:0.6620 Train Accuracy: 0.7418 Acc of class 0:0.8245 Acc of class 1:0.9286 Acc of class 2:0.6579 Acc of class 3:0.7545 Acc of class 4:0.7546 Acc of class 5:0.7074 Acc of class 6:0.7902 Acc of class 7:0.7763 Acc of class 8:0.5986 Acc of class 9:0.6878 Test Accuracy: 0.7507 Train on 3500 examples. Acc of class 0:0.8551 Acc of class 1:0.8671 Acc of class 2:0.6494 Acc of class 3:0.7464 Acc of class 4:0.8230 Acc of class 5:0.5853 Acc of class 6:0.6580 Acc of class 7:0.8032 Acc of class 8:0.5748

Acc of class 9:0.7158 Train Accuracy: 0.7314 Acc of class 0:0.8663 Acc of class 1:0.8749 Acc of class 2:0.6463 Acc of class 3:0.7634 Acc of class 4:0.8289 Acc of class 5:0.6143 Acc of class 6:0.6357 Acc of class 7:0.8016 Acc of class 8:0.5873 Acc of class 9:0.7166 Test Accuracy: 0.7370 Train on 4000 examples. Acc of class 0:0.6483 Acc of class 1:0.8139 Acc of class 2:0.7536 Acc of class 3:0.5797 Acc of class 4:0.8184 Acc of class 5:0.5733 Acc of class 6:0.7273 Acc of class 7:0.7936 Acc of class 8:0.7626 Acc of class 9:0.5957 Train Accuracy: 0.7090 Acc of class 0:0.6755 Acc of class 1:0.8203 Acc of class 2:0.7607 Acc of class 3:0.5911 Acc of class 4:0.8289 Acc of class 5:0.5874 Acc of class 6:0.7286 Acc of class 7:0.7811 Acc of class 8:0.7813 Acc of class 9:0.6274 Test Accuracy: 0.7208 Train on 4500 examples. Acc of class 0:0.8513 Acc of class 1:0.8610 Acc of class 2:0.7721 Acc of class 3:0.5869 Acc of class 4:0.8942 Acc of class 5:0.6637 Acc of class 6:0.7781 Acc of class 7:0.7010 Acc of class 8:0.6790 Acc of class 9:0.3975 Train Accuracy: 0.7200 Acc of class 0:0.8643 Acc of class 1:0.8564 Acc of class 2:0.7713 Acc of class 3:0.6020 Acc of class 4:0.9145 Acc of class 5:0.6984 Acc of class 6:0.7651 Acc of class 7:0.7014 Acc of class 8:0.6992

Acc of class 9:0.4113 Test Accuracy: 0.7294 Train on 5000 examples. Acc of class 0:0.8410 Acc of class 1:0.8554 Acc of class 2:0.7158 Acc of class 3:0.5650 Acc of class 4:0.4926 Acc of class 5:0.7015 Acc of class 6:0.6365 Acc of class 7:0.6733 Acc of class 8:0.7612 Acc of class 9:0.8102 Train Accuracy: 0.7069 Acc of class 0:0.8551 Acc of class 1:0.8661 Acc of class 2:0.6948 Acc of class 3:0.5802 Acc of class 4:0.4796 Acc of class 5:0.7074 Acc of class 6:0.6545 Acc of class 7:0.6625 Acc of class 8:0.7680 Acc of class 9:0.8315 Test Accuracy: 0.7121 Train on 5500 examples. Acc of class 0:0.9147 Acc of class 1:0.9340 Acc of class 2:0.6532 Acc of class 3:0.8118 Acc of class 4:0.6979 Acc of class 5:0.4757 Acc of class 6:0.8013 Acc of class 7:0.8128 Acc of class 8:0.5640 Acc of class 9:0.7183 Train Accuracy: 0.7441 Acc of class 0:0.9235 Acc of class 1:0.9392 Acc of class 2:0.6289 Acc of class 3:0.8158 Acc of class 4:0.7189 Acc of class 5:0.5157 Acc of class 6:0.7954 Acc of class 7:0.8123 Acc of class 8:0.5483 Acc of class 9:0.7225 Test Accuracy: 0.7470 Train on 6000 examples. Acc of class 0:0.8894 Acc of class 1:0.9057 Acc of class 2:0.7012 Acc of class 3:0.7902 Acc of class 4:0.7299 Acc of class 5:0.6289 Acc of class 6:0.8047 Acc of class 7:0.7928

Acc of class 8:0.5621 Acc of class 9:0.6937 Train Accuracy: 0.7536 Acc of class 0:0.9020 Acc of class 1:0.9128 Acc of class 2:0.6822 Acc of class 3:0.7970 Acc of class 4:0.7515 Acc of class 5:0.6446 Acc of class 6:0.7944 Acc of class 7:0.7977 Acc of class 8:0.5667 Acc of class 9:0.7185 Test Accuracy: 0.7600 Train on 6500 examples. Acc of class 0:0.7728 Acc of class 1:0.8673 Acc of class 2:0.7487 Acc of class 3:0.8462 Acc of class 4:0.6808 Acc of class 5:0.5685 Acc of class 6:0.7165 Acc of class 7:0.8547 Acc of class 8:0.5632 Acc of class 9:0.6650 Train Accuracy: 0.7330 Acc of class 0:0.8061 Acc of class 1:0.8696 Acc of class 2:0.7238 Acc of class 3:0.8416 Acc of class 4:0.6986 Acc of class 5:0.5886 Acc of class 6:0.7077 Acc of class 7:0.8385 Acc of class 8:0.5914 Acc of class 9:0.6789 Test Accuracy: 0.7386 Train on 7000 examples. Acc of class 0:0.8477 Acc of class 1:0.8750 Acc of class 2:0.5980 Acc of class 3:0.5175 Acc of class 4:0.8355 Acc of class 5:0.5698 Acc of class 6:0.6671 Acc of class 7:0.8332 Acc of class 8:0.8464 Acc of class 9:0.4344 Train Accuracy: 0.7055 Acc of class 0:0.8735 Acc of class 1:0.8749 Acc of class 2:0.5775 Acc of class 3:0.5208 Acc of class 4:0.8788 Acc of class 5:0.5762 Acc of class 6:0.6336 Acc of class 7:0.8191

Acc of class 8:0.8573 Acc of class 9:0.4638 Test Accuracy: 0.7100 Train on 7500 examples. Acc of class 0:0.9060 Acc of class 1:0.8825 Acc of class 2:0.7862 Acc of class 3:0.5358 Acc of class 4:0.7415 Acc of class 5:0.6010 Acc of class 6:0.7486 Acc of class 7:0.7777 Acc of class 8:0.7057 Acc of class 9:0.7685 Train Accuracy: 0.7480 Acc of class 0:0.9276 Acc of class 1:0.8899 Acc of class 2:0.7655 Acc of class 3:0.5386 Acc of class 4:0.7790 Acc of class 5:0.6200 Acc of class 6:0.7359 Acc of class 7:0.7695 Acc of class 8:0.7423 Acc of class 9:0.7760 Test Accuracy: 0.7573 Train on 8000 examples. Acc of class 0:0.8340 Acc of class 1:0.9215 Acc of class 2:0.6638 Acc of class 3:0.7415 Acc of class 4:0.7436 Acc of class 5:0.7156 Acc of class 6:0.7675 Acc of class 7:0.8444 Acc of class 8:0.6411 Acc of class 9:0.6485 Train Accuracy: 0.7553 Acc of class 0:0.8531 Acc of class 1:0.9269 Acc of class 2:0.6599 Acc of class 3:0.7366 Acc of class 4:0.7780 Acc of class 5:0.7253 Acc of class 6:0.7704 Acc of class 7:0.8288 Acc of class 8:0.6345 Acc of class 9:0.6670 Test Accuracy: 0.7605 Train on 8500 examples. Acc of class 0:0.8805 Acc of class 1:0.9417 Acc of class 2:0.7296 Acc of class 3:0.7366 Acc of class 4:0.7663 Acc of class 5:0.6307 Acc of class 6:0.7685

Acc of class 7:0.8816 Acc of class 8:0.5261 Acc of class 9:0.5544 Train Accuracy: 0.7462 Acc of class 0:0.9000 Acc of class 1:0.9559 Acc of class 2:0.7122 Acc of class 3:0.7356 Acc of class 4:0.7923 Acc of class 5:0.6558 Acc of class 6:0.7599 Acc of class 7:0.8706 Acc of class 8:0.5226 Acc of class 9:0.5837 Test Accuracy: 0.7529 Train on 9000 examples. Acc of class 0:0.8621 Acc of class 1:0.8773 Acc of class 2:0.7628 Acc of class 3:0.8059 Acc of class 4:0.7396 Acc of class 5:0.3723 Acc of class 6:0.8743 Acc of class 7:0.7464 Acc of class 8:0.6043 Acc of class 9:0.6937 Train Accuracy: 0.7393 Acc of class 0:0.8755 Acc of class 1:0.8855 Acc of class 2:0.7500 Acc of class 3:0.8178 Acc of class 4:0.7607 Acc of class 5:0.3980 Acc of class 6:0.8758 Acc of class 7:0.7364 Acc of class 8:0.6068 Acc of class 9:0.6977 Test Accuracy: 0.7456 Train on 9500 examples. Acc of class 0:0.8563 Acc of class 1:0.8908 Acc of class 2:0.7402 Acc of class 3:0.6725 Acc of class 4:0.7687 Acc of class 5:0.7021 Acc of class 6:0.8101 Acc of class 7:0.7800 Acc of class 8:0.6231 Acc of class 9:0.7263 Train Accuracy: 0.7593 Acc of class 0:0.8765 Acc of class 1:0.8960 Acc of class 2:0.7141 Acc of class 3:0.6812 Acc of class 4:0.7963 Acc of class 5:0.7175 Acc of class 6:0.8058

