Assignment 3 Part 1: Developing Your Own Classifier

```
import os
import numpy as np
import torch
import torch.nn as nn
import torchvision

from torchvision import transforms
from sklearn.metrics import average_precision_score
from PIL import Image, ImageDraw
import matplotlib.pyplot as plt
from kaggle_submission import output_submission_csv
from classifier import SimpleClassifier, Classifier#, AlexNet
from voc_dataloader import VocDataset, VOC_CLASSES
%matplotlib inline
%load_ext autoreload
%autoreload 2
```

```
torch.manual_seed(17)
```

```
<torch._C.Generator at 0x7f619b5323f0>
```

Part 1B: Design your own network

In this notebook, your task is to create and train your own model for multi-label classification on VOC Pascal.

What to do

- 1. You will make change on network architecture in classifier.py.
- 2. You may also want to change other hyperparameters to assist your training to get a better performances. Hints will be given in the below instructions.

What to submit

Check the submission template for details what to submit.

```
def train_classifier(train_loader, classifier, criterion, optimizer):
    classifier.train()
    loss_ = 0.0
    losses = []
    for i, (images, labels) in enumerate(train_loader):
        images, labels = images.to(device), labels.to(device)
        optimizer.zero_grad()
        logits = classifier(images)
        loss = criterion(logits, labels)
        loss.backward()
        optimizer.step()
        losses.append(loss)
    return torch.stack(losses).mean().item()
```

```
def test_classifier(test_loader, classifier, criterion, print_ind_classes=T
   classifier.eval()
   losses = []
   with torch.no grad():
       y_true = np.zeros((0,21))
       y score = np.zeros((0,21))
       for i, (images, labels) in enumerate(test loader):
           images, labels = images.to(device), labels.to(device)
           logits = classifier(images)
           y true = np.concatenate((y true, labels.cpu().numpy()), axis=0)
           y_score = np.concatenate((y_score, logits.cpu().numpy()), axis=
           loss = criterion(logits, labels)
           losses.append(loss.item())
       aps = []
       # ignore first class which is background
       for i in range(1, y_true.shape[1]):
           ap = average_precision_score(y_true[:, i], y_score[:, i])
           if print_ind_classes:
               print('-----'.fo AP: {:>8.4f} -----'.fo
           aps.append(ap)
       mAP = np.mean(aps)
       test loss = np.mean(losses)
       if print total:
           print('mAP: {0:.4f}'.format(mAP))
           print('Avg loss: {}'.format(test_loss))
   return mAP, test_loss, aps
```

```
def plot_losses(train, val, test_frequency, num_epochs):
   plt.plot(train, label="train")
   indices = [i for i in range(num_epochs) if ((i+1)%test_frequency == 0 o
   plt.plot(indices, val, label="val")
   plt.title("Loss Plot")
   plt.ylabel("Loss")
   plt.xlabel("Epoch")
   plt.legend()
   plt.show()
def plot_mAP(train, val, test_frequency, num_epochs):
    indices = [i for i in range(num_epochs) if ((i+1)%test_frequency == 0 o
   plt.plot(indices, train, label="train")
   plt.plot(indices, val, label="val")
   plt.title("mAP Plot")
   plt.ylabel("mAP")
   plt.xlabel("Epoch")
   plt.legend()
   plt.show()
```

```
def train(classifier, num epochs, train loader, val loader, criterion, opti
   train_losses = []
   train mAPs = []
   val losses = []
    val mAPs = []
    for epoch in range(1, num epochs+1):
        print("Starting epoch number " + str(epoch))
        train_loss = train_classifier(train_loader, classifier, criterion,
        train losses.append(train loss)
        print("Loss for Training on Epoch " +str(epoch) + " is "+ str(train
        if(epoch%test_frequency==0 or epoch==1):
            mAP_train, _, _ = test_classifier(train_loader, classifier, cri
            train mAPs.append(mAP train)
           mAP_val, val_loss, _ = test_classifier(val_loader, classifier,
            print('Evaluating classifier')
            print("Mean Precision Score for Testing on Epoch " +str(epoch)
            val losses.append(val loss)
            val mAPs.append(mAP val)
    return classifier, train_losses, val_losses, train_mAPs, val_mAPs
```

Developing Your Own Model

Goal

To meet the benchmark for this assignment you will need to improve the network. Note you should have noticed pretrained Alenxt performs really well, but training Alexnet from scratch performs much worse. We hope you can design a better architecture over both the simple classifier and AlexNet to train from scratch.

How to start

You may take inspiration from other published architectures and architectures discussed in lecture. However, you are NOT allowed to use predefined models (e.g. models from torchvision) or use pretrained weights. Training must be done from scratch with your own custom model.

Some hints

There are a variety of different approaches you should try to improve performance from the simple classifier:

- Network architecture changes
 - Number of layers: try adding layers to make your network deeper
 - Batch normalization: adding batch norm between layers will likely give you a significant performance increase
 - Residual connections: as you increase the depth of your network, you will find that having residual connections like those in ResNet architectures will be helpful
- Optimizer: Instead of plain SGD, you may want to add a learning rate schedule, add momentum, or use one of the other optimizers you have learned about like Adam. Check the torch.optim package for other optimizers
- Data augmentation: You should use the torchvision.transforms module to try adding random resized crops and horizontal flips of the input data. Check transforms.RandomResizedCrop and transforms.RandomHorizontalFlip for this. Feel free to apply more transforms for data augmentation which can lead to better performance.
- Epochs: Once you have found a generally good hyperparameter setting try training for more epochs
- Loss function: You might want to add weighting to the MultiLabelSoftMarginLoss for classes that are less well represented or experiment with a different loss function

Note

We will soon be providing some initial expectations of mAP values as a function of epoch so you can get an early idea whether your implementation works without waiting a long time for training to converge.