Acc of class 7:0.7704 Acc of class 8:0.6283 Acc of class 9:0.7364 Test Accuracy: 0.7642 Train on 10000 examples. Acc of class 0:0.9097 Acc of class 1:0.7995 Acc of class 2:0.6749 Acc of class 3:0.5893 Acc of class 4:0.7763 Acc of class 5:0.5759 Acc of class 6:0.7641 Acc of class 7:0.8447 Acc of class 8:0.7894 Acc of class 9:0.6473 Train Accuracy: 0.7392 Acc of class 0:0.9316 Acc of class 1:0.8150 Acc of class 2:0.6579 Acc of class 3:0.6089 Acc of class 4:0.8147 Acc of class 5:0.5830 Acc of class 6:0.7505 Acc of class 7:0.8317 Acc of class 8:0.7864 Acc of class 9:0.6779 Test Accuracy: 0.7476 Train on 10500 examples. Acc of class 0:0.8094 Acc of class 1:0.9097 Acc of class 2:0.6499 Acc of class 3:0.7702 Acc of class 4:0.8037 Acc of class 5:0.6973 Acc of class 6:0.7979 Acc of class 7:0.8010 Acc of class 8:0.6069 Acc of class 9:0.6465 Train Accuracy: 0.7522 Acc of class 0:0.8286 Acc of class 1:0.9110 Acc of class 2:0.6463 Acc of class 3:0.7713 Acc of class 4:0.8350 Acc of class 5:0.7175 Acc of class 6:0.7902 Acc of class 7:0.7899 Acc of class 8:0.6088 Acc of class 9:0.6759 Test Accuracy: 0.7596 Train on 11000 examples. Acc of class 0:0.8482 Acc of class 1:0.8917 Acc of class 2:0.6323 Acc of class 3:0.7392 Acc of class 4:0.7968 Acc of class 5:0.6215

Acc of class 6:0.8265 Acc of class 7:0.8469 Acc of class 8:0.7293 Acc of class 9:0.6228 Train Accuracy: 0.7588 Acc of class 0:0.8673 Acc of class 1:0.8952 Acc of class 2:0.6221 Acc of class 3:0.7446 Acc of class 4:0.8330 Acc of class 5:0.6177 Acc of class 6:0.8142 Acc of class 7:0.8434 Acc of class 8:0.7331 Acc of class 9:0.6442 Test Accuracy: 0.7640 Train on 11500 examples. Acc of class 0:0.8045 Acc of class 1:0.8763 Acc of class 2:0.6304 Acc of class 3:0.5635 Acc of class 4:0.7335 Acc of class 5:0.6801 Acc of class 6:0.7712 Acc of class 7:0.8061 Acc of class 8:0.7930 Acc of class 9:0.7317 Train Accuracy: 0.7410 Acc of class 0:0.8276 Acc of class 1:0.8907 Acc of class 2:0.6289 Acc of class 3:0.5782 Acc of class 4:0.7556 Acc of class 5:0.6816 Acc of class 6:0.7620 Acc of class 7:0.8006 Acc of class 8:0.8101 Acc of class 9:0.7671 Test Accuracy: 0.7521 Train on 12000 examples. Acc of class 0:0.8837 Acc of class 1:0.8288 Acc of class 2:0.6777 Acc of class 3:0.7429 Acc of class 4:0.5454 Acc of class 5:0.7096 Acc of class 6:0.7323 Acc of class 7:0.8137 Acc of class 8:0.6592 Acc of class 9:0.8043 Train Accuracy: 0.7420 Acc of class 0:0.8949 Acc of class 1:0.8317 Acc of class 2:0.6628 Acc of class 3:0.7455 Acc of class 4:0.5428 Acc of class 5:0.7287

Acc of class 6:0.7286 Acc of class 7:0.8084 Acc of class 8:0.6735 Acc of class 9:0.8285 Test Accuracy: 0.7462 Train on 12500 examples. Acc of class 0:0.8322 Acc of class 1:0.8698 Acc of class 2:0.7372 Acc of class 3:0.6240 Acc of class 4:0.7761 Acc of class 5:0.7316 Acc of class 6:0.8064 Acc of class 7:0.7713 Acc of class 8:0.6607 Acc of class 9:0.7758 Train Accuracy: 0.7599 Acc of class 0:0.8418 Acc of class 1:0.8802 Acc of class 2:0.7209 Acc of class 3:0.6129 Acc of class 4:0.7953 Acc of class 5:0.7590 Acc of class 6:0.7954 Acc of class 7:0.7802 Acc of class 8:0.6982 Acc of class 9:0.7968 Test Accuracy: 0.7693 Train on 13000 examples. Acc of class 0:0.7668 Acc of class 1:0.8782 Acc of class 2:0.7467 Acc of class 3:0.8000 Acc of class 4:0.7143 Acc of class 5:0.6573 Acc of class 6:0.7690 Acc of class 7:0.6814 Acc of class 8:0.5343 Acc of class 9:0.8255 Train Accuracy: 0.7402 Acc of class 0:0.7969 Acc of class 1:0.8855 Acc of class 2:0.7132 Acc of class 3:0.7960 Acc of class 4:0.7179 Acc of class 5:0.6816 Acc of class 6:0.7630 Acc of class 7:0.6819 Acc of class 8:0.5760 Acc of class 9:0.8414 Test Accuracy: 0.7481 Train on 13500 examples. Acc of class 0:0.8496 Acc of class 1:0.8907 Acc of class 2:0.7085 Acc of class 3:0.7146 Acc of class 4:0.8079

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Acc of class 5:0.6488
Acc of class 6:0.8092
Acc of class 7:0.7770
Acc of class 8:0.7106
Acc of class 9:0.6885
Train Accuracy: 0.7631
Acc of class 0:0.8673
Acc of class 1:0.8899
Acc of class 2:0.6822
Acc of class 3:0.7129
Acc of class 4:0.8187
Acc of class 5:0.6659
Acc of class 6:0.8100
Acc of class 7:0.7821
Acc of class 8:0.7392
Acc of class 9:0.6947
Test Accuracy: 0.7683
Train on 14000 examples.
Acc of class 0:0.7086
Acc of class 1:0.8520
Acc of class 2:0.7649
Acc of class 3:0.7868
Acc of class 4:0.6024
Acc of class 5:0.6705
Acc of class 6:0.7960
Acc of class 7:0.6993
Acc of class 8:0.5719
Acc of class 9:0.8321
Train Accuracy: 0.7311
Acc of class 0:0.7316
Acc of class 1:0.8546
Acc of class 2:0.7403
Acc of class 3:0.7941
Acc of class 4:0.6059
Acc of class 5:0.6962
Acc of class 6:0.8006
Acc of class 7:0.6936
Acc of class 8:0.6027
Acc of class 9:0.8454
Test Accuracy: 0.7389
Train on 14500 examples.
Acc of class 0:0.8023
Acc of class 1:0.7920
Acc of class 2:0.7825
Acc of class 3:0.3809
Acc of class 4:0.7189
Acc of class 5:0.4289
Acc of class 6:0.7933
Acc of class 7:0.8075
Acc of class 8:0.8554
Acc of class 9:0.6810
Train Accuracy: 0.7071
Acc of class 0:0.8153
Acc of class 1:0.8035
Acc of class 2:0.7607
Acc of class 3:0.3594
Acc of class 4:0.7210
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Acc of class 5:0.4350 Acc of class 6:0.7912 Acc of class 7:0.8132 Acc of class 8:0.8717 Acc of class 9:0.6888 Test Accuracy: 0.7093 Train on 15000 examples. Acc of class 0:0.8166 Acc of class 1:0.9070 Acc of class 2:0.7113 Acc of class 3:0.6713 Acc of class 4:0.7412 Acc of class 5:0.5802 Acc of class 6:0.8212 Acc of class 7:0.8306 Acc of class 8:0.7040 Acc of class 9:0.7487 Train Accuracy: 0.7570 Acc of class 0:0.8296 Acc of class 1:0.9233 Acc of class 2:0.6967 Acc of class 3:0.6723 Acc of class 4:0.7678 Acc of class 5:0.5930 Acc of class 6:0.8173 Acc of class 7:0.8414 Acc of class 8:0.7207 Acc of class 9:0.7592 Test Accuracy: 0.7658 Train on 15500 examples. Acc of class 0:0.8209 Acc of class 1:0.9000 Acc of class 2:0.6380 Acc of class 3:0.6625 Acc of class 4:0.8293 Acc of class 5:0.6493 Acc of class 6:0.8550 Acc of class 7:0.8054 Acc of class 8:0.7595 Acc of class 9:0.6125 Train Accuracy: 0.7559 Acc of class 0:0.8408 Acc of class 1:0.9101 Acc of class 2:0.6153 Acc of class 3:0.6525 Acc of class 4:0.8564 Acc of class 5:0.6614 Acc of class 6:0.8476 Acc of class 7:0.8113 Acc of class 8:0.7618 Acc of class 9:0.6333 Test Accuracy: 0.7609 Train on 16000 examples. Acc of class 0:0.8327 Acc of class 1:0.8904 Acc of class 2:0.7231 Acc of class 3:0.7213

Acc of class 4:0.6722 Acc of class 5:0.6820 Acc of class 6:0.8133 Acc of class 7:0.7227 Acc of class 8:0.6382 Acc of class 9:0.8279 Train Accuracy: 0.7548 Acc of class 0:0.8480 Acc of class 1:0.8996 Acc of class 2:0.7054 Acc of class 3:0.7218 Acc of class 4:0.6711 Acc of class 5:0.7085 Acc of class 6:0.8069 Acc of class 7:0.7257 Acc of class 8:0.6530 Acc of class 9:0.8474 Test Accuracy: 0.7610 Train on 16500 examples. Acc of class 0:0.8317 Acc of class 1:0.8825 Acc of class 2:0.7949 Acc of class 3:0.6885 Acc of class 4:0.7335 Acc of class 5:0.7126 Acc of class 6:0.7839 Acc of class 7:0.7537 Acc of class 8:0.6664 Acc of class 9:0.7468 Train Accuracy: 0.7614 Acc of class 0:0.8469 Acc of class 1:0.8925 Acc of class 2:0.7752 Acc of class 3:0.6871 Acc of class 4:0.7546 Acc of class 5:0.7343 Acc of class 6:0.7818 Acc of class 7:0.7549 Acc of class 8:0.6807 Acc of class 9:0.7721 Test Accuracy: 0.7700 Train on 17000 examples. Acc of class 0:0.8538 Acc of class 1:0.9066 Acc of class 2:0.6762 Acc of class 3:0.6265 Acc of class 4:0.7328 Acc of class 5:0.7213 Acc of class 6:0.8151 Acc of class 7:0.7883 Acc of class 8:0.7093 Acc of class 9:0.7968 Train Accuracy: 0.7647 Acc of class 0:0.8612 Acc of class 1:0.9163 Acc of class 2:0.6599 Acc of class 3:0.6257