What to submit

Submit your best model to Kaggle and save all plots for the writeup.

```
device = torch.device("cuda:0" if torch.cuda.is_available() else "cpu")
normalize = transforms.Normalize(mean=[0.485, 0.456, 0.406],
                                     std= [0.229, 0.224, 0.225])
train transform = transforms.Compose([
            transforms.Resize(227),
            transforms.CenterCrop(227),
            transforms.RandomResizedCrop(size=227, scale=(0.3,1)),
            transforms.RandomPerspective(),
            transforms.RandomHorizontalFlip(),
            transforms.RandomVerticalFlip(),
            transforms.RandomRotation(degrees=(-180,180)),
            transforms.ToTensor(),
           normalize
        ])
test_transform = transforms.Compose([
            transforms.Resize(227),
            transforms.CenterCrop(227),
            transforms.ToTensor(),
           normalize,
        ])
ds_train = VocDataset('VOCdevkit_2007/VOC2007/','train',train_transform)
ds_val = VocDataset('VOCdevkit_2007/VOC2007/','val',test_transform)
ds test = VocDataset('VOCdevkit 2007/VOC2007test/','test', test transform)
```

```
/workspace/assignment3_part1/voc_dataloader.py:137: VisibleDeprecationWarni
np.array(box_indices),
```

```
classifier = Classifier().to(device)
```

```
print(classifier)
```

```
Classifier(
  (conv1 1): Conv2d(3, 64, kernel size=(3, 3), stride=(1, 1), padding=(1, 1
  (conv1_bn1): BatchNorm2d(64, eps=1e-05, momentum=0.1, affine=True, track_
  (conv1_2): Conv2d(64, 64, kernel_size=(3, 3), stride=(1, 1), padding=(1,
  (conv1_bn2): BatchNorm2d(64, eps=1e-05, momentum=0.1, affine=True, track_
  (conv1_pool): MaxPool2d(kernel_size=(2, 2), stride=(2, 2), padding=0, dil
  (conv2 1): Conv2d(64, 128, kernel size=(3, 3), stride=(1, 1), padding=(1,
  (conv2_bn1): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True, track
  (conv2_2): Conv2d(128, 128, kernel_size=(3, 3), stride=(1, 1), padding=(1
  (conv2_bn2): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True, track
  (conv2_pool): MaxPool2d(kernel_size=(2, 2), stride=(2, 2), padding=0, dil
  (conv3_1): Conv2d(128, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1
  (conv3_bn1): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True, track
  (conv3_2): Conv2d(256, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1
  (conv3 bn2): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True, track
  (conv3_3): Conv2d(256, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1
  (conv3_bn3): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True, track
  (conv3_4): Conv2d(256, 256, kernel_size=(3, 3), stride=(1, 1), padding=(1
  (conv3 bn4): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True, track
  (conv3 pool): MaxPool2d(kernel size=(2, 2), stride=(2, 2), padding=0, dil
  (conv4_1): Conv2d(256, 512, kernel_size=(3, 3), stride=(1, 1), padding=(1
  (conv4_bn1): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True, track
  (conv4 2): Conv2d(512, 512, kernel size=(3, 3), stride=(1, 1), padding=(1
  (conv4 bn2): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True, track
  (conv4_3): Conv2d(512, 512, kernel_size=(3, 3), stride=(1, 1), padding=(1
  (conv4_bn3): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True, track
  (conv4 4): Conv2d(512, 512, kernel size=(3, 3), stride=(1, 1), padding=(1
  (conv4 bn4): BatchNorm2d(512, eps=1e-05, momentum=0.1, affine=True, track
  (conv4_pool): MaxPool2d(kernel_size=(2, 2), stride=(2, 2), padding=0, dil
  (conv5_1): Conv2d(512, 256, kernel_size=(1, 1), stride=(1, 1), padding=(1
  (conv5 bn1): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True, track
  (conv5 2): Conv2d(256, 256, kernel size=(1, 1), stride=(1, 1), padding=(1
  (conv5_bn2): BatchNorm2d(256, eps=1e-05, momentum=0.1, affine=True, track
  (conv5_3): Conv2d(256, 128, kernel_size=(1, 1), stride=(1, 1), padding=(1
  (conv5 bn3): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True, track
  (conv5_4): Conv2d(128, 128, kernel_size=(1, 1), stride=(1, 1), padding=(1
  (conv5_bn4): BatchNorm2d(128, eps=1e-05, momentum=0.1, affine=True, track
  (conv5_pool): MaxPool2d(kernel_size=(2, 2), stride=(2, 2), padding=0, dil
  (fc1): Linear(in features=15488, out features=4096, bias=True)
  (drop1): Dropout(p=0.5, inplace=False)
  (fc2): Linear(in_features=4096, out_features=512, bias=True)
  (drop2): Dropout(p=0.5, inplace=False)
  (fc3): Linear(in_features=512, out_features=21, bias=True)
```

```
----- Class: bird
                             AP:
                                   0.0851 -----
----- Class: boat
                             AP:
                                   0.0540 -----
----- Class: bottle
                             AP:
                                   0.0495 -----
----- Class: bus
                             AP:
                                   0.0580 ----
----- Class: car
                                   0.1822 -----
                             AP:
----- Class: cat
                                   0.0748 -----
                             AP:
                                   0.1515 -----
----- Class: chair
                             AP:
----- Class: cow
                             AP:
                                   0.0310 -----
----- Class: diningtable
                             AP:
                                   0.0684 -----
----- Class: dog
                             AP:
                                   0.1202 -----
                                   0.0792 -----
----- Class: horse
                             AP:
----- Class: motorbike
                             AP:
                                   0.0904 -----
----- Class: person
                             AP:
                                   0.4459 -----
----- Class: pottedplant
                                   0.1052 -----
                             AP:
----- Class: sheep
                             AP:
                                   0.0205 -----
----- Class: sofa
                             AP:
                                   0.0972 -----
----- Class: train
                             AP:
                                   0.0862 -----
----- Class: tymonitor
                             AP:
                                   0.0454 -----
mAP: 0.1048
Avg loss: 0.23370145373046397
Evaluating classifier
Mean Precision Score for Testing on Epoch 1 is 0.10484885236046941
Starting epoch number 2
Loss for Training on Epoch 2 is 0.25612616539001465
Starting epoch number 3
Loss for Training on Epoch 3 is 0.2459503710269928
Starting epoch number 4
Loss for Training on Epoch 4 is 0.24100370705127716
Starting epoch number 5
```

```
Loss for Training on Epoch 5 is 0.23660384118556976
----- Class: aeroplane
                           AP: 0.3872 -----
----- Class: bicycle
                           AP: 0.0526 -----
----- Class: bird
                           AP: 0.1222 -----
----- Class: boat
                           AP: 0.1342 -----
----- Class: bottle
                          AP: 0.0844 -----
----- Class: bus
                           AP:
                                 0.0565 -----
----- Class: car
                           AP:
                                 0.2784 -----
----- Class: cat
                           AP:
                                 0.1516 -----
----- Class: chair
                           AP: 0.2176 -----
----- Class: cow
                           AP: 0.0656 -----
----- Class: diningtable AP: 0.1436 -----
----- Class: dog
                           AP: 0.1571 -----
----- Class: horse
                           AP: 0.1138 -----
----- Class: motorbike
                           AP:
                                 0.1541 -----
----- Class: person
                           AP: 0.5465 -----
----- Class: pottedplant
                           AP:
                                 0.0781 -----
----- Class: sheep
                           AP: 0.0544 -----
----- Class: sofa
                           AP: 0.1469 -----
----- Class: train
                           AP: 0.1021 -----
----- Class: tymonitor AP: 0.0677 -----
mAP: 0.1557
Avg loss: 0.22377230487763883
Evaluating classifier
Mean Precision Score for Testing on Epoch 5 is 0.15572924612669997
Starting epoch number 6
Loss for Training on Epoch 6 is 0.23714704811573029
Starting epoch number 7
Loss for Training on Epoch 7 is 0.2362990379333496
Starting epoch number 8
Loss for Training on Epoch 8 is 0.2298543006181717
Starting epoch number 9
Loss for Training on Epoch 9 is 0.2293018400669098
Starting epoch number 10
Loss for Training on Epoch 10 is 0.2298445999622345
----- Class: aeroplane
                          AP: 0.3792 -----
----- Class: bicycle
                           AP: 0.0641 -----
----- Class: bird
                           AP: 0.1277 -----
----- Class: boat
                           AP: 0.2276 -----
----- Class: bottle
                                 0.0917 -----
                          AP:
----- Class: bus
                           AP:
                                 0.0828 -----
----- Class: car
                           AP:
                                 0.2786 -----
----- Class: cat
                                 0.2257 -----
                           AP:
                           AP: 0.2505 -----
----- Class: chair
----- Class: cow
                            AP:
                                 0.0545 -----
```

```
----- Class: diningtable
                                 0.1840 -----
                            AP:
----- Class: dog
                            AP: 0.1606 -----
----- Class: horse
                           AP:
                                 0.1943 -----
----- Class: motorbike
                           AP: 0.1176 -----
----- Class: person
                           AP: 0.5955 -----
----- Class: pottedplant
                           AP:
                                 0.1157 -----
                                 0.1267 -----
----- Class: sheep
                           AP:
----- Class: sofa
                           AP:
                                 0.1703 -----
----- Class: train
                           AP:
                                 0.1389 -----
----- Class: tymonitor AP: 0.0844 -----
mAP: 0.1835
Avg loss: 0.2172641832381487
Evaluating classifier
Mean Precision Score for Testing on Epoch 10 is 0.18351427416742636
Starting epoch number 11
Loss for Training on Epoch 11 is 0.22531871497631073
Starting epoch number 12
Loss for Training on Epoch 12 is 0.2242054045200348
Starting epoch number 13
Loss for Training on Epoch 13 is 0.22167007625102997
Starting epoch number 14
Loss for Training on Epoch 14 is 0.22305893898010254
Starting epoch number 15
Loss for Training on Epoch 15 is 0.2214478701353073
                           AP: 0.4072 -----
----- Class: aeroplane
----- Class: bicycle
                           AP:
                                 0.1066 -----
----- Class: bird
                           AP: 0.1493 -----
----- Class: boat
                           AP: 0.1788 -----
----- Class: bottle
                           AP: 0.1148 -----
----- Class: bus
                           AP: 0.0956 -----
----- Class: car
                           AP: 0.3342 -----
----- Class: cat
                           AP:
                                 0.2363 -----
----- Class: chair
                                 0.2627 -----
                           AP:
----- Class: cow
                            AP:
                                 0.0627 -----
----- Class: diningtable
                                 0.2022 -----
                            AP:
----- Class: dog
                            AP:
                                 0.1743 -----
----- Class: horse
                           AP: 0.3062 -----
----- Class: motorbike
                           AP:
                                 0.1827 -----
----- Class: person
                            AP:
                                 0.6454 -----
                                 0.1062 -----
----- Class: pottedplant
                            AP:
----- Class: sheep
                           AP:
                                 0.1475 -----
----- Class: sofa
                           AP:
                                 0.1958 -----
----- Class: train
                                 0.1213 -----
                           AP:
----- Class: tvmonitor
                                 0.0896 -----
                           AP:
mAP: 0.2060
```

```
Avg loss: 0.2096069749444723
Evaluating classifier
Mean Precision Score for Testing on Epoch 15 is 0.2059720416130401
Starting epoch number 16
Loss for Training on Epoch 16 is 0.22179169952869415
Starting epoch number 17
Loss for Training on Epoch 17 is 0.2180866301059723
Starting epoch number 18
Loss for Training on Epoch 18 is 0.21895694732666016
Starting epoch number 19
Loss for Training on Epoch 19 is 0.21334193646907806
Starting epoch number 20
Loss for Training on Epoch 20 is 0.2160310596227646
----- Class: aeroplane
                            AP: 0.4237 -----
----- Class: bicycle
                            AP:
                                   0.0999 -----
----- Class: bird
                            AP: 0.1393 -----
                            AP:
----- Class: boat
                                   0.1732 -----
                            AP: 0.1226 -----
----- Class: bottle
----- Class: bus
                            AP: 0.0828 -----
----- Class: car
                            AP: 0.3699 -----
----- Class: cat
                            AP: 0.2145 -----
----- Class: chair
                            AP: 0.2541 -----
----- Class: cow
                             AP: 0.0705 -----
----- Class: diningtable
                            AP:
                                   0.1690 -----
----- Class: dog
                                   0.1749 -----
                             AP:
----- Class: horse
                             AP:
                                   0.3425 -----
----- Class: motorbike
                             AP: 0.2112 -----
----- Class: person
                             AP: 0.6947 -----
----- Class: pottedplant
                            AP: 0.1310 -----
----- Class: sheep
                             AP: 0.1357 -----
----- Class: sofa
                            AP: 0.1781 -----
----- Class: train
                            AP: 0.1577 -----
----- Class: tymonitor AP: 0.0973 -----
mAP: 0.2121
Avg loss: 0.206390580534935
Evaluating classifier
Mean Precision Score for Testing on Epoch 20 is 0.21212866413842532
Starting epoch number 21
Loss for Training on Epoch 21 is 0.21386483311653137
Starting epoch number 22
Loss for Training on Epoch 22 is 0.21611249446868896
Starting epoch number 23
Loss for Training on Epoch 23 is 0.21426840126514435
Starting epoch number 24
Loss for Training on Epoch 24 is 0.21454186737537384
```

```
Starting epoch number 25
Loss for Training on Epoch 25 is 0.21143603324890137
----- Class: aeroplane
                           AP: 0.4560 -----
----- Class: bicycle
                           AP: 0.0762 -----
----- Class: bird
                           AP: 0.1169 -----
----- Class: boat
                           AP: 0.1760 -----
----- Class: bottle
                           AP: 0.1225 -----
----- Class: bus
                           AP:
                                 0.0978 -----
----- Class: car
                           AP: 0.3473 -----
----- Class: cat
                           AP: 0.2270 -----
----- Class: chair
                           AP: 0.3000 -----
----- Class: cow
                           AP: 0.0681 -----
                           AP: 0.2521 -----
----- Class: diningtable
                           AP: 0.1621 -----
----- Class: dog
----- Class: horse
                                 0.2997 -----
                           AP:
----- Class: motorbike
                           AP: 0.0988 -----
----- Class: person
                           AP:
                                 0.6326 -----
                           AP: 0.1207 -----
----- Class: pottedplant
----- Class: sheep
                           AP: 0.1181 -----
----- Class: sofa
                           AP: 0.2048 -----
----- Class: train
                           AP: 0.1514 -----
                          AP: 0.1020 -----
----- Class: tvmonitor
mAP: 0.2065
Avg loss: 0.2163195051252842
Evaluating classifier
Mean Precision Score for Testing on Epoch 25 is 0.20651146893341893
Starting epoch number 26
Loss for Training on Epoch 26 is 0.2119547575712204
Starting epoch number 27
Loss for Training on Epoch 27 is 0.21065738797187805
Starting epoch number 28
Loss for Training on Epoch 28 is 0.20945976674556732
Starting epoch number 29
Loss for Training on Epoch 29 is 0.2080259770154953
Starting epoch number 30
Loss for Training on Epoch 30 is 0.21413026750087738
----- Class: aeroplane
                           AP: 0.3852 -----
----- Class: bicycle
                           AP: 0.0773 -----
----- Class: bird
                           AP: 0.1512 -----
----- Class: boat
                           AP:
                                 0.1657 -----
----- Class: bottle
                           AP: 0.1187 -----
----- Class: bus
                           AP:
                                 0.0867 -----
----- Class: car
                           AP:
                                 0.3141 -----
----- Class: cat
                           AP: 0.2435 -----
----- Class: chair
                           AP: 0.2448 -----
```

```
----- Class: cow
                                 0.0765 -----
                            AP:
----- Class: diningtable
                            AP: 0.1661 -----
----- Class: dog
                            AP: 0.1908 -----
----- Class: horse
                           AP: 0.2422 -----
----- Class: motorbike
                           AP: 0.1618 -----
----- Class: person
                           AP: 0.5914 -----
----- Class: pottedplant
                           AP: 0.1387 -----
----- Class: sheep
                           AP:
                                 0.1433 -----
----- Class: sofa
                           AP: 0.1924 -----
----- Class: train
                           AP: 0.1011 -----
----- Class: tvmonitor
                           AP: 0.0874 -----
mAP: 0.1939
Avg loss: 0.22133502922952175
Evaluating classifier
Mean Precision Score for Testing on Epoch 30 is 0.19394395558547042
Starting epoch number 31
Loss for Training on Epoch 31 is 0.21375472843647003
Starting epoch number 32
Loss for Training on Epoch 32 is 0.2072724550962448
Starting epoch number 33
Loss for Training on Epoch 33 is 0.20740798115730286
Starting epoch number 34
Loss for Training on Epoch 34 is 0.2070954144001007
Starting epoch number 35
Loss for Training on Epoch 35 is 0.21015672385692596
----- Class: aeroplane
                           AP:
                                 0.4367 -----
----- Class: bicycle
                           AP: 0.1497 -----
----- Class: bird
                           AP: 0.1464 -----
----- Class: boat
                           AP: 0.1274 -----
----- Class: bottle
                           AP: 0.1484 -----
----- Class: bus
                           AP: 0.1115 -----
----- Class: car
                           AP: 0.4134 -----
----- Class: cat
                                 0.2620 -----
                           AP:
----- Class: chair
                           AP: 0.2933 -----
----- Class: cow
                           AP: 0.0821 -----
----- Class: diningtable
                           AP: 0.2605 -----
----- Class: dog
                           AP: 0.1716 -----
----- Class: horse
                           AP:
                                 0.3787 -----
----- Class: motorbike
                           AP:
                                 0.2887 -----
                                 0.7170 -----
----- Class: person
                            AP:
----- Class: pottedplant
                           AP:
                                 0.1195 -----
----- Class: sheep
                            AP:
                                 0.1275 -----
----- Class: sofa
                            AP:
                                 0.2136 -----
----- Class: train
                           AP: 0.2504 -----
                                 0.1141 -----
----- Class: tvmonitor
                           AP:
```

```
mAP: 0.2406
Avg loss: 0.20513488464057444
Evaluating classifier
Mean Precision Score for Testing on Epoch 35 is 0.24061798644374455
Starting epoch number 36
Loss for Training on Epoch 36 is 0.20654891431331635
Starting epoch number 37
Loss for Training on Epoch 37 is 0.20717106759548187
Starting epoch number 38
Loss for Training on Epoch 38 is 0.204878568649292
Starting epoch number 39
Loss for Training on Epoch 39 is 0.20350180566310883
Starting epoch number 40
Loss for Training on Epoch 40 is 0.2056141346693039
----- Class: aeroplane
                            AP: 0.4632 -----
----- Class: bicycle
                            AP: 0.0874 -----
----- Class: bird
                            AP:
                                  0.1499 -----
                            AP: 0.2117 -----
----- Class: boat
----- Class: bottle
                           AP: 0.0996 -----
----- Class: bus
                            AP: 0.0999 -----
----- Class: car
                            AP: 0.3959 -----
----- Class: cat
                            AP: 0.2450 -----
----- Class: chair
                            AP: 0.3127 -----
----- Class: cow
                            AP:
                                  0.0739 -----
----- Class: diningtable
                            AP: 0.1655 -----
----- Class: dog
                            AP:
                                  0.2023 -----
----- Class: horse
                            AP: 0.2918 -----
----- Class: motorbike
                           AP: 0.2475 -----
----- Class: person
                            AP: 0.7037 -----
----- Class: pottedplant AP: 0.1210 -----
----- Class: sheep
                            AP: 0.1535 -----
----- Class: sofa
                            AP: 0.2124 -----
----- Class: train
                            AP: 0.1368 -----
----- Class: tvmonitor
                            AP: 0.0939 -----
mAP: 0.2234
Avg loss: 0.21437875889241695
Evaluating classifier
Mean Precision Score for Testing on Epoch 40 is 0.22338192878785185
Starting epoch number 41
Loss for Training on Epoch 41 is 0.20516467094421387
Starting epoch number 42
Loss for Training on Epoch 42 is 0.20106247067451477
Starting epoch number 43
Loss for Training on Epoch 43 is 0.20113728940486908
Starting epoch number 44
```

```
Loss for Training on Epoch 44 is 0.19956214725971222
Starting epoch number 45
Loss for Training on Epoch 45 is 0.20022426545619965
----- Class: aeroplane
                           AP: 0.4896 -----
----- Class: bicycle
                           AP: 0.0735 -----
----- Class: bird
                           AP: 0.1455 -----
----- Class: boat
                           AP: 0.2104 -----
----- Class: bottle
                           AP:
                                 0.1336 -----
----- Class: bus
                           AP:
                                 0.1032 -----
----- Class: car
                           AP: 0.4038 -----
----- Class: cat
                                 0.3160 -----
                           AP:
----- Class: chair
                           AP: 0.3001 -----
----- Class: cow
                           AP: 0.0722 -----
----- Class: diningtable AP: 0.2356 -----
----- Class: dog
                           AP:
                                 0.2015 -----
----- Class: horse
                           AP:
                                 0.3496 -----
----- Class: motorbike
                          AP:
                                 0.1147 -----
                            AP: 0.7071 -----
----- Class: person
----- Class: pottedplant AP: 0.1495 -----
----- Class: sheep
                           AP: 0.1156 -----
----- Class: sofa
                           AP: 0.1853 -----
----- Class: train
                           AP: 0.2418 -----
----- Class: tymonitor
                           AP: 0.1085 -----
mAP: 0.2329
Avg loss: 0.2126306150108576
Evaluating classifier
Mean Precision Score for Testing on Epoch 45 is 0.2328600167515574
Starting epoch number 46
Loss for Training on Epoch 46 is 0.19898849725723267
Starting epoch number 47
Loss for Training on Epoch 47 is 0.21017256379127502
Starting epoch number 48
Loss for Training on Epoch 48 is 0.2013702392578125
Starting epoch number 49
Loss for Training on Epoch 49 is 0.20219166576862335
Starting epoch number 50
Loss for Training on Epoch 50 is 0.19899332523345947
----- Class: aeroplane
                           AP: 0.4738 -----
----- Class: bicycle
                           AP: 0.0517 -----
----- Class: bird
                           AP:
                                 0.1295 -----
----- Class: boat
                           AP: 0.1369 -----
----- Class: bottle
                           AP:
                                 0.1020 -----
----- Class: bus
                                 0.0633 -----
                           AP:
----- Class: car
                           AP: 0.3561 -----
----- Class: cat
                            AP:
                                 0.3049 -----
```

```
----- Class: chair
                                  0.2553 -----
                            AP:
----- Class: cow
                                 0.0874 -----
                            AP:
----- Class: diningtable
                                 0.1603 -----
                            AP:
----- Class: dog
                            AP:
                                 0.2390 -----
----- Class: horse
                            AP:
                                 0.2194 -----
----- Class: motorbike
                            AP:
                                 0.0599 -----
----- Class: person
                                 0.6847 -----
                            AP:
                                 0.0873 -----
----- Class: pottedplant
                            AP:
----- Class: sheep
                            AP:
                                 0.1691 -----
----- Class: sofa
                            AP:
                                 0.1978 -----
----- Class: train
                            AP: 0.2219 -----
----- Class: tymonitor AP: 0.0965 -----
mAP: 0.2048
Avg loss: 0.2285123836249113
Evaluating classifier
Mean Precision Score for Testing on Epoch 50 is 0.20483560921737332
Starting epoch number 51
Loss for Training on Epoch 51 is 0.1964704841375351
Starting epoch number 52
Loss for Training on Epoch 52 is 0.19498899579048157
Starting epoch number 53
Loss for Training on Epoch 53 is 0.1956622302532196
Starting epoch number 54
Loss for Training on Epoch 54 is 0.1941804736852646
Starting epoch number 55
Loss for Training on Epoch 55 is 0.19618363678455353
----- Class: aeroplane
                            AP: 0.4908 -----
----- Class: bicycle
                           AP:
                                 0.0779 -----
----- Class: bird
                           AP: 0.1713 -----
----- Class: boat
                           AP: 0.1794 -----
----- Class: bottle
                           AP: 0.1258 -----
----- Class: bus
                           AP: 0.1295 -----
----- Class: car
                                 0.3736 -----
                           AP:
----- Class: cat
                            AP:
                                 0.3116 -----
----- Class: chair
                                 0.3527 -----
                            AP:
----- Class: cow
                            AP: 0.0744 -----
----- Class: diningtable
                            AP: 0.2730 -----
----- Class: dog
                            AP: 0.2392 -----
----- Class: horse
                            AP:
                                 0.3884 -----
----- Class: motorbike
                            AP:
                                 0.2427 -----
----- Class: person
                            AP:
                                 0.7427 -----
----- Class: pottedplant
                            AP:
                                 0.1760 -----
----- Class: sheep
                                 0.1220 -----
                            AP:
----- Class: sofa
                            AP: 0.2487 -----
----- Class: train
                            AP:
                                 0.2909 -----
```

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----- Class: tymonitor AP: 0.1326 -----
mAP: 0.2572
Avg loss: 0.20364508889615535
Evaluating classifier
Mean Precision Score for Testing on Epoch 55 is 0.2571640027486515
Starting epoch number 56
Loss for Training on Epoch 56 is 0.1933538019657135
Starting epoch number 57
Loss for Training on Epoch 57 is 0.19811920821666718
Starting epoch number 58
Loss for Training on Epoch 58 is 0.19420532882213593
Starting epoch number 59
Loss for Training on Epoch 59 is 0.19613681733608246
Starting epoch number 60
Loss for Training on Epoch 60 is 0.1930803805589676
----- Class: aeroplane
                             AP: 0.4758 -----
----- Class: bicycle
                            AP:
                                   0.1184 -----
----- Class: bird
                            AP: 0.1710 -----
----- Class: boat
                            AP: 0.2340 -----
----- Class: bottle
                            AP: 0.1519 -----
----- Class: bus
                            AP: 0.1300 -----
---- Class: car
                            AP: 0.4572 -----
----- Class: cat
                            AP: 0.3086 -----
----- Class: chair
                            AP:
                                   0.3823 -----
----- Class: cow
                                   0.0852 -----
                             AP:
----- Class: diningtable
                            AP:
                                   0.2977 -----
----- Class: dog
                             AP: 0.2076 -----
----- Class: horse
                             AP: 0.4365 -----
----- Class: motorbike
                            AP: 0.2703 -----
----- Class: person
                             AP: 0.7612 -----
----- Class: pottedplant
                            AP: 0.2012 -----
----- Class: sheep
                            AP: 0.1509 -----
----- Class: sofa
                             AP:
                                   0.2761 -----
----- Class: train
                             AP: 0.3132 -----
----- Class: tymonitor AP: 0.1668 -----
mAP: 0.2798
Avg loss: 0.1951543226838112
Evaluating classifier
Mean Precision Score for Testing on Epoch 60 is 0.27980114045299354
Starting epoch number 61
Loss for Training on Epoch 61 is 0.1913294643163681
Starting epoch number 62
Loss for Training on Epoch 62 is 0.1965252012014389
Starting epoch number 63
Loss for Training on Epoch 63 is 0.19002629816532135
```