Acc of class 4:0.7393 Acc of class 5:0.7466 Acc of class 6:0.8058 Acc of class 7:0.7957 Acc of class 8:0.7156 Acc of class 9:0.8315 Test Accuracy: 0.7715 Train on 17500 examples. Acc of class 0:0.8210 Acc of class 1:0.9061 Acc of class 2:0.7714 Acc of class 3:0.7917 Acc of class 4:0.8049 Acc of class 5:0.6753 Acc of class 6:0.8113 Acc of class 7:0.7497 Acc of class 8:0.4999 Acc of class 9:0.7500 Train Accuracy: 0.7612 Acc of class 0:0.8337 Acc of class 1:0.9093 Acc of class 2:0.7452 Acc of class 3:0.7832 Acc of class 4:0.8096 Acc of class 5:0.7119 Acc of class 6:0.8058 Acc of class 7:0.7490 Acc of class 8:0.5195 Acc of class 9:0.7602 Test Accuracy: 0.7654 Train on 18000 examples. Acc of class 0:0.8379 Acc of class 1:0.8889 Acc of class 2:0.7321 Acc of class 3:0.6767 Acc of class 4:0.8518 Acc of class 5:0.6150 Acc of class 6:0.8089 Acc of class 7:0.7810 Acc of class 8:0.7602 Acc of class 9:0.6312 Train Accuracy: 0.7610 Acc of class 0:0.8520 Acc of class 1:0.8969 Acc of class 2:0.7200 Acc of class 3:0.6703 Acc of class 4:0.8727 Acc of class 5:0.6390 Acc of class 6:0.8017 Acc of class 7:0.7870 Acc of class 8:0.7649 Acc of class 9:0.6422 Test Accuracy: 0.7670 Train on 18500 examples. Acc of class 0:0.8374 Acc of class 1:0.8566 Acc of class 2:0.7894

Acc of class 3:0.6650 Acc of class 4:0.8899 Acc of class 5:0.6602 Acc of class 6:0.8057 Acc of class 7:0.7652 Acc of class 8:0.7204 Acc of class 9:0.5201 Train Accuracy: 0.7527 Acc of class 0:0.8449 Acc of class 1:0.8511 Acc of class 2:0.7665 Acc of class 3:0.6624 Acc of class 4:0.8992 Acc of class 5:0.6805 Acc of class 6:0.8006 Acc of class 7:0.7607 Acc of class 8:0.7474 Acc of class 9:0.5372 Test Accuracy: 0.7563 Train on 19000 examples. Acc of class 0:0.8636 Acc of class 1:0.8638 Acc of class 2:0.7622 Acc of class 3:0.7659 Acc of class 4:0.7092 Acc of class 5:0.5802 Acc of class 6:0.8445 Acc of class 7:0.7922 Acc of class 8:0.6507 Acc of class 9:0.8070 Train Accuracy: 0.7672 Acc of class 0:0.8673 Acc of class 1:0.8678 Acc of class 2:0.7500 Acc of class 3:0.7713 Acc of class 4:0.7210 Acc of class 5:0.5998 Acc of class 6:0.8434 Acc of class 7:0.7870 Acc of class 8:0.6735 Acc of class 9:0.8325 Test Accuracy: 0.7744 Train on 19500 examples. Acc of class 0:0.8036 Acc of class 1:0.8443 Acc of class 2:0.7566 Acc of class 3:0.7705 Acc of class 4:0.7438 Acc of class 5:0.6597 Acc of class 6:0.8118 Acc of class 7:0.8654 Acc of class 8:0.6886 Acc of class 9:0.6825 Train Accuracy: 0.7653 Acc of class 0:0.8214 Acc of class 1:0.8493 Acc of class 2:0.7316

Acc of class 3:0.7772 Acc of class 4:0.7668 Acc of class 5:0.6951 Acc of class 6:0.8090 Acc of class 7:0.8589 Acc of class 8:0.7023 Acc of class 9:0.7086 Test Accuracy: 0.7739 Train on 20000 examples. Acc of class 0:0.8021 Acc of class 1:0.9097 Acc of class 2:0.7189 Acc of class 3:0.6614 Acc of class 4:0.8576 Acc of class 5:0.8190 Acc of class 6:0.7668 Acc of class 7:0.7812 Acc of class 8:0.5662 Acc of class 9:0.5524 Train Accuracy: 0.7450 Acc of class 0:0.8204 Acc of class 1:0.9137 Acc of class 2:0.6880 Acc of class 3:0.6822 Acc of class 4:0.8788 Acc of class 5:0.8374 Acc of class 6:0.7735 Acc of class 7:0.7772 Acc of class 8:0.5924 Acc of class 9:0.5590 Test Accuracy: 0.7531 Train on 20500 examples. Acc of class 0:0.8607 Acc of class 1:0.9014 Acc of class 2:0.7711 Acc of class 3:0.7619 Acc of class 4:0.7865 Acc of class 5:0.6425 Acc of class 6:0.7430 Acc of class 7:0.7989 Acc of class 8:0.6004 Acc of class 9:0.7665 Train Accuracy: 0.7665 Acc of class 0:0.8724 Acc of class 1:0.9093 Acc of class 2:0.7510 Acc of class 3:0.7644 Acc of class 4:0.8014 Acc of class 5:0.6715 Acc of class 6:0.7432 Acc of class 7:0.7899 Acc of class 8:0.6253 Acc of class 9:0.7820 Test Accuracy: 0.7742 Train on 21000 examples. Acc of class 0:0.8102 Acc of class 1:0.8922

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Acc of class 2:0.6871
Acc of class 3:0.7593
Acc of class 4:0.8119
Acc of class 5:0.4912
Acc of class 6:0.8163
Acc of class 7:0.7885
Acc of class 8:0.7465
Acc of class 9:0.7277
Train Accuracy: 0.7573
Acc of class 0:0.8286
Acc of class 1:0.8969
Acc of class 2:0.6599
Acc of class 3:0.7703
Acc of class 4:0.8330
Acc of class 5:0.5179
Acc of class 6:0.8132
Acc of class 7:0.7899
Acc of class 8:0.7505
Acc of class 9:0.7334
Test Accuracy: 0.7631
Train on 21500 examples.
Acc of class 0:0.8048
Acc of class 1:0.8582
Acc of class 2:0.7907
Acc of class 3:0.7320
Acc of class 4:0.7241
Acc of class 5:0.5790
Acc of class 6:0.8373
Acc of class 7:0.6599
Acc of class 8:0.6741
Acc of class 9:0.8245
Train Accuracy: 0.7510
Acc of class 0:0.8204
Acc of class 1:0.8643
Acc of class 2:0.7771
Acc of class 3:0.7426
Acc of class 4:0.7444
Acc of class 5:0.6177
Acc of class 6:0.8319
Acc of class 7:0.6615
Acc of class 8:0.6971
Acc of class 9:0.8494
Test Accuracy: 0.7632
Train on 22000 examples.
Acc of class 0:0.8676
Acc of class 1:0.8994
Acc of class 2:0.7257
Acc of class 3:0.7995
Acc of class 4:0.8732
Acc of class 5:0.6329
Acc of class 6:0.7962
Acc of class 7:0.7322
Acc of class 8:0.5688
Acc of class 9:0.6556
Train Accuracy: 0.7581
Acc of class 0:0.8755
Acc of class 1:0.9031
```

Acc of class 2:0.7190 Acc of class 3:0.8139 Acc of class 4:0.8890 Acc of class 5:0.6525 Acc of class 6:0.7850 Acc of class 7:0.7276 Acc of class 8:0.5811 Acc of class 9:0.6611 Test Accuracy: 0.7635 Train on 22500 examples. Acc of class 0:0.8560 Acc of class 1:0.8815 Acc of class 2:0.7341 Acc of class 3:0.7232 Acc of class 4:0.8403 Acc of class 5:0.6899 Acc of class 6:0.7837 Acc of class 7:0.7058 Acc of class 8:0.6479 Acc of class 9:0.7331 Train Accuracy: 0.7614 Acc of class 0:0.8704 Acc of class 1:0.8916 Acc of class 2:0.7151 Acc of class 3:0.7149 Acc of class 4:0.8615 Acc of class 5:0.7052 Acc of class 6:0.7808 Acc of class 7:0.6936 Acc of class 8:0.6653 Acc of class 9:0.7413 Test Accuracy: 0.7657 Train on 23000 examples. Acc of class 0:0.8406 Acc of class 1:0.9117 Acc of class 2:0.7138 Acc of class 3:0.8008 Acc of class 4:0.7877 Acc of class 5:0.6244 Acc of class 6:0.8528 Acc of class 7:0.7863 Acc of class 8:0.5696 Acc of class 9:0.7630 Train Accuracy: 0.7687 Acc of class 0:0.8571 Acc of class 1:0.9128 Acc of class 2:0.7045 Acc of class 3:0.8099 Acc of class 4:0.8024 Acc of class 5:0.6435 Acc of class 6:0.8372 Acc of class 7:0.7772 Acc of class 8:0.5945 Acc of class 9:0.7711 Test Accuracy: 0.7741 Train on 23500 examples. Acc of class 0:0.8320

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Acc of class 1:0.8799
Acc of class 2:0.7222
Acc of class 3:0.6537
Acc of class 4:0.7763
Acc of class 5:0.6381
Acc of class 6:0.8184
Acc of class 7:0.7951
Acc of class 8:0.7826
Acc of class 9:0.7253
Train Accuracy: 0.7647
Acc of class 0:0.8490
Acc of class 1:0.8890
Acc of class 2:0.7016
Acc of class 3:0.6535
Acc of class 4:0.8024
Acc of class 5:0.6682
Acc of class 6:0.8132
Acc of class 7:0.7879
Acc of class 8:0.7947
Acc of class 9:0.7542
Test Accuracy: 0.7733
Train on 24000 examples.
Acc of class 0:0.8256
Acc of class 1:0.8600
Acc of class 2:0.7315
Acc of class 3:0.7695
Acc of class 4:0.6636
Acc of class 5:0.6648
Acc of class 6:0.8287
Acc of class 7:0.8228
Acc of class 8:0.6560
Acc of class 9:0.7869
Train Accuracy: 0.7637
Acc of class 0:0.8408
Acc of class 1:0.8634
Acc of class 2:0.7016
Acc of class 3:0.7812
Acc of class 4:0.6660
Acc of class 5:0.6760
Acc of class 6:0.8163
Acc of class 7:0.8230
Acc of class 8:0.6704
Acc of class 9:0.8256
Test Accuracy: 0.7688
Train on 24500 examples.
Acc of class 0:0.8263
Acc of class 1:0.8616
Acc of class 2:0.6928
Acc of class 3:0.7625
Acc of class 4:0.7371
Acc of class 5:0.7157
Acc of class 6:0.7636
Acc of class 7:0.8177
Acc of class 8:0.6508
Acc of class 9:0.7638
Train Accuracy: 0.7614
Acc of class 0:0.8480
```

Acc of class 1:0.8670 Acc of class 2:0.6531 Acc of class 3:0.7644 Acc of class 4:0.7403 Acc of class 5:0.7365 Acc of class 6:0.7651 Acc of class 7:0.8161 Acc of class 8:0.6632 Acc of class 9:0.7929 Test Accuracy: 0.7663 Train on 25000 examples. Acc of class 0:0.8030 Acc of class 1:0.8493 Acc of class 2:0.7828 Acc of class 3:0.7597 Acc of class 4:0.6845 Acc of class 5:0.6881 Acc of class 6:0.7832 Acc of class 7:0.7199 Acc of class 8:0.6324 Acc of class 9:0.8153 Train Accuracy: 0.7538 Acc of class 0:0.8224 Acc of class 1:0.8581 Acc of class 2:0.7510 Acc of class 3:0.7644 Acc of class 4:0.6935 Acc of class 5:0.7007 Acc of class 6:0.7777 Acc of class 7:0.7160 Acc of class 8:0.6376 Acc of class 9:0.8454 Test Accuracy: 0.7588 Train on 25500 examples. Acc of class 0:0.8043 Acc of class 1:0.8564 Acc of class 2:0.6942 Acc of class 3:0.6718 Acc of class 4:0.8499 Acc of class 5:0.6451 Acc of class 6:0.7653 Acc of class 7:0.7486 Acc of class 8:0.8130 Acc of class 9:0.6228 Train Accuracy: 0.7489 Acc of class 0:0.8163 Acc of class 1:0.8678 Acc of class 2:0.6667 Acc of class 3:0.6851 Acc of class 4:0.8635 Acc of class 5:0.6637 Acc of class 6:0.7526 Acc of class 7:0.7481 Acc of class 8:0.8183 Acc of class 9:0.6422 Test Accuracy: 0.7540 Train on 26000 examples.