```
Starting epoch number 64
Loss for Training on Epoch 64 is 0.19061173498630524
Starting epoch number 65
Loss for Training on Epoch 65 is 0.1884617805480957
----- Class: aeroplane
                            AP: 0.5158 -----
----- Class: bicycle
                           AP:
                                 0.1677 -----
----- Class: bird
                           AP: 0.1921 -----
----- Class: boat
                           AP:
                                 0.2659 -----
----- Class: bottle
                           AP: 0.1313 -----
----- Class: bus
                           AP: 0.1626 -----
----- Class: car
                           AP: 0.4621 -----
----- Class: cat
                           AP: 0.3387 -----
----- Class: chair
                           AP: 0.3788 -----
                           AP: 0.0874 -----
----- Class: cow
----- Class: diningtable
                          AP:
                                 0.2979 -----
----- Class: dog
                           AP: 0.2425 -----
----- Class: horse
                           AP:
                                 0.3974 -----
----- Class: motorbike
                           AP: 0.2785 -----
----- Class: person
                            AP: 0.7621 -----
----- Class: pottedplant
                           AP: 0.2004 -----
----- Class: sheep
                           AP: 0.1850 -----
----- Class: sofa
                           AP: 0.2631 -----
----- Class: train
                           AP: 0.2982 -----
----- Class: tymonitor AP: 0.2090 -----
mAP: 0.2918
Avg loss: 0.19540488645434378
Evaluating classifier
Mean Precision Score for Testing on Epoch 65 is 0.2918282374438242
Starting epoch number 66
Loss for Training on Epoch 66 is 0.19305302202701569
Starting epoch number 67
Loss for Training on Epoch 67 is 0.195455864071846
Starting epoch number 68
Loss for Training on Epoch 68 is 0.18901410698890686
Starting epoch number 69
Loss for Training on Epoch 69 is 0.18997596204280853
Starting epoch number 70
Loss for Training on Epoch 70 is 0.18888311088085175
----- Class: aeroplane
                           AP: 0.4928 -----
----- Class: bicycle
                           AP: 0.1597 -----
----- Class: bird
                           AP: 0.1927 -----
----- Class: boat
                           AP:
                                 0.3066 -----
----- Class: bottle
                           AP: 0.1196 -----
----- Class: bus
                           AP: 0.1604 -----
----- Class: car
                            AP: 0.4462 -----
```

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----- Class: cat
                                  0.3454 -----
                            AP:
----- Class: chair
                                 0.3996 -----
                            AP:
----- Class: cow
                                 0.0783 -----
                            AP:
----- Class: diningtable
                            AP:
                                 0.2865 -----
----- Class: dog
                            AP:
                                 0.2281 -----
----- Class: horse
                            AP:
                                 0.3765 -----
----- Class: motorbike
                                 0.4011 -----
                            AP:
----- Class: person
                            AP:
                                 0.7569 -----
----- Class: pottedplant
                            AP:
                                 0.2441 -----
----- Class: sheep
                            AP: 0.1802 -----
----- Class: sofa
                            AP: 0.2104 -----
----- Class: train
                            AP: 0.3554 -----
----- Class: tymonitor
                           AP: 0.2161 -----
mAP: 0.2978
Avg loss: 0.19721623361110688
Evaluating classifier
Mean Precision Score for Testing on Epoch 70 is 0.2978283142861796
Starting epoch number 71
Loss for Training on Epoch 71 is 0.18835726380348206
Starting epoch number 72
Loss for Training on Epoch 72 is 0.18525883555412292
Starting epoch number 73
Loss for Training on Epoch 73 is 0.1880384236574173
Starting epoch number 74
Loss for Training on Epoch 74 is 0.1885732263326645
Starting epoch number 75
Loss for Training on Epoch 75 is 0.1880684643983841
----- Class: aeroplane
                        AP: 0.5147 -----
----- Class: bicycle
                           AP: 0.1326 -----
----- Class: bird
                           AP: 0.1569 -----
----- Class: boat
                           AP: 0.2524 -----
----- Class: bottle
                           AP: 0.1131 -----
----- Class: bus
                                 0.1163 -----
                           AP:
----- Class: car
                            AP:
                                 0.4216 -----
----- Class: cat
                                 0.3367 -----
                            AP:
----- Class: chair
                                 0.3405 -----
                            AP:
----- Class: cow
                            AP: 0.0917 -----
----- Class: diningtable
                            AP:
                                 0.2506 -----
----- Class: dog
                            AP:
                                 0.2613 -----
----- Class: horse
                            AP:
                                 0.3881 -----
----- Class: motorbike
                            AP:
                                 0.2305 -----
----- Class: person
                            AP:
                                 0.7799 -----
----- Class: pottedplant
                            AP:
                                 0.1785 -----
----- Class: sheep
                            AP: 0.1823 -----
----- Class: sofa
                            AP:
                                 0.2325 -----
```