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Acc of class 0:0.8583
Acc of class 1:0.8781
Acc of class 2:0.6789
Acc of class 3:0.7193
Acc of class 4:0.8646
Acc of class 5:0.7008
Acc of class 6:0.8030
Acc of class 7:0.7840
Acc of class 8:0.7277
Acc of class 9:0.5730
Train Accuracy: 0.7607
Acc of class 0:0.8694
Acc of class 1:0.8916
Acc of class 2:0.6647
Acc of class 3:0.7287
Acc of class 4:0.8758
Acc of class 5:0.7164
Acc of class 6:0.7902
Acc of class 7:0.7860
Acc of class 8:0.7464
Acc of class 9:0.6026
Test Accuracy: 0.7685
Train on 26500 examples.
Acc of class 0:0.8926
Acc of class 1:0.8638
Acc of class 2:0.7083
Acc of class 3:0.7415
Acc of class 4:0.7752
Acc of class 5:0.5552
Acc of class 6:0.8721
Acc of class 7:0.8022
Acc of class 8:0.7365
Acc of class 9:0.7210
Train Accuracy: 0.7700
Acc of class 0:0.9020
Acc of class 1:0.8802
Acc of class 2:0.6967
Acc of class 3:0.7505
Acc of class 4:0.7902
Acc of class 5:0.5852
Acc of class 6:0.8622
Acc of class 7:0.7957
Acc of class 8:0.7669
Acc of class 9:0.7502
Test Accuracy: 0.7806
Train on 27000 examples.
Acc of class 0:0.8285
Acc of class 1:0.8714
Acc of class 2:0.6737
Acc of class 3:0.7511
Acc of class 4:0.7586
Acc of class 5:0.5802
Acc of class 6:0.8696
Acc of class 7:0.8348
Acc of class 8:0.7618
Acc of class 9:0.7115
Train Accuracy: 0.7674
```

Acc of class 0:0.8418 Acc of class 1:0.8775 Acc of class 2:0.6570 Acc of class 3:0.7683 Acc of class 4:0.7821 Acc of class 5:0.6020 Acc of class 6:0.8570 Acc of class 7:0.8307 Acc of class 8:0.7587 Acc of class 9:0.7502 Test Accuracy: 0.7751 Train on 27500 examples. Acc of class 0:0.8572 Acc of class 1:0.8629 Acc of class 2:0.7254 Acc of class 3:0.6276 Acc of class 4:0.7333 Acc of class 5:0.6600 Acc of class 6:0.8540 Acc of class 7:0.8449 Acc of class 8:0.7853 Acc of class 9:0.6924 Train Accuracy: 0.7665 Acc of class 0:0.8704 Acc of class 1:0.8784 Acc of class 2:0.7151 Acc of class 3:0.6347 Acc of class 4:0.7597 Acc of class 5:0.6839 Acc of class 6:0.8392 Acc of class 7:0.8414 Acc of class 8:0.7864 Acc of class 9:0.7225 Test Accuracy: 0.7749 Train on 28000 examples. Acc of class 0:0.8583 Acc of class 1:0.8842 Acc of class 2:0.7798 Acc of class 3:0.6834 Acc of class 4:0.7718 Acc of class 5:0.6947 Acc of class 6:0.8241 Acc of class 7:0.8267 Acc of class 8:0.6310 Acc of class 9:0.7033 Train Accuracy: 0.7681 Acc of class 0:0.8765 Acc of class 1:0.9004 Acc of class 2:0.7529 Acc of class 3:0.6931 Acc of class 4:0.7902 Acc of class 5:0.7130 Acc of class 6:0.8163 Acc of class 7:0.8249 Acc of class 8:0.6427 Acc of class 9:0.7235 Test Accuracy: 0.7756

Train on 28500 examples. Acc of class 0:0.8475 Acc of class 1:0.8457 Acc of class 2:0.7979 Acc of class 3:0.6315 Acc of class 4:0.6686 Acc of class 5:0.7246 Acc of class 6:0.8111 Acc of class 7:0.7706 Acc of class 8:0.6095 Acc of class 9:0.8136 Train Accuracy: 0.7536 Acc of class 0:0.8694 Acc of class 1:0.8652 Acc of class 2:0.7762 Acc of class 3:0.6238 Acc of class 4:0.6660 Acc of class 5:0.7500 Acc of class 6:0.8069 Acc of class 7:0.7685 Acc of class 8:0.6129 Acc of class 9:0.8355 Test Accuracy: 0.7591 Train on 29000 examples. Acc of class 0:0.8089 Acc of class 1:0.8361 Acc of class 2:0.7790 Acc of class 3:0.7664 Acc of class 4:0.8192 Acc of class 5:0.7045 Acc of class 6:0.8057 Acc of class 7:0.7941 Acc of class 8:0.4931 Acc of class 9:0.7031 Train Accuracy: 0.7531 Acc of class 0:0.8235 Acc of class 1:0.8537 Acc of class 2:0.7616 Acc of class 3:0.7703 Acc of class 4:0.8381 Acc of class 5:0.7209 Acc of class 6:0.7965 Acc of class 7:0.7947 Acc of class 8:0.4908 Acc of class 9:0.7304 Test Accuracy: 0.7601 Train on 29500 examples. Acc of class 0:0.7886 Acc of class 1:0.8566 Acc of class 2:0.6692 Acc of class 3:0.7379 Acc of class 4:0.7706 Acc of class 5:0.7840 Acc of class 6:0.8168 Acc of class 7:0.8179 Acc of class 8:0.5941 Acc of class 9:0.7020

Train Accuracy: 0.7553 Acc of class 0:0.7990 Acc of class 1:0.8617 Acc of class 2:0.6502 Acc of class 3:0.7327 Acc of class 4:0.7984 Acc of class 5:0.8105 Acc of class 6:0.8017 Acc of class 7:0.8074 Acc of class 8:0.5801 Acc of class 9:0.7384 Test Accuracy: 0.7587 Train on 30000 examples. Acc of class 0:0.8418 Acc of class 1:0.8216 Acc of class 2:0.6823 Acc of class 3:0.7473 Acc of class 4:0.7775 Acc of class 5:0.6373 Acc of class 6:0.8423 Acc of class 7:0.7799 Acc of class 8:0.6992 Acc of class 9:0.7800 Train Accuracy: 0.7629 Acc of class 0:0.8592 Acc of class 1:0.8300 Acc of class 2:0.6783 Acc of class 3:0.7554 Acc of class 4:0.7912 Acc of class 5:0.6648 Acc of class 6:0.8299 Acc of class 7:0.7782 Acc of class 8:0.6920 Acc of class 9:0.8097 Test Accuracy: 0.7703 Train on 30500 examples. Acc of class 0:0.8690 Acc of class 1:0.8904 Acc of class 2:0.7001 Acc of class 3:0.7208 Acc of class 4:0.6989 Acc of class 5:0.6716 Acc of class 6:0.8603 Acc of class 7:0.7654 Acc of class 8:0.5965 Acc of class 9:0.8314 Train Accuracy: 0.7631 Acc of class 0:0.8837 Acc of class 1:0.8960 Acc of class 2:0.6899 Acc of class 3:0.7228 Acc of class 4:0.6976 Acc of class 5:0.6984 Acc of class 6:0.8403 Acc of class 7:0.7617 Acc of class 8:0.6016 Acc of class 9:0.8484

Test Accuracy: 0.7663 Train on 31000 examples. Acc of class 0:0.8460 Acc of class 1:0.8462 Acc of class 2:0.7160 Acc of class 3:0.7700 Acc of class 4:0.8338 Acc of class 5:0.5401 Acc of class 6:0.8741 Acc of class 7:0.8139 Acc of class 8:0.7313 Acc of class 9:0.6361 Train Accuracy: 0.7640 Acc of class 0:0.8643 Acc of class 1:0.8617 Acc of class 2:0.7064 Acc of class 3:0.7871 Acc of class 4:0.8462 Acc of class 5:0.5504 Acc of class 6:0.8643 Acc of class 7:0.8103 Acc of class 8:0.7238 Acc of class 9:0.6492 Test Accuracy: 0.7692 Train on 31500 examples. Acc of class 0:0.8842 Acc of class 1:0.8468 Acc of class 2:0.6432 Acc of class 3:0.7831 Acc of class 4:0.7768 Acc of class 5:0.6228 Acc of class 6:0.8202 Acc of class 7:0.7976 Acc of class 8:0.7353 Acc of class 9:0.7188 Train Accuracy: 0.7654 Acc of class 0:0.8980 Acc of class 1:0.8581 Acc of class 2:0.6260 Acc of class 3:0.7911 Acc of class 4:0.7841 Acc of class 5:0.6300 Acc of class 6:0.7996 Acc of class 7:0.7967 Acc of class 8:0.7310 Acc of class 9:0.7265 Test Accuracy: 0.7661 Train on 32000 examples. Acc of class 0:0.8374 Acc of class 1:0.8545 Acc of class 2:0.6814 Acc of class 3:0.7813 Acc of class 4:0.7956 Acc of class 5:0.6879 Acc of class 6:0.8305 Acc of class 7:0.8222 Acc of class 8:0.6597

Acc of class 9:0.6899 Train Accuracy: 0.7663 Acc of class 0:0.8561 Acc of class 1:0.8652 Acc of class 2:0.6812 Acc of class 3:0.7901 Acc of class 4:0.8198 Acc of class 5:0.6928 Acc of class 6:0.8100 Acc of class 7:0.8200 Acc of class 8:0.6417 Acc of class 9:0.7126 Test Accuracy: 0.7708 Train on 32500 examples. Acc of class 0:0.8052 Acc of class 1:0.9018 Acc of class 2:0.7414 Acc of class 3:0.6878 Acc of class 4:0.8324 Acc of class 5:0.6390 Acc of class 6:0.6744 Acc of class 7:0.7555 Acc of class 8:0.7438 Acc of class 9:0.7203 Train Accuracy: 0.7529 Acc of class 0:0.8296 Acc of class 1:0.9093 Acc of class 2:0.7277 Acc of class 3:0.6792 Acc of class 4:0.8554 Acc of class 5:0.6648 Acc of class 6:0.6566 Acc of class 7:0.7607 Acc of class 8:0.7515 Acc of class 9:0.7423 Test Accuracy: 0.7607 Train on 33000 examples. Acc of class 0:0.8231 Acc of class 1:0.8888 Acc of class 2:0.7289 Acc of class 3:0.7172 Acc of class 4:0.7527 Acc of class 5:0.6604 Acc of class 6:0.7977 Acc of class 7:0.7524 Acc of class 8:0.7095 Acc of class 9:0.7864 Train Accuracy: 0.7641 Acc of class 0:0.8459 Acc of class 1:0.8943 Acc of class 2:0.7161 Acc of class 3:0.7158 Acc of class 4:0.7678 Acc of class 5:0.6861 Acc of class 6:0.7829 Acc of class 7:0.7549 Acc of class 8:0.7125

Acc of class 9:0.7929 Test Accuracy: 0.7692 Train on 33500 examples. Acc of class 0:0.8394 Acc of class 1:0.8846 Acc of class 2:0.7004 Acc of class 3:0.7111 Acc of class 4:0.6938 Acc of class 5:0.6159 Acc of class 6:0.8310 Acc of class 7:0.7802 Acc of class 8:0.7395 Acc of class 9:0.8074 Train Accuracy: 0.7633 Acc of class 0:0.8561 Acc of class 1:0.8916 Acc of class 2:0.6928 Acc of class 3:0.7119 Acc of class 4:0.6894 Acc of class 5:0.6177 Acc of class 6:0.8142 Acc of class 7:0.7850 Acc of class 8:0.7444 Acc of class 9:0.8137 Test Accuracy: 0.7646 Train on 34000 examples. Acc of class 0:0.8215 Acc of class 1:0.8957 Acc of class 2:0.7580 Acc of class 3:0.7046 Acc of class 4:0.8013 Acc of class 5:0.7340 Acc of class 6:0.8129 Acc of class 7:0.8184 Acc of class 8:0.5826 Acc of class 9:0.7169 Train Accuracy: 0.7669 Acc of class 0:0.8418 Acc of class 1:0.9040 Acc of class 2:0.7578 Acc of class 3:0.7010 Acc of class 4:0.8167 Acc of class 5:0.7444 Acc of class 6:0.7996 Acc of class 7:0.8220 Acc of class 8:0.6047 Acc of class 9:0.7265 Test Accuracy: 0.7740 Train on 34500 examples. Acc of class 0:0.8568 Acc of class 1:0.8643 Acc of class 2:0.7318 Acc of class 3:0.7599 Acc of class 4:0.7838 Acc of class 5:0.6395 Acc of class 6:0.8243 Acc of class 7:0.7947

Acc of class 8:0.6512 Acc of class 9:0.7494 Train Accuracy: 0.7682 Acc of class 0:0.8755 Acc of class 1:0.8731 Acc of class 2:0.7326 Acc of class 3:0.7634 Acc of class 4:0.7974 Acc of class 5:0.6357 Acc of class 6:0.8069 Acc of class 7:0.7938 Acc of class 8:0.6663 Acc of class 9:0.7562 Test Accuracy: 0.7727 Train on 35000 examples. Acc of class 0:0.8052 Acc of class 1:0.8186 Acc of class 2:0.6959 Acc of class 3:0.6849 Acc of class 4:0.7663 Acc of class 5:0.7043 Acc of class 6:0.8008 Acc of class 7:0.8032 Acc of class 8:0.7659 Acc of class 9:0.7344 Train Accuracy: 0.7591 Acc of class 0:0.8306 Acc of class 1:0.8256 Acc of class 2:0.6812 Acc of class 3:0.6812 Acc of class 4:0.7760 Acc of class 5:0.7085 Acc of class 6:0.7829 Acc of class 7:0.8025 Acc of class 8:0.7536 Acc of class 9:0.7443 Test Accuracy: 0.7596 Train on 35500 examples. Acc of class 0:0.7881 Acc of class 1:0.8189 Acc of class 2:0.7214 Acc of class 3:0.8322 Acc of class 4:0.7847 Acc of class 5:0.5320 Acc of class 6:0.8069 Acc of class 7:0.8045 Acc of class 8:0.6558 Acc of class 9:0.7292 Train Accuracy: 0.7508 Acc of class 0:0.8061 Acc of class 1:0.8317 Acc of class 2:0.7045 Acc of class 3:0.8495 Acc of class 4:0.7872 Acc of class 5:0.5437 Acc of class 6:0.7933 Acc of class 7:0.8054

Acc of class 8:0.6643 Acc of class 9:0.7324 Test Accuracy: 0.7551 Train on 36000 examples. Acc of class 0:0.8290 Acc of class 1:0.8171 Acc of class 2:0.7422 Acc of class 3:0.5914 Acc of class 4:0.8374 Acc of class 5:0.6041 Acc of class 6:0.8158 Acc of class 7:0.8211 Acc of class 8:0.8050 Acc of class 9:0.6586 Train Accuracy: 0.7539 Acc of class 0:0.8551 Acc of class 1:0.8273 Acc of class 2:0.7287 Acc of class 3:0.5822 Acc of class 4:0.8473 Acc of class 5:0.6020 Acc of class 6:0.8069 Acc of class 7:0.8239 Acc of class 8:0.8080 Acc of class 9:0.6749 Test Accuracy: 0.7574 Train on 36500 examples. Acc of class 0:0.8177 Acc of class 1:0.8738 Acc of class 2:0.7096 Acc of class 3:0.7410 Acc of class 4:0.7872 Acc of class 5:0.6419 Acc of class 6:0.8907 Acc of class 7:0.7939 Acc of class 8:0.6491 Acc of class 9:0.7793 Train Accuracy: 0.7711 Acc of class 0:0.8337 Acc of class 1:0.8837 Acc of class 2:0.7093 Acc of class 3:0.7475 Acc of class 4:0.8045 Acc of class 5:0.6401 Acc of class 6:0.8800 Acc of class 7:0.7986 Acc of class 8:0.6725 Acc of class 9:0.7879 Test Accuracy: 0.7782 Train on 37000 examples. Acc of class 0:0.8226 Acc of class 1:0.9156 Acc of class 2:0.7464 Acc of class 3:0.6965 Acc of class 4:0.8208 Acc of class 5:0.5868 Acc of class 6:0.8915

Acc of class 7:0.8252 Acc of class 8:0.7182 Acc of class 9:0.6771 Train Accuracy: 0.7736 Acc of class 0:0.8490 Acc of class 1:0.9339 Acc of class 2:0.7490 Acc of class 3:0.7139 Acc of class 4:0.8381 Acc of class 5:0.6087 Acc of class 6:0.8831 Acc of class 7:0.8288 Acc of class 8:0.7485 Acc of class 9:0.6908 Test Accuracy: 0.7876 Train on 37500 examples. Acc of class 0:0.7452 Acc of class 1:0.8894 Acc of class 2:0.7971 Acc of class 3:0.8004 Acc of class 4:0.7554 Acc of class 5:0.5901 Acc of class 6:0.8474 Acc of class 7:0.7976 Acc of class 8:0.6395 Acc of class 9:0.7373 Train Accuracy: 0.7636 Acc of class 0:0.7724 Acc of class 1:0.8969 Acc of class 2:0.7665 Acc of class 3:0.8010 Acc of class 4:0.7780 Acc of class 5:0.5942 Acc of class 6:0.8486 Acc of class 7:0.7938 Acc of class 8:0.6704 Acc of class 9:0.7522 Test Accuracy: 0.7710 Train on 38000 examples. Acc of class 0:0.8168 Acc of class 1:0.9008 Acc of class 2:0.7576 Acc of class 3:0.7813 Acc of class 4:0.8295 Acc of class 5:0.4992 Acc of class 6:0.7927 Acc of class 7:0.8109 Acc of class 8:0.7165 Acc of class 9:0.6831 Train Accuracy: 0.7632 Acc of class 0:0.8357 Acc of class 1:0.9084 Acc of class 2:0.7180 Acc of class 3:0.7901 Acc of class 4:0.8401 Acc of class 5:0.5067 Acc of class 6:0.7891

Acc of class 7:0.8161 Acc of class 8:0.7474 Acc of class 9:0.6918 Test Accuracy: 0.7687 Train on 38500 examples. Acc of class 0:0.8094 Acc of class 1:0.8754 Acc of class 2:0.8202 Acc of class 3:0.6544 Acc of class 4:0.8033 Acc of class 5:0.6372 Acc of class 6:0.8395 Acc of class 7:0.8559 Acc of class 8:0.6715 Acc of class 9:0.6845 Train Accuracy: 0.7679 Acc of class 0:0.8265 Acc of class 1:0.8863 Acc of class 2:0.7946 Acc of class 3:0.6564 Acc of class 4:0.8310 Acc of class 5:0.6457 Acc of class 6:0.8372 Acc of class 7:0.8512 Acc of class 8:0.6982 Acc of class 9:0.7066 Test Accuracy: 0.7761 Train on 39000 examples. Acc of class 0:0.8121 Acc of class 1:0.8670 Acc of class 2:0.7239 Acc of class 3:0.7023 Acc of class 4:0.8535 Acc of class 5:0.7072 Acc of class 6:0.7942 Acc of class 7:0.8524 Acc of class 8:0.7028 Acc of class 9:0.6290 Train Accuracy: 0.7665 Acc of class 0:0.8316 Acc of class 1:0.8749 Acc of class 2:0.6996 Acc of class 3:0.7000 Acc of class 4:0.8697 Acc of class 5:0.7164 Acc of class 6:0.7808 Acc of class 7:0.8492 Acc of class 8:0.7125 Acc of class 9:0.6492 Test Accuracy: 0.7700 Train on 39500 examples. Acc of class 0:0.8158 Acc of class 1:0.8883 Acc of class 2:0.7509 Acc of class 3:0.8054 Acc of class 4:0.7628 Acc of class 5:0.6689

Acc of class 6:0.7844 Acc of class 7:0.8267 Acc of class 8:0.5749 Acc of class 9:0.7539 Train Accuracy: 0.7664 Acc of class 0:0.8378 Acc of class 1:0.8907 Acc of class 2:0.7209 Acc of class 3:0.8168 Acc of class 4:0.7821 Acc of class 5:0.6693 Acc of class 6:0.7797 Acc of class 7:0.8249 Acc of class 8:0.5698 Acc of class 9:0.7740 Test Accuracy: 0.7697 Train on 40000 examples. Acc of class 0:0.8455 Acc of class 1:0.8843 Acc of class 2:0.7111 Acc of class 3:0.7376 Acc of class 4:0.8381 Acc of class 5:0.6586 Acc of class 6:0.7753 Acc of class 7:0.8370 Acc of class 8:0.7250 Acc of class 9:0.6529 Train Accuracy: 0.7692 Acc of class 0:0.8643 Acc of class 1:0.8890 Acc of class 2:0.6754 Acc of class 3:0.7396 Acc of class 4:0.8544 Acc of class 5:0.6726 Acc of class 6:0.7704 Acc of class 7:0.8346 Acc of class 8:0.7372 Acc of class 9:0.6660 Test Accuracy: 0.7725 Train on 40500 examples. Acc of class 0:0.8624 Acc of class 1:0.8671 Acc of class 2:0.6786 Acc of class 3:0.7051 Acc of class 4:0.7460 Acc of class 5:0.7187 Acc of class 6:0.8425 Acc of class 7:0.8109 Acc of class 8:0.6838 Acc of class 9:0.7756 Train Accuracy: 0.7709 Acc of class 0:0.8796 Acc of class 1:0.8722 Acc of class 2:0.6550 Acc of class 3:0.6970 Acc of class 4:0.7688 Acc of class 5:0.7231

Acc of class 6:0.8278 Acc of class 7:0.8142 Acc of class 8:0.6971 Acc of class 9:0.7909 Test Accuracy: 0.7739 Train on 41000 examples. Acc of class 0:0.8378 Acc of class 1:0.8603 Acc of class 2:0.7299 Acc of class 3:0.7741 Acc of class 4:0.7941 Acc of class 5:0.6431 Acc of class 6:0.7967 Acc of class 7:0.8145 Acc of class 8:0.6946 Acc of class 9:0.7105 Train Accuracy: 0.7682 Acc of class 0:0.8602 Acc of class 1:0.8705 Acc of class 2:0.6967 Acc of class 3:0.7713 Acc of class 4:0.8126 Acc of class 5:0.6480 Acc of class 6:0.7923 Acc of class 7:0.8123 Acc of class 8:0.6899 Acc of class 9:0.7156 Test Accuracy: 0.7693 Train on 41500 examples. Acc of class 0:0.8435 Acc of class 1:0.8601 Acc of class 2:0.7014 Acc of class 3:0.7002 Acc of class 4:0.7645 Acc of class 5:0.5877 Acc of class 6:0.8099 Acc of class 7:0.8208 Acc of class 8:0.7819 Acc of class 9:0.7396 Train Accuracy: 0.7638 Acc of class 0:0.8633 Acc of class 1:0.8652 Acc of class 2:0.6686 Acc of class 3:0.7000 Acc of class 4:0.7770 Acc of class 5:0.5953 Acc of class 6:0.8038 Acc of class 7:0.8220 Acc of class 8:0.7731 Acc of class 9:0.7532 Test Accuracy: 0.7647 Train on 42000 examples. Acc of class 0:0.8583 Acc of class 1:0.9003 Acc of class 2:0.7467 Acc of class 3:0.8022 Acc of class 4:0.7451

Acc of class 5:0.5274 Acc of class 6:0.8383 Acc of class 7:0.7713 Acc of class 8:0.6657 Acc of class 9:0.7900 Train Accuracy: 0.7687 Acc of class 0:0.8755 Acc of class 1:0.9022 Acc of class 2:0.7141 Acc of class 3:0.8069 Acc of class 4:0.7658 Acc of class 5:0.5493 Acc of class 6:0.8319 Acc of class 7:0.7636 Acc of class 8:0.6550 Acc of class 9:0.8018 Test Accuracy: 0.7705 Train on 42500 examples. Acc of class 0:0.8695 Acc of class 1:0.8885 Acc of class 2:0.7254 Acc of class 3:0.7322 Acc of class 4:0.7662 Acc of class 5:0.6641 Acc of class 6:0.8097 Acc of class 7:0.7641 Acc of class 8:0.6551 Acc of class 9:0.7991 Train Accuracy: 0.7699 Acc of class 0:0.8837 Acc of class 1:0.8943 Acc of class 2:0.6996 Acc of class 3:0.7317 Acc of class 4:0.7780 Acc of class 5:0.6783 Acc of class 6:0.7933 Acc of class 7:0.7578 Acc of class 8:0.6550 Acc of class 9:0.8127 Test Accuracy: 0.7708 Train on 43000 examples. Acc of class 0:0.8627 Acc of class 1:0.8971 Acc of class 2:0.7560 Acc of class 3:0.7190 Acc of class 4:0.8345 Acc of class 5:0.6082 Acc of class 6:0.8018 Acc of class 7:0.8215 Acc of class 8:0.6980 Acc of class 9:0.7100 Train Accuracy: 0.7740 Acc of class 0:0.8827 Acc of class 1:0.9004 Acc of class 2:0.7248 Acc of class 3:0.7069 Acc of class 4:0.8534

Acc of class 5:0.6222 Acc of class 6:0.7902 Acc of class 7:0.8239 Acc of class 8:0.7002 Acc of class 9:0.7156 Test Accuracy: 0.7750 Train on 43500 examples. Acc of class 0:0.8217 Acc of class 1:0.8454 Acc of class 2:0.6687 Acc of class 3:0.7622 Acc of class 4:0.7677 Acc of class 5:0.7607 Acc of class 6:0.8344 Acc of class 7:0.8228 Acc of class 8:0.5975 Acc of class 9:0.7742 Train Accuracy: 0.7671 Acc of class 0:0.8429 Acc of class 1:0.8546 Acc of class 2:0.6434 Acc of class 3:0.7564 Acc of class 4:0.7821 Acc of class 5:0.7747 Acc of class 6:0.8205 Acc of class 7:0.8181 Acc of class 8:0.5811 Acc of class 9:0.7839 Test Accuracy: 0.7667 Train on 44000 examples. Acc of class 0:0.8470 Acc of class 1:0.8149 Acc of class 2:0.7355 Acc of class 3:0.7829 Acc of class 4:0.8037 Acc of class 5:0.6558 Acc of class 6:0.8520 Acc of class 7:0.8110 Acc of class 8:0.6807 Acc of class 9:0.7110 Train Accuracy: 0.7713 Acc of class 0:0.8531 Acc of class 1:0.8247 Acc of class 2:0.7103 Acc of class 3:0.7851 Acc of class 4:0.8269 Acc of class 5:0.6614 Acc of class 6:0.8424 Acc of class 7:0.8035 Acc of class 8:0.6468 Acc of class 9:0.7265 Test Accuracy: 0.7696 Train on 44500 examples. Acc of class 0:0.8253 Acc of class 1:0.8437 Acc of class 2:0.6851 Acc of class 3:0.8225

Acc of class 4:0.8408 Acc of class 5:0.6158 Acc of class 6:0.7984 Acc of class 7:0.7421 Acc of class 8:0.6953 Acc of class 9:0.7095 Train Accuracy: 0.7602 Acc of class 0:0.8439 Acc of class 1:0.8476 Acc of class 2:0.6570 Acc of class 3:0.8208 Acc of class 4:0.8483 Acc of class 5:0.6166 Acc of class 6:0.8006 Acc of class 7:0.7315 Acc of class 8:0.6622 Acc of class 9:0.7136 Test Accuracy: 0.7563 Train on 45000 examples. Acc of class 0:0.7962 Acc of class 1:0.8423 Acc of class 2:0.6650 Acc of class 3:0.6603 Acc of class 4:0.7703 Acc of class 5:0.7665 Acc of class 6:0.8163 Acc of class 7:0.8306 Acc of class 8:0.7669 Acc of class 9:0.7403 Train Accuracy: 0.7664 Acc of class 0:0.8184 Acc of class 1:0.8485 Acc of class 2:0.6366 Acc of class 3:0.6475 Acc of class 4:0.7882 Acc of class 5:0.7881 Acc of class 6:0.8132 Acc of class 7:0.8268 Acc of class 8:0.7639 Acc of class 9:0.7463 Test Accuracy: 0.7679 Train on 45500 examples. Acc of class 0:0.8166 Acc of class 1:0.8449 Acc of class 2:0.7831 Acc of class 3:0.6304 Acc of class 4:0.7136 Acc of class 5:0.7738 Acc of class 6:0.7813 Acc of class 7:0.8062 Acc of class 8:0.7043 Acc of class 9:0.7806 Train Accuracy: 0.7645 Acc of class 0:0.8408 Acc of class 1:0.8467 Acc of class 2:0.7490 Acc of class 3:0.6129

Acc of class 4:0.7159 Acc of class 5:0.7904 Acc of class 6:0.7735 Acc of class 7:0.7938 Acc of class 8:0.7064 Acc of class 9:0.7988 Test Accuracy: 0.7636 Train on 46000 examples. Acc of class 0:0.8177 Acc of class 1:0.8322 Acc of class 2:0.7477 Acc of class 3:0.6854 Acc of class 4:0.8441 Acc of class 5:0.6122 Acc of class 6:0.8109 Acc of class 7:0.8198 Acc of class 8:0.8123 Acc of class 9:0.6194 Train Accuracy: 0.7622 Acc of class 0:0.8367 Acc of class 1:0.8370 Acc of class 2:0.7103 Acc of class 3:0.6772 Acc of class 4:0.8595 Acc of class 5:0.6222 Acc of class 6:0.8184 Acc of class 7:0.8084 Acc of class 8:0.8183 Acc of class 9:0.6244 Test Accuracy: 0.7628 Train on 46500 examples. Acc of class 0:0.7871 Acc of class 1:0.8489 Acc of class 2:0.7946 Acc of class 3:0.8108 Acc of class 4:0.8097 Acc of class 5:0.6058 Acc of class 6:0.7660 Acc of class 7:0.8463 Acc of class 8:0.6392 Acc of class 9:0.6899 Train Accuracy: 0.7631 Acc of class 0:0.8061 Acc of class 1:0.8573 Acc of class 2:0.7626 Acc of class 3:0.8149 Acc of class 4:0.8147 Acc of class 5:0.6099 Acc of class 6:0.7641 Acc of class 7:0.8278 Acc of class 8:0.6366 Acc of class 9:0.6967 Test Accuracy: 0.7623 Train on 47000 examples. Acc of class 0:0.8352 Acc of class 1:0.8345 Acc of class 2:0.7226

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Acc of class 3:0.6355
Acc of class 4:0.8271
Acc of class 5:0.7421
Acc of class 6:0.8025
Acc of class 7:0.8613
Acc of class 8:0.7676
Acc of class 9:0.5893
Train Accuracy: 0.7629
Acc of class 0:0.8582
Acc of class 1:0.8370
Acc of class 2:0.6928
Acc of class 3:0.6267
Acc of class 4:0.8422
Acc of class 5:0.7578
Acc of class 6:0.7965
Acc of class 7:0.8424
Acc of class 8:0.7690
Acc of class 9:0.6046
Test Accuracy: 0.7630
Train on 47500 examples.
Acc of class 0:0.8774
Acc of class 1:0.8586
Acc of class 2:0.7150
Acc of class 3:0.7413
Acc of class 4:0.7792
Acc of class 5:0.6307
Acc of class 6:0.8288
Acc of class 7:0.7974
Acc of class 8:0.7587
Acc of class 9:0.7287
Train Accuracy: 0.7740
Acc of class 0:0.8939
Acc of class 1:0.8670
Acc of class 2:0.6802
Acc of class 3:0.7436
Acc of class 4:0.7882
Acc of class 5:0.6312
Acc of class 6:0.8225
Acc of class 7:0.7967
Acc of class 8:0.7649
Acc of class 9:0.7284
Test Accuracy: 0.7737
Train on 48000 examples.
Acc of class 0:0.7876
Acc of class 1:0.8588
Acc of class 2:0.7360
Acc of class 3:0.7845
Acc of class 4:0.7395
Acc of class 5:0.7104
Acc of class 6:0.8141
Acc of class 7:0.8091
Acc of class 8:0.6814
Acc of class 9:0.7092
Train Accuracy: 0.7652
Acc of class 0:0.8163
Acc of class 1:0.8652
Acc of class 2:0.6996
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Acc of class 3:0.7960 Acc of class 4:0.7495 Acc of class 5:0.7388 Acc of class 6:0.8142 Acc of class 7:0.7986 Acc of class 8:0.6612 Acc of class 9:0.7146 Test Accuracy: 0.7669 Train on 48500 examples. Acc of class 0:0.8042 Acc of class 1:0.8678 Acc of class 2:0.7546 Acc of class 3:0.7855 Acc of class 4:0.7836 Acc of class 5:0.6567 Acc of class 6:0.8244 Acc of class 7:0.7998 Acc of class 8:0.7024 Acc of class 9:0.6926 Train Accuracy: 0.7697 Acc of class 0:0.8286 Acc of class 1:0.8740 Acc of class 2:0.7161 Acc of class 3:0.7990 Acc of class 4:0.8035 Acc of class 5:0.6682 Acc of class 6:0.8236 Acc of class 7:0.7870 Acc of class 8:0.6992 Acc of class 9:0.6947 Test Accuracy: 0.7715 Train on 49000 examples. Acc of class 0:0.8378 Acc of class 1:0.8686 Acc of class 2:0.7751 Acc of class 3:0.7535 Acc of class 4:0.8155 Acc of class 5:0.6954 Acc of class 6:0.8227 Acc of class 7:0.8022 Acc of class 8:0.6402 Acc of class 9:0.6944 Train Accuracy: 0.7727 Acc of class 0:0.8673 Acc of class 1:0.8722 Acc of class 2:0.7452 Acc of class 3:0.7594 Acc of class 4:0.8238 Acc of class 5:0.7197 Acc of class 6:0.8173 Acc of class 7:0.7947 Acc of class 8:0.6550 Acc of class 9:0.7056 Test Accuracy: 0.7777 Train on 49500 examples. Acc of class 0:0.8366 Acc of class 1:0.8612

Acc of class 2:0.7503 Acc of class 3:0.7531 Acc of class 4:0.7277 Acc of class 5:0.6477 Acc of class 6:0.8251 Acc of class 7:0.7777 Acc of class 8:0.7260 Acc of class 9:0.7818 Train Accuracy: 0.7711 Acc of class 0:0.8633 Acc of class 1:0.8670 Acc of class 2:0.7122 Acc of class 3:0.7653 Acc of class 4:0.7301 Acc of class 5:0.6614 Acc of class 6:0.8132 Acc of class 7:0.7646 Acc of class 8:0.7310 Acc of class 9:0.7978 Test Accuracy: 0.7727 Train on 50000 examples. Acc of class 0:0.8229 Acc of class 1:0.8462 Acc of class 2:0.7338 Acc of class 3:0.6865 Acc of class 4:0.7402 Acc of class 5:0.6694 Acc of class 6:0.8643 Acc of class 7:0.8394 Acc of class 8:0.7636 Acc of class 9:0.7257 Train Accuracy: 0.7712 Acc of class 0:0.8459 Acc of class 1:0.8502 Acc of class 2:0.7045 Acc of class 3:0.6941 Acc of class 4:0.7587 Acc of class 5:0.6962 Acc of class 6:0.8486 Acc of class 7:0.8268 Acc of class 8:0.7721 Acc of class 9:0.7542 Test Accuracy: 0.7764 Train on 50500 examples. Acc of class 0:0.8361 Acc of class 1:0.8621 Acc of class 2:0.6851 Acc of class 3:0.8062 Acc of class 4:0.7446 Acc of class 5:0.6281 Acc of class 6:0.8604 Acc of class 7:0.8575 Acc of class 8:0.6806 Acc of class 9:0.7352 Train Accuracy: 0.7727 Acc of class 0:0.8582 Acc of class 1:0.8652

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Acc of class 2:0.6424
Acc of class 3:0.8198
Acc of class 4:0.7617
Acc of class 5:0.6413
Acc of class 6:0.8413
Acc of class 7:0.8424
Acc of class 8:0.6756
Acc of class 9:0.7661
Test Accuracy: 0.7737
Train on 51000 examples.
Acc of class 0:0.8028
Acc of class 1:0.8845
Acc of class 2:0.7550
Acc of class 3:0.6514
Acc of class 4:0.7761
Acc of class 5:0.7827
Acc of class 6:0.8358
Acc of class 7:0.8298
Acc of class 8:0.6507
Acc of class 9:0.7265
Train Accuracy: 0.7710
Acc of class 0:0.8235
Acc of class 1:0.9013
Acc of class 2:0.7287
Acc of class 3:0.6485
Acc of class 4:0.7902
Acc of class 5:0.8016
Acc of class 6:0.8267
Acc of class 7:0.8191
Acc of class 8:0.6786
Acc of class 9:0.7473
Test Accuracy: 0.7777
Train on 51500 examples.
Acc of class 0:0.8413
Acc of class 1:0.8713
Acc of class 2:0.6673
Acc of class 3:0.6638
Acc of class 4:0.7961
Acc of class 5:0.7652
Acc of class 6:0.8238
Acc of class 7:0.8571
Acc of class 8:0.7310
Acc of class 9:0.6620
Train Accuracy: 0.7694
Acc of class 0:0.8633
Acc of class 1:0.8819
Acc of class 2:0.6512
Acc of class 3:0.6723
Acc of class 4:0.8096
Acc of class 5:0.7892
Acc of class 6:0.8058
Acc of class 7:0.8434
Acc of class 8:0.7433
Acc of class 9:0.6749
Test Accuracy: 0.7741
Train on 52000 examples.
Acc of class 0:0.8275
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Acc of class 1:0.8493
Acc of class 2:0.6687
Acc of class 3:0.7854
Acc of class 4:0.7672
Acc of class 5:0.7047
Acc of class 6:0.8135
Acc of class 7:0.8358
Acc of class 8:0.7083
Acc of class 9:0.7062
Train Accuracy: 0.7687
Acc of class 0:0.8541
Acc of class 1:0.8555
Acc of class 2:0.6386
Acc of class 3:0.8020
Acc of class 4:0.7841
Acc of class 5:0.7175
Acc of class 6:0.7996
Acc of class 7:0.8268
Acc of class 8:0.7156
Acc of class 9:0.7284
Test Accuracy: 0.7735
Train on 52500 examples.
Acc of class 0:0.8190
Acc of class 1:0.8649
Acc of class 2:0.7221
Acc of class 3:0.7105
Acc of class 4:0.7544
Acc of class 5:0.7143
Acc of class 6:0.8180
Acc of class 7:0.8042
Acc of class 8:0.7371
Acc of class 9:0.7470
Train Accuracy: 0.7709
Acc of class 0:0.8439
Acc of class 1:0.8749
Acc of class 2:0.6928
Acc of class 3:0.7257
Acc of class 4:0.7668
Acc of class 5:0.7365
Acc of class 6:0.8090
Acc of class 7:0.7977
Acc of class 8:0.7433
Acc of class 9:0.7602
Test Accuracy: 0.7764
Train on 53000 examples.
Acc of class 0:0.8541
Acc of class 1:0.8538
Acc of class 2:0.7842
Acc of class 3:0.8139
Acc of class 4:0.7790
Acc of class 5:0.5350
Acc of class 6:0.7827
Acc of class 7:0.8369
Acc of class 8:0.6418
Acc of class 9:0.7065
Train Accuracy: 0.7627
Acc of class 0:0.8806
```

```
Acc of class 1:0.8670
Acc of class 2:0.7587
Acc of class 3:0.8208
Acc of class 4:0.7882
Acc of class 5:0.5628
Acc of class 6:0.7745
Acc of class 7:0.8298
Acc of class 8:0.6602
Acc of class 9:0.7225
Test Accuracy: 0.7702
Train on 53500 examples.
Acc of class 0:0.8496
Acc of class 1:0.8601
Acc of class 2:0.7152
Acc of class 3:0.7871
Acc of class 4:0.7715
Acc of class 5:0.7209
Acc of class 6:0.7550
Acc of class 7:0.7488
Acc of class 8:0.6542
Acc of class 9:0.7563
Train Accuracy: 0.7637
Acc of class 0:0.8735
Acc of class 1:0.8696
Acc of class 2:0.6822
Acc of class 3:0.8030
Acc of class 4:0.7902
Acc of class 5:0.7478
Acc of class 6:0.7443
Acc of class 7:0.7461
Acc of class 8:0.6766
Acc of class 9:0.7701
Test Accuracy: 0.7717
Train on 54000 examples.
Acc of class 0:0.8264
Acc of class 1:0.8420
Acc of class 2:0.7377
Acc of class 3:0.7584
Acc of class 4:0.8304
Acc of class 5:0.7133
Acc of class 6:0.7241
Acc of class 7:0.7049
Acc of class 8:0.7175
Acc of class 9:0.6875
Train Accuracy: 0.7554
Acc of class 0:0.8551
Acc of class 1:0.8485
Acc of class 2:0.7103
Acc of class 3:0.7743
Acc of class 4:0.8462
Acc of class 5:0.7276
Acc of class 6:0.7098
Acc of class 7:0.6955
Acc of class 8:0.7259
Acc of class 9:0.6858
Test Accuracy: 0.7590
Train on 54500 examples.
```

```
Acc of class 0:0.8325
Acc of class 1:0.8149
Acc of class 2:0.7509
Acc of class 3:0.6674
Acc of class 4:0.7924
Acc of class 5:0.7757
Acc of class 6:0.7310
Acc of class 7:0.8115
Acc of class 8:0.7209
Acc of class 9:0.6884
Train Accuracy: 0.7591
Acc of class 0:0.8602
Acc of class 1:0.8229
Acc of class 2:0.7190
Acc of class 3:0.6762
Acc of class 4:0.8167
Acc of class 5:0.8004
Acc of class 6:0.7255
Acc of class 7:0.8045
Acc of class 8:0.7248
Acc of class 9:0.7116
Test Accuracy: 0.7664
Train on 55000 examples.
Acc of class 0:0.8457
Acc of class 1:0.8177
Acc of class 2:0.7370
Acc of class 3:0.7920
Acc of class 4:0.7900
Acc of class 5:0.7270
Acc of class 6:0.7484
Acc of class 7:0.8233
Acc of class 8:0.6421
Acc of class 9:0.6732
Train Accuracy: 0.7612
Acc of class 0:0.8714
Acc of class 1:0.8247
Acc of class 2:0.7083
Acc of class 3:0.8010
Acc of class 4:0.8096
Acc of class 5:0.7478
Acc of class 6:0.7422
Acc of class 7:0.8084
Acc of class 8:0.6520
Acc of class 9:0.6957
Test Accuracy: 0.7671
Train on 55500 examples.
Acc of class 0:0.8477
Acc of class 1:0.8085
Acc of class 2:0.6746
Acc of class 3:0.7213
Acc of class 4:0.7715
Acc of class 5:0.7559
Acc of class 6:0.7942
Acc of class 7:0.8324
Acc of class 8:0.7445
Acc of class 9:0.6872
Train Accuracy: 0.7646
```