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----- Class: train
                                  0.3467 -----
                             AP:
----- Class: tymonitor
                            AP: 0.1462 -----
mAP: 0.2737
Avg loss: 0.19817063361406326
Evaluating classifier
Mean Precision Score for Testing on Epoch 75 is 0.2736520757876445
Starting epoch number 76
Loss for Training on Epoch 76 is 0.18400278687477112
Starting epoch number 77
Loss for Training on Epoch 77 is 0.18722134828567505
Starting epoch number 78
Loss for Training on Epoch 78 is 0.18495237827301025
Starting epoch number 79
Loss for Training on Epoch 79 is 0.1837991327047348
Starting epoch number 80
Loss for Training on Epoch 80 is 0.1827940046787262
----- Class: aeroplane AP: 0.5190 -----
----- Class: bicycle
                            AP: 0.2029 -----
----- Class: bird
                            AP: 0.2245 -----
----- Class: boat
                            AP: 0.2437 -----
----- Class: bottle
                            AP: 0.1381 -----
----- Class: bus
                            AP: 0.1492 -----
----- Class: car
                            AP: 0.5318 -----
----- Class: cat
                            AP:
                                  0.3384 -----
----- Class: chair
                                  0.3984 -----
                            AP:
----- Class: cow
                            AP:
                                  0.0938 -----
----- Class: diningtable
                            AP: 0.3422 -----
----- Class: dog
                            AP: 0.2726 -----
----- Class: horse
                            AP: 0.3964 -----
----- Class: motorbike
                            AP: 0.3910 -----
----- Class: person
                            AP: 0.7851 -----
                            AP: 0.2027 -----
----- Class: pottedplant
----- Class: sheep
                            AP:
                                  0.1938 -----
----- Class: sofa
                            AP: 0.2455 -----
----- Class: train
                            AP: 0.3568 -----
----- Class: tvmonitor
                            AP: 0.2149 -----
mAP: 0.3120
Avg loss: 0.1874357733875513
Evaluating classifier
Mean Precision Score for Testing on Epoch 80 is 0.31204284292321627
Starting epoch number 81
Loss for Training on Epoch 81 is 0.18449459969997406
Starting epoch number 82
Loss for Training on Epoch 82 is 0.185738667845726
Starting epoch number 83
```

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Loss for Training on Epoch 83 is 0.18310581147670746
Starting epoch number 84
Loss for Training on Epoch 84 is 0.17955508828163147
Starting epoch number 85
Loss for Training on Epoch 85 is 0.18172632157802582
----- Class: aeroplane AP: 0.5147 -----
                           AP: 0.2005 -----
----- Class: bicycle
----- Class: bird
                           AP:
                                 0.2273 -----
----- Class: boat
                           AP: 0.2958 -----
----- Class: bottle
                          AP: 0.1201 -----
----- Class: bus
                           AP: 0.1315 -----
----- Class: car
                           AP: 0.4950 -----
----- Class: cat
                           AP: 0.3228 -----
----- Class: chair
                           AP: 0.4156 -----
----- Class: cow
                           AP: 0.0908 -----
                          AP: 0.3501 -----
----- Class: diningtable
----- Class: dog
                           AP: 0.2402 -----
                           AP: 0.4227 -----
----- Class: horse
----- Class: motorbike AP: 0.4220 -----
----- Class: person
                           AP: 0.7791 -----
----- Class: pottedplant AP: 0.2362 -----
----- Class: sheep
                           AP: 0.1940 -----
----- Class: sofa
                           AP: 0.2445 -----
----- Class: train
                           AP: 0.3484 -----
----- Class: tymonitor AP: 0.2113 -----
mAP: 0.3131
Avg loss: 0.18796622566878796
Evaluating classifier
Mean Precision Score for Testing on Epoch 85 is 0.31313095069909025
Starting epoch number 86
Loss for Training on Epoch 86 is 0.18246081471443176
Starting epoch number 87
Loss for Training on Epoch 87 is 0.18540893495082855
Starting epoch number 88
Loss for Training on Epoch 88 is 0.1810510903596878
Starting epoch number 89
Loss for Training on Epoch 89 is 0.18239746987819672
Starting epoch number 90
Loss for Training on Epoch 90 is 0.18225185573101044
----- Class: aeroplane AP: 0.5077 -----
                           AP: 0.1770 -----
----- Class: bicycle
----- Class: bird
                           AP: 0.2426 -----
----- Class: boat
                           AP: 0.2361 -----
----- Class: bottle AP: 0.1427 -----
----- Class: bus
                           AP: 0.1118 -----
```

```
----- Class: car
                                 0.4711 -----
                            AP:
----- Class: cat
                                 0.3398 -----
                            AP:
----- Class: chair
                            AP:
                                 0.4172 -----
----- Class: cow
                            AP: 0.0987 -----
----- Class: diningtable
                            AP: 0.3499 -----
----- Class: dog
                            AP:
                                 0.2735 -----
----- Class: horse
                                 0.4253 -----
                            AP:
----- Class: motorbike
                            AP:
                                 0.4155 -----
----- Class: person
                            AP:
                                 0.7988 -----
----- Class: pottedplant
                                 0.1953 -----
                            AP:
----- Class: sheep
                            AP: 0.1829 -----
----- Class: sofa
                           AP: 0.2168 -----
----- Class: train
                           AP: 0.3399 -----
----- Class: tymonitor AP: 0.2325 -----
mAP: 0.3088
Avg loss: 0.18912985026836396
Evaluating classifier
Mean Precision Score for Testing on Epoch 90 is 0.3087544722820693
Starting epoch number 91
Loss for Training on Epoch 91 is 0.1794406920671463
Starting epoch number 92
Loss for Training on Epoch 92 is 0.17933619022369385
Starting epoch number 93
Loss for Training on Epoch 93 is 0.17795097827911377
Starting epoch number 94
Loss for Training on Epoch 94 is 0.17659930884838104
Starting epoch number 95
Loss for Training on Epoch 95 is 0.17674197256565094
----- Class: aeroplane
                           AP: 0.5426 -----
----- Class: bicycle
                                 0.0982 -----
                           AP:
----- Class: bird
                           AP: 0.1860 -----
----- Class: boat
                           AP:
                                 0.2888 -----
----- Class: bottle
                                 0.1103 -----
                           AP:
----- Class: bus
                           AP:
                                 0.0849 -----
----- Class: car
                                 0.4557 -----
                           AP:
----- Class: cat
                           AP:
                                 0.3489 -----
----- Class: chair
                            AP: 0.3289 -----
----- Class: cow
                            AP:
                                 0.0855 -----
----- Class: diningtable
                           AP: 0.2692 -----
----- Class: dog
                            AP:
                                 0.2697 -----
----- Class: horse
                                 0.3169 -----
                            AP:
----- Class: motorbike
                            AP:
                                 0.1721 -----
----- Class: person
                            AP:
                                 0.7383 -----
----- Class: pottedplant
                            AP: 0.1526 -----
----- Class: sheep
                                 0.2075 -----
                            AP:
```

```
0.2689 -----
----- Class: sofa
                            AP:
----- Class: train
                            AP: 0.3593 -----
----- Class: tymonitor AP: 0.1403 -----
mAP: 0.2712
Avg loss: 0.21776705421507359
Evaluating classifier
Mean Precision Score for Testing on Epoch 95 is 0.27121977669400305
Starting epoch number 96
Loss for Training on Epoch 96 is 0.1778525561094284
Starting epoch number 97
Loss for Training on Epoch 97 is 0.17980550229549408
Starting epoch number 98
Loss for Training on Epoch 98 is 0.17916999757289886
Starting epoch number 99
Loss for Training on Epoch 99 is 0.17632070183753967
Starting epoch number 100
Loss for Training on Epoch 100 is 0.1763889342546463
----- Class: aeroplane
                           AP: 0.5585 -----
----- Class: bicycle
                           AP: 0.2113 -----
----- Class: bird
                            AP: 0.2029 -----
----- Class: boat
                            AP: 0.3375 -----
----- Class: bottle
                           AP: 0.1320 -----
----- Class: bus
                            AP: 0.2066 -----
----- Class: car
                            AP:
                                  0.5393 -----
----- Class: cat
                                  0.3721 -----
                            AP:
----- Class: chair
                            AP:
                                  0.4327 -----
----- Class: cow
                            AP: 0.0964 -----
----- Class: diningtable AP: 0.3633 -----
----- Class: dog
                            AP: 0.2919 -----
----- Class: horse
                            AP: 0.4579 -----
----- Class: motorbike
                           AP: 0.4810 -----
                                  0.8057 -----
----- Class: person
                            AP:
----- Class: pottedplant
                                  0.2223 -----
                            AP:
----- Class: sheep
                            AP:
                                  0.1710 -----
----- Class: sofa
                            AP: 0.2461 -----
----- Class: train
                            AP: 0.3850 -----
----- Class: tvmonitor AP: 0.2206 -----
mAP: 0.3367
Avg loss: 0.18452093973755837
Evaluating classifier
Mean Precision Score for Testing on Epoch 100 is 0.33671495364999204
Starting epoch number 101
Loss for Training on Epoch 101 is 0.17753233015537262
Starting epoch number 102
Loss for Training on Epoch 102 is 0.1766238957643509
```

```
Starting epoch number 103
Loss for Training on Epoch 103 is 0.17749325931072235
Starting epoch number 104
Loss for Training on Epoch 104 is 0.1787945032119751
Starting epoch number 105
Loss for Training on Epoch 105 is 0.1764296591281891
----- Class: aeroplane
                           AP: 0.5839 -----
----- Class: bicycle
                           AP:
                                  0.2151 -----
----- Class: bird
                           AP: 0.2165 -----
----- Class: boat
                           AP: 0.3741 -----
----- Class: bottle
                           AP: 0.1469 -----
----- Class: bus
                           AP: 0.1782 -----
----- Class: car
                           AP: 0.5453 -----
----- Class: cat
                           AP: 0.3661 -----
----- Class: chair
                           AP:
                                  0.4130 -----
----- Class: cow
                            AP: 0.1159 -----
----- Class: diningtable AP:
                                  0.3811 -----
                            AP: 0.2678 -----
----- Class: dog
----- Class: horse
                            AP: 0.4675 -----
----- Class: motorbike
                           AP: 0.5398 -----
----- Class: person
                            AP: 0.8003 -----
----- Class: pottedplant
                           AP: 0.2100 -----
----- Class: sheep
                           AP: 0.1732 -----
----- Class: sofa
                           AP:
                                  0.2316 -----
----- Class: train
                           AP: 0.4181 -----
----- Class: tymonitor AP: 0.1886 -----
mAP: 0.3416
Avg loss: 0.18362870253622532
Evaluating classifier
Mean Precision Score for Testing on Epoch 105 is 0.3416405230396874
Starting epoch number 106
Loss for Training on Epoch 106 is 0.17466728389263153
Starting epoch number 107
Loss for Training on Epoch 107 is 0.17214420437812805
Starting epoch number 108
Loss for Training on Epoch 108 is 0.1731700897216797
Starting epoch number 109
Loss for Training on Epoch 109 is 0.17357270419597626
Starting epoch number 110
Loss for Training on Epoch 110 is 0.18130990862846375
----- Class: aeroplane
                            AP: 0.5262 -----
----- Class: bicycle
                           AP:
                                  0.1161 -----
----- Class: bird
                           AP: 0.2448 -----
                           AP: 0.3283 -----
----- Class: boat
                           AP: 0.1290 -----
----- Class: bottle
```

```
----- Class: bus
                                 0.1056 -----
                            AP:
----- Class: car
                                 0.4457 -----
                            AP:
----- Class: cat
                            AP:
                                 0.3589 -----
----- Class: chair
                            AP:
                                 0.4024 -----
----- Class: cow
                            AP: 0.1197 -----
----- Class: diningtable
                            AP:
                                 0.3140 -----
----- Class: dog
                            AP:
                                 0.2748 -----
----- Class: horse
                            AP:
                                 0.4575 -----
----- Class: motorbike
                            AP:
                                 0.3763 -----
----- Class: person
                                 0.7999 -----
                            AP:
----- Class: pottedplant
                            AP: 0.1909 -----
----- Class: sheep
                            AP: 0.1909 -----
----- Class: sofa
                           AP: 0.2770 -----
----- Class: train
                           AP: 0.3626 -----
----- Class: tymonitor
                           AP: 0.1858 -----
mAP: 0.3103
Avg loss: 0.1948418091982603
Evaluating classifier
Mean Precision Score for Testing on Epoch 110 is 0.31031154160863894
Starting epoch number 111
Loss for Training on Epoch 111 is 0.17718884348869324
Starting epoch number 112
Loss for Training on Epoch 112 is 0.1740882694721222
Starting epoch number 113
Loss for Training on Epoch 113 is 0.1756453812122345
Starting epoch number 114
Loss for Training on Epoch 114 is 0.17389769852161407
Starting epoch number 115
Loss for Training on Epoch 115 is 0.17143048346042633
----- Class: aeroplane
                            AP: 0.5628 -----
----- Class: bicycle
                           AP:
                                 0.2361 -----
----- Class: bird
                           AP: 0.2728 -----
----- Class: boat
                                 0.3765 -----
                           AP:
----- Class: bottle
                           AP: 0.1401 -----
----- Class: bus
                           AP: 0.1541 -----
----- Class: car
                           AP: 0.5097 -----
----- Class: cat
                           AP: 0.3871 -----
----- Class: chair
                           AP: 0.4317 -----
----- Class: cow
                            AP: 0.1224 -----
----- Class: diningtable
                           AP:
                                 0.3286 -----
----- Class: dog
                            AP:
                                 0.2566 -----
----- Class: horse
                            AP:
                                 0.5161 -----
----- Class: motorbike
                            AP:
                                 0.4741 -----
----- Class: person
                            AP: 0.8072 -----
----- Class: pottedplant
                            AP:
                                 0.2285 -----
```

```
----- Class: sheep
                                  0.1594 -----
                             AP:
----- Class: sofa
                            AP: 0.2428 -----
----- Class: train
                            AP: 0.4856 -----
----- Class: tvmonitor
                            AP: 0.2561 -----
mAP: 0.3474
Avg loss: 0.1796851646155119
Evaluating classifier
Mean Precision Score for Testing on Epoch 115 is 0.3474119211038059
Starting epoch number 116
Loss for Training on Epoch 116 is 0.17019341886043549
Starting epoch number 117
Loss for Training on Epoch 117 is 0.17159968614578247
Starting epoch number 118
Loss for Training on Epoch 118 is 0.17658376693725586
Starting epoch number 119
Loss for Training on Epoch 119 is 0.1706826239824295
Starting epoch number 120
Loss for Training on Epoch 120 is 0.16892795264720917
----- Class: aeroplane
                            AP:
                                  0.5540 -----
----- Class: bicycle
                            AP: 0.2238 -----
----- Class: bird
                            AP: 0.2795 -----
----- Class: boat
                            AP: 0.3967 -----
----- Class: bottle
                            AP: 0.1224 -----
----- Class: bus
                            AP:
                                  0.1891 -----
----- Class: car
                                  0.5230 -----
                            AP:
----- Class: cat
                            AP:
                                  0.3657 -----
----- Class: chair
                            AP: 0.4274 -----
----- Class: cow
                            AP: 0.1168 -----
----- Class: diningtable
                            AP: 0.3466 -----
----- Class: dog
                            AP: 0.2742 -----
----- Class: horse
                            AP:
                                  0.4577 -----
----- Class: motorbike
                                  0.4508 -----
                            AP:
----- Class: person
                            AP:
                                  0.7988 -----
----- Class: pottedplant
                            AP:
                                  0.2406 -----
----- Class: sheep
                            AP: 0.1740 -----
----- Class: sofa
                            AP: 0.2549 -----
----- Class: train
                            AP: 0.4669 -----
----- Class: tymonitor
                            AP: 0.2438 -----
mAP: 0.3453
Avg loss: 0.1825026772916317
Evaluating classifier
Mean Precision Score for Testing on Epoch 120 is 0.3453441653002205
Starting epoch number 121
Loss for Training on Epoch 121 is 0.1693238466978073
Starting epoch number 122
```

```
Loss for Training on Epoch 122 is 0.17154033482074738
Starting epoch number 123
Loss for Training on Epoch 123 is 0.16940325498580933
Starting epoch number 124
Loss for Training on Epoch 124 is 0.16830742359161377
Starting epoch number 125
Loss for Training on Epoch 125 is 0.16792871057987213
----- Class: aeroplane
                            AP:
                                  0.5998 -----
----- Class: bicycle
                           AP:
                                  0.2039 -----
----- Class: bird
                            AP: 0.3121 -----
----- Class: boat
                            AP: 0.4352 -----
----- Class: bottle
                           AP: 0.1326 -----
----- Class: bus
                           AP: 0.2000 -----
                           AP: 0.5770 -----
----- Class: car
----- Class: cat
                           AP:
                                  0.3835 -----
----- Class: chair
                            AP:
                                  0.4325 -----
----- Class: cow
                            AP:
                                  0.1295 -----
----- Class: diningtable
                           AP: 0.3543 -----
----- Class: dog
                            AP: 0.2853 -----
----- Class: horse
                           AP: 0.5074 -----
----- Class: motorbike
                           AP: 0.4926 -----
----- Class: person
                            AP: 0.8139 -----
----- Class: pottedplant AP: 0.2387 -----
----- Class: sheep
                            AP:
                                  0.1661 -----
----- Class: sofa
                            AP: 0.2634 -----
----- Class: train
                            AP: 0.4413 -----
----- Class: tymonitor
                            AP: 0.2743 -----
mAP: 0.3622
Avg loss: 0.17744391597807407
Evaluating classifier
Mean Precision Score for Testing on Epoch 125 is 0.362183804656031
Starting epoch number 126
Loss for Training on Epoch 126 is 0.1678159087896347
Starting epoch number 127
Loss for Training on Epoch 127 is 0.16564182937145233
Starting epoch number 128
Loss for Training on Epoch 128 is 0.16519935429096222
Starting epoch number 129
Loss for Training on Epoch 129 is 0.16630160808563232
Starting epoch number 130
Loss for Training on Epoch 130 is 0.16546528041362762
----- Class: aeroplane
                           AP: 0.5520 -----
----- Class: bicycle
                            AP: 0.2333 -----
----- Class: bird
                            AP: 0.2862 -----
----- Class: boat
                            AP: 0.3336 -----
```

```
----- Class: bottle
                                 0.1307 -----
                            AP:
----- Class: bus
                                 0.0945 -----
                            AP:
----- Class: car
                                 0.5308 -----
                            AP:
----- Class: cat
                            AP:
                                 0.3685 -----
----- Class: chair
                            AP:
                                 0.4019 -----
---- Class: cow
                            AP:
                                 0.1232 -----
----- Class: diningtable
                                 0.2976 -----
                            AP:
----- Class: dog
                            AP:
                                 0.2661 -----
----- Class: horse
                            AP:
                                 0.4862 -----
----- Class: motorbike
                            AP:
                                 0.4795 -----
----- Class: person
                                 0.8038 -----
                            AP:
----- Class: pottedplant
                           AP: 0.2139 -----
                            AP: 0.1812 -----
----- Class: sheep
----- Class: sofa
                           AP: 0.3102 -----
----- Class: train
                           AP:
                                 0.4051 -----
----- Class: tvmonitor
                           AP:
                                 0.1985 -----
mAP: 0.3348
Avg loss: 0.19440331533551217
Evaluating classifier
Mean Precision Score for Testing on Epoch 130 is 0.33484762165407755
Starting epoch number 131
Loss for Training on Epoch 131 is 0.16510438919067383
Starting epoch number 132
Loss for Training on Epoch 132 is 0.1636977642774582
Starting epoch number 133
Loss for Training on Epoch 133 is 0.16521911323070526
Starting epoch number 134
Loss for Training on Epoch 134 is 0.16420809924602509
Starting epoch number 135
Loss for Training on Epoch 135 is 0.1701192408800125
----- Class: aeroplane AP: 0.5566 -----
----- Class: bicycle
                           AP:
                                 0.2276 -----
----- Class: bird
                                 0.2752 -----
                           AP:
----- Class: boat
                           AP: 0.3121 -----
----- Class: bottle
                           AP: 0.1300 -----
----- Class: bus
                           AP:
                                 0.2188 -----
----- Class: car
                           AP: 0.5305 -----
----- Class: cat
                           AP:
                                 0.3904 -----
----- Class: chair
                            AP:
                                 0.4284 -----
                                 0.1125 -----
----- Class: cow
                            AP:
----- Class: diningtable
                            AP:
                                 0.3464 -----
                                 0.2623 -----
----- Class: dog
                            AP:
----- Class: horse
                            AP:
                                 0.4595 -----
----- Class: motorbike
                            AP: 0.3958 -----
----- Class: person
                            AP:
                                 0.7996 -----
```

```
0.2567 -----
----- Class: pottedplant AP:
----- Class: sheep
                            AP: 0.1867 -----
----- Class: sofa
                           AP: 0.2599 -----
----- Class: train
                           AP: 0.5003 -----
----- Class: tymonitor AP: 0.2592 -----
mAP: 0.3454
Avg loss: 0.183145272359252
Evaluating classifier
Mean Precision Score for Testing on Epoch 135 is 0.3454216232499371
Starting epoch number 136
Loss for Training on Epoch 136 is 0.16827239096164703
Starting epoch number 137
Loss for Training on Epoch 137 is 0.16446636617183685
Starting epoch number 138
Loss for Training on Epoch 138 is 0.16842412948608398
Starting epoch number 139
Loss for Training on Epoch 139 is 0.16441592574119568
Starting epoch number 140
Loss for Training on Epoch 140 is 0.1643056422472
----- Class: aeroplane
                           AP: 0.5900 -----
----- Class: bicycle
                           AP: 0.2601 -----
----- Class: bird
                           AP: 0.2465 -----
----- Class: boat
                           AP: 0.3753 -----
                                 0.1343 -----
----- Class: bottle
                           AP:
----- Class: bus
                                 0.2070 -----
                           AP:
----- Class: car
                           AP:
                                 0.5420 -----
----- Class: cat
                           AP: 0.3882 -----
----- Class: chair
                           AP: 0.4313 -----
----- Class: cow
                           AP: 0.1306 -----
----- Class: diningtable AP: 0.3244 -----
----- Class: dog
                           AP: 0.2824 -----
----- Class: horse
                                 0.4780 -----
                           AP:
----- Class: motorbike
                                 0.4285 -----
                          AP:
----- Class: person
                            AP:
                                 0.8060 -----
----- Class: pottedplant
                           AP: 0.2411 -----
----- Class: sheep
                           AP: 0.1692 -----
----- Class: sofa
                           AP: 0.2408 -----
----- Class: train
                           AP: 0.5042 -----
----- Class: tymonitor AP: 0.2890 -----
mAP: 0.3534
Avg loss: 0.18152074962854386
Evaluating classifier
Mean Precision Score for Testing on Epoch 140 is 0.35343823667814894
Starting epoch number 141
```