Acc of class 0:0.8714 Acc of class 1:0.8115 Acc of class 2:0.6434 Acc of class 3:0.7198 Acc of class 4:0.7923 Acc of class 5:0.7691 Acc of class 6:0.7912 Acc of class 7:0.8230 Acc of class 8:0.7402 Acc of class 9:0.7126 Test Accuracy: 0.7674 Train on 56000 examples. Acc of class 0:0.8335 Acc of class 1:0.8346 Acc of class 2:0.6868 Acc of class 3:0.8017 Acc of class 4:0.7028 Acc of class 5:0.6174 Acc of class 6:0.8050 Acc of class 7:0.8136 Acc of class 8:0.7590 Acc of class 9:0.7600 Train Accuracy: 0.7641 Acc of class 0:0.8551 Acc of class 1:0.8432 Acc of class 2:0.6531 Acc of class 3:0.8089 Acc of class 4:0.7291 Acc of class 5:0.6435 Acc of class 6:0.7933 Acc of class 7:0.8016 Acc of class 8:0.7485 Acc of class 9:0.7929 Test Accuracy: 0.7689 Train on 56500 examples. Acc of class 0:0.8752 Acc of class 1:0.8616 Acc of class 2:0.7210 Acc of class 3:0.7475 Acc of class 4:0.7665 Acc of class 5:0.7582 Acc of class 6:0.7922 Acc of class 7:0.7580 Acc of class 8:0.5802 Acc of class 9:0.7739 Train Accuracy: 0.7649 Acc of class 0:0.8898 Acc of class 1:0.8705 Acc of class 2:0.6909 Acc of class 3:0.7485 Acc of class 4:0.7841 Acc of class 5:0.7724 Acc of class 6:0.7808 Acc of class 7:0.7549 Acc of class 8:0.5883 Acc of class 9:0.7849 Test Accuracy: 0.7677