Loss for Training on Epoch 141 is 0.15682008862495422

```
Starting epoch number 142
Loss for Training on Epoch 142 is 0.16553859412670135
Starting epoch number 143
Loss for Training on Epoch 143 is 0.17337201535701752
Starting epoch number 144
Loss for Training on Epoch 144 is 0.16436628997325897
Starting epoch number 145
Loss for Training on Epoch 145 is 0.1634150743484497
----- Class: aeroplane
                            AP: 0.5639 -----
                           AP: 0.2236 -----
----- Class: bicycle
----- Class: bird
                            AP: 0.2484 -----
----- Class: boat
                           AP: 0.4128 -----
----- Class: bottle
                           AP: 0.1224 -----
----- Class: bus
                           AP: 0.2011 -----
----- Class: car
                           AP: 0.5303 -----
----- Class: cat
                           AP: 0.3963 -----
----- Class: chair
                           AP:
                                  0.4107 -----
                            AP: 0.1107 -----
----- Class: cow
----- Class: diningtable AP: 0.3134 -----
----- Class: dog
                            AP: 0.3084 -----
----- Class: horse
                            AP: 0.4528 -----
----- Class: motorbike
                           AP: 0.4250 -----
----- Class: person
                            AP: 0.7967 -----
----- Class: pottedplant
                           AP: 0.2546 -----
----- Class: sheep
                            AP: 0.1593 -----
----- Class: sofa
                           AP:
                                  0.2546 -----
----- Class: train
                           AP: 0.5044 -----
----- Class: tymonitor AP: 0.2584 -----
mAP: 0.3474
Avg loss: 0.18367352802306414
Evaluating classifier
Mean Precision Score for Testing on Epoch 145 is 0.3473841355856161
Starting epoch number 146
Loss for Training on Epoch 146 is 0.16451644897460938
Starting epoch number 147
Loss for Training on Epoch 147 is 0.16037076711654663
Starting epoch number 148
Loss for Training on Epoch 148 is 0.16059236228466034
Starting epoch number 149
Loss for Training on Epoch 149 is 0.1613425463438034
Starting epoch number 150
Loss for Training on Epoch 150 is 0.16157834231853485
----- Class: aeroplane AP: 0.6035 -----
----- Class: bicycle AP: 0.2994 -----
----- Class: bird
                            AP: 0.2751 -----
```

```
----- Class: boat
                                 0.4006 -----
                            AP:
----- Class: bottle
                                 0.1302 -----
                            AP:
----- Class: bus
                            AP:
                                 0.1928 -----
----- Class: car
                            AP:
                                 0.5404 -----
----- Class: cat
                            AP:
                                 0.3898 -----
----- Class: chair
                            AP:
                                 0.4390 -----
----- Class: cow
                                 0.1197 -----
                            AP:
----- Class: diningtable
                            AP:
                                 0.4068 -----
----- Class: dog
                            AP:
                                 0.2895 -----
----- Class: horse
                            AP:
                                 0.5006 -----
                                 0.4327 -----
----- Class: motorbike
                            AP:
----- Class: person
                            AP: 0.8064 -----
                           AP: 0.2572 -----
----- Class: pottedplant
----- Class: sheep
                           AP: 0.1583 -----
----- Class: sofa
                           AP:
                                 0.2994 -----
----- Class: train
                            AP: 0.5393 -----
----- Class: tvmonitor AP:
                                 0.2946 -----
mAP: 0.3688
Avg loss: 0.18335101157426834
Evaluating classifier
Mean Precision Score for Testing on Epoch 150 is 0.3687743392887937
Starting epoch number 151
Loss for Training on Epoch 151 is 0.16063402593135834
Starting epoch number 152
Loss for Training on Epoch 152 is 0.15972664952278137
Starting epoch number 153
Loss for Training on Epoch 153 is 0.1582740694284439
Starting epoch number 154
Loss for Training on Epoch 154 is 0.16014015674591064
Starting epoch number 155
Loss for Training on Epoch 155 is 0.15677765011787415
----- Class: aeroplane
                           AP:
                                 0.5875 -----
----- Class: bicycle
                                 0.2662 -----
                           AP:
----- Class: bird
                           AP: 0.2950 -----
----- Class: boat
                           AP: 0.3699 -----
----- Class: bottle
                           AP: 0.1224 -----
----- Class: bus
                           AP: 0.2297 -----
----- Class: car
                           AP: 0.5380 -----
----- Class: cat
                           AP:
                                 0.3994 -----
----- Class: chair
                                 0.3873 -----
                            AP:
----- Class: cow
                            AP:
                                 0.1284 -----
----- Class: diningtable
                            AP:
                                 0.3183 -----
----- Class: dog
                            AP:
                                 0.3076 -----
----- Class: horse
                            AP: 0.4934 -----
----- Class: motorbike
                            AP:
                                 0.4834 -----
```

```
----- Class: person
                                 0.8081 -----
                            AP:
                           AP: 0.2287 -----
----- Class: pottedplant
----- Class: sheep
                           AP: 0.2399 -----
----- Class: sofa
                           AP: 0.2243 -----
----- Class: train
                           AP: 0.5091 -----
----- Class: tymonitor
                          AP: 0.2576 -----
mAP: 0.3597
Avg loss: 0.18227510005235673
Evaluating classifier
Mean Precision Score for Testing on Epoch 155 is 0.35971034209360764
Starting epoch number 156
Loss for Training on Epoch 156 is 0.16076767444610596
Starting epoch number 157
Loss for Training on Epoch 157 is 0.15952537953853607
Starting epoch number 158
Loss for Training on Epoch 158 is 0.15809772908687592
Starting epoch number 159
Loss for Training on Epoch 159 is 0.157727912068367
Starting epoch number 160
Loss for Training on Epoch 160 is 0.15684886276721954
                         AP: 0.5819 -----
----- Class: aeroplane
----- Class: bicycle
                           AP: 0.1373 -----
----- Class: bird
                           AP: 0.2834 -----
----- Class: boat
                           AP:
                                 0.3583 -----
----- Class: bottle
                           AP: 0.1100 -----
----- Class: bus
                           AP:
                                 0.1117 -----
----- Class: car
                           AP: 0.5082 -----
----- Class: cat
                           AP: 0.4148 -----
----- Class: chair
                           AP: 0.3818 -----
----- Class: cow
                           AP: 0.1387 -----
----- Class: diningtable
                           AP: 0.2566 -----
----- Class: dog
                           AP: 0.2700 -----
----- Class: horse
                                 0.4515 -----
                           AP:
----- Class: motorbike
                           AP: 0.3913 -----
----- Class: person
                           AP: 0.8117 -----
----- Class: pottedplant
                           AP: 0.1844 -----
----- Class: sheep
                           AP: 0.2106 -----
----- Class: sofa
                           AP: 0.2973 -----
----- Class: train
                           AP: 0.4298 -----
----- Class: tymonitor AP: 0.2192 -----
mAP: 0.3274
Avg loss: 0.20858504213392734
Evaluating classifier
```