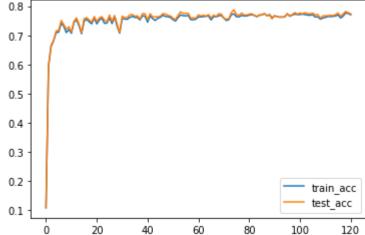
Train on 57000 examples. Acc of class 0:0.8678 Acc of class 1:0.8601 Acc of class 2:0.7298 Acc of class 3:0.6521 Acc of class 4:0.8379 Acc of class 5:0.7580 Acc of class 6:0.8001 Acc of class 7:0.7724 Acc of class 8:0.6879 Acc of class 9:0.6873 Train Accuracy: 0.7663 Acc of class 0:0.8827 Acc of class 1:0.8749 Acc of class 2:0.7035 Acc of class 3:0.6653 Acc of class 4:0.8432 Acc of class 5:0.7724 Acc of class 6:0.7850 Acc of class 7:0.7646 Acc of class 8:0.7156 Acc of class 9:0.6957 Test Accuracy: 0.7710 Train on 57500 examples. Acc of class 0:0.8480 Acc of class 1:0.8503 Acc of class 2:0.7764 Acc of class 3:0.7340 Acc of class 4:0.6963 Acc of class 5:0.6538 Acc of class 6:0.7935 Acc of class 7:0.8397 Acc of class 8:0.7322 Acc of class 9:0.7504 Train Accuracy: 0.7700 Acc of class 0:0.8704 Acc of class 1:0.8617 Acc of class 2:0.7403 Acc of class 3:0.7545 Acc of class 4:0.7098 Acc of class 5:0.6682 Acc of class 6:0.7881 Acc of class 7:0.8210 Acc of class 8:0.7505 Acc of class 9:0.7770 Test Accuracy: 0.7764 Train on 58000 examples. Acc of class 0:0.8697 Acc of class 1:0.8520 Acc of class 2:0.7952 Acc of class 3:0.7659 Acc of class 4:0.8155 Acc of class 5:0.5661 Acc of class 6:0.7950 Acc of class 7:0.8514 Acc of class 8:0.7115 Acc of class 9:0.5374