Mean Precision Score for Testing on Epoch 160 is 0.3274262468014466 Starting epoch number 161

```
Loss for Training on Epoch 161 is 0.1583787053823471
Starting epoch number 162
Loss for Training on Epoch 162 is 0.15887244045734406
Starting epoch number 163
Loss for Training on Epoch 163 is 0.15844856202602386
Starting epoch number 164
Loss for Training on Epoch 164 is 0.15762220323085785
Starting epoch number 165
Loss for Training on Epoch 165 is 0.1588592380285263
                          AP: 0.6105 -----
----- Class: aeroplane
----- Class: bicycle
                            AP: 0.2526 -----
----- Class: bird
                            AP: 0.3815 -----
----- Class: boat
                            AP: 0.3630 -----
----- Class: bottle
                            AP: 0.1327 -----
----- Class: bus
                            AP: 0.2321 -----
----- Class: car
                            AP: 0.5458 -----
----- Class: cat
                            AP:
                                  0.4190 -----
----- Class: chair
                                  0.3954 -----
                            AP:
----- Class: cow
                            AP: 0.1169 -----
----- Class: diningtable
                            AP: 0.2838 -----
----- Class: dog
                            AP: 0.3148 -----
----- Class: horse
                            AP: 0.5192 -----
----- Class: motorbike
                            AP: 0.5093 -----
----- Class: person
                            AP:
                                  0.8256 -----
----- Class: pottedplant
                            AP: 0.2200 -----
----- Class: sheep
                             AP:
                                  0.1527 -----
----- Class: sofa
                            AP: 0.2565 -----
----- Class: train
                            AP: 0.5319 -----
----- Class: tymonitor
                            AP: 0.2879 -----
mAP: 0.3676
Avg loss: 0.17789799422025682
Evaluating classifier
Mean Precision Score for Testing on Epoch 165 is 0.3675601126211091
Starting epoch number 166
Loss for Training on Epoch 166 is 0.15323160588741302
Starting epoch number 167
Loss for Training on Epoch 167 is 0.15500488877296448
Starting epoch number 168
Loss for Training on Epoch 168 is 0.15703168511390686
Starting epoch number 169
Loss for Training on Epoch 169 is 0.1551024168729782
Starting epoch number 170
Loss for Training on Epoch 170 is 0.15459147095680237
                            AP: 0.5925 -----
----- Class: aeroplane
----- Class: bicycle
                            AP:
                                  0.2800 -----
```

```
----- Class: bird
                                 0.3377 -----
                            AP:
----- Class: boat
                                 0.3724 -----
                            AP:
----- Class: bottle
                                 0.1317 -----
                            AP:
----- Class: bus
                            AP:
                                 0.1757 -----
----- Class: car
                            AP:
                                 0.5791 -----
----- Class: cat
                            AP:
                                 0.4043 -----
----- Class: chair
                                 0.4389 -----
                            AP:
----- Class: cow
                            AP:
                                 0.1357 -----
----- Class: diningtable
                            AP:
                                 0.3309 -----
----- Class: dog
                            AP:
                                 0.2950 -----
----- Class: horse
                                 0.5353 -----
                            AP:
----- Class: motorbike
                            AP: 0.4653 -----
                            AP: 0.8180 -----
----- Class: person
----- Class: pottedplant
                           AP: 0.2435 -----
----- Class: sheep
                           AP:
                                 0.1733 -----
----- Class: sofa
                                 0.2759 -----
                           AP:
                           AP:
----- Class: train
                                 0.4582 -----
----- Class: tvmonitor
                           AP: 0.2985 -----
mAP: 0.3671
Avg loss: 0.1785883843898773
Evaluating classifier
Mean Precision Score for Testing on Epoch 170 is 0.36709858358268643
Starting epoch number 171
Loss for Training on Epoch 171 is 0.15407364070415497
Starting epoch number 172
Loss for Training on Epoch 172 is 0.15238188207149506
Starting epoch number 173
Loss for Training on Epoch 173 is 0.15218155086040497
Starting epoch number 174
Loss for Training on Epoch 174 is 0.1534423530101776
Starting epoch number 175
Loss for Training on Epoch 175 is 0.15309999883174896
----- Class: aeroplane
                           AP: 0.5728 -----
----- Class: bicycle
                           AP:
                                 0.2684 -----
----- Class: bird
                           AP: 0.3117 -----
----- Class: boat
                           AP: 0.4193 -----
----- Class: bottle
                           AP: 0.1462 -----
----- Class: bus
                           AP: 0.2678 -----
----- Class: car
                           AP:
                                 0.5728 -----
                                 0.4360 -----
----- Class: cat
                           AP:
----- Class: chair
                           AP:
                                 0.4482 -----
----- Class: cow
                            AP:
                                 0.1550 -----
----- Class: diningtable
                            AP:
                                 0.3556 -----
----- Class: dog
                            AP: 0.2818 -----
----- Class: horse
                            AP:
                                 0.5530 -----
```

```
----- Class: motorbike
                                 0.4770 -----
                            AP:
----- Class: person
                            AP: 0.8136 -----
----- Class: pottedplant AP: 0.2540 -----
----- Class: sheep
                           AP: 0.1975 -----
----- Class: sofa
                           AP: 0.2633 -----
----- Class: train
                           AP: 0.5421 -----
----- Class: tymonitor AP: 0.2730 -----
mAP: 0.3805
Avg loss: 0.17756865732371807
Evaluating classifier
Mean Precision Score for Testing on Epoch 175 is 0.3804563533470589
Starting epoch number 176
Loss for Training on Epoch 176 is 0.15598659217357635
Starting epoch number 177
Loss for Training on Epoch 177 is 0.15342698991298676
Starting epoch number 178
Loss for Training on Epoch 178 is 0.15269844233989716
Starting epoch number 179
Loss for Training on Epoch 179 is 0.1516408622264862
Starting epoch number 180
Loss for Training on Epoch 180 is 0.15200011432170868
----- Class: aeroplane
                           AP: 0.5668 -----
----- Class: bicycle
                           AP: 0.2893 -----
----- Class: bird
                           AP: 0.3104 -----
                                 0.4051 -----
----- Class: boat
                           AP:
----- Class: bottle
                           AP:
                                 0.1540 -----
----- Class: bus
                           AP: 0.2311 -----
----- Class: car
                           AP: 0.5444 -----
----- Class: cat
                           AP: 0.4263 -----
----- Class: chair
                           AP: 0.4250 -----
----- Class: cow
                           AP: 0.1354 -----
----- Class: diningtable
                           AP: 0.3342 -----
----- Class: dog
                           AP:
                                 0.3158 -----
----- Class: horse
                           AP:
                                 0.5396 -----
----- Class: motorbike
                           AP: 0.4361 -----
----- Class: person
                            AP: 0.8165 -----
----- Class: pottedplant
                           AP: 0.2224 -----
----- Class: sheep
                           AP: 0.1799 -----
----- Class: sofa
                           AP: 0.2636 -----
----- Class: train
                           AP:
                                 0.5449 -----
----- Class: tvmonitor
                           AP: 0.2930 -----
mAP: 0.3717
Avg loss: 0.18338727951049805
```