Train Accuracy: 0.7593 Acc of class 0:0.8918 Acc of class 1:0.8652 Acc of class 2:0.7655 Acc of class 3:0.7871 Acc of class 4:0.8320 Acc of class 5:0.5762 Acc of class 6:0.7912 Acc of class 7:0.8307 Acc of class 8:0.7279 Acc of class 9:0.5570 Test Accuracy: 0.7655 Train on 58500 examples. Acc of class 0:0.8616 Acc of class 1:0.8784 Acc of class 2:0.7983 Acc of class 3:0.7211 Acc of class 4:0.6008 Acc of class 5:0.6506 Acc of class 6:0.8511 Acc of class 7:0.7970 Acc of class 8:0.6539 Acc of class 9:0.8159 Train Accuracy: 0.7658 Acc of class 0:0.8765 Acc of class 1:0.8899 Acc of class 2:0.7800 Acc of class 3:0.7366 Acc of class 4:0.6039 Acc of class 5:0.6603 Acc of class 6:0.8392 Acc of class 7:0.7918 Acc of class 8:0.6889 Acc of class 9:0.8345 Test Accuracy: 0.7731 Train on 59000 examples. Acc of class 0:0.8690 Acc of class 1:0.8759 Acc of class 2:0.7801 Acc of class 3:0.7359 Acc of class 4:0.7782 Acc of class 5:0.6680 Acc of class 6:0.8320 Acc of class 7:0.8249 Acc of class 8:0.6982 Acc of class 9:0.6836 Train Accuracy: 0.7771 Acc of class 0:0.8827 Acc of class 1:0.8881 Acc of class 2:0.7481 Acc of class 3:0.7505 Acc of class 4:0.7923 Acc of class 5:0.6827 Acc of class 6:0.8194 Acc of class 7:0.8113 Acc of class 8:0.7218 Acc of class 9:0.7027

Test Accuracy: 0.7821 Train on 59500 examples. Acc of class 0:0.8501 Acc of class 1:0.8959 Acc of class 2:0.7294 Acc of class 3:0.7054 Acc of class 4:0.7711 Acc of class 5:0.7855 Acc of class 6:0.8256 Acc of class 7:0.8346 Acc of class 8:0.6348 Acc of class 9:0.6947 Train Accuracy: 0.7745 Acc of class 0:0.8673 Acc of class 1:0.9093 Acc of class 2:0.6977 Acc of class 3:0.7059 Acc of class 4:0.7933 Acc of class 5:0.8016 Acc of class 6:0.8090 Acc of class 7:0.8142 Acc of class 8:0.6489 Acc of class 9:0.7126 Test Accuracy: 0.7772 Train on 59999 examples. Acc of class 0:0.8535 Acc of class 1:0.8907 Acc of class 2:0.6739 Acc of class 3:0.7984 Acc of class 4:0.6984 Acc of class 5:0.7032 Acc of class 6:0.8450 Acc of class 7:0.7992 Acc of class 8:0.6079 Acc of class 9:0.8077 Train Accuracy: 0.7705 Acc of class 0:0.8694 Acc of class 1:0.8969 Acc of class 2:0.6541 Acc of class 3:0.8099 Acc of class 4:0.7098 Acc of class 5:0.7074 Acc of class 6:0.8257 Acc of class 7:0.8016 Acc of class 8:0.6119 Acc of class 9:0.8276

Test Accuracy: 0.7737

```
In [21]: # Plot training curves.
    plt.plot(np.reshape(train_accuracies, -1), label='train_acc')
    plt.plot(np.reshape(test_accuracies, -1), label='test_acc')
    plt.legend()
    plt.show()
```



```
In [ ]:
```