Evaluating classifier

Mean Precision Score for Testing on Epoch 180 is 0.3716797350756632

```
Starting epoch number 181
Loss for Training on Epoch 181 is 0.15268054604530334
Starting epoch number 182
Loss for Training on Epoch 182 is 0.15191595256328583
Starting epoch number 183
Loss for Training on Epoch 183 is 0.15603779256343842
Starting epoch number 184
Loss for Training on Epoch 184 is 0.14928598701953888
Starting epoch number 185
Loss for Training on Epoch 185 is 0.15176443755626678
----- Class: aeroplane
                            AP: 0.5614 -----
----- Class: bicycle
                           AP: 0.3607 -----
----- Class: bird
                            AP: 0.3400 -----
                            AP: 0.4011 -----
----- Class: boat
----- Class: bottle
                            AP: 0.1509 -----
----- Class: bus
                            AP: 0.1711 -----
----- Class: car
                            AP: 0.5895 -----
                            AP: 0.4270 -----
----- Class: cat
----- Class: chair
                           AP: 0.4346 -----
----- Class: cow
                            AP: 0.1354 -----
----- Class: diningtable AP: 0.3515 -----
----- Class: dog
                            AP: 0.3051 -----
----- Class: horse
                            AP: 0.5685 -----
----- Class: motorbike
                           AP:
                                  0.5078 -----
----- Class: person
                            AP: 0.8277 -----
----- Class: pottedplant AP:
                                  0.2504 -----
----- Class: sheep
                            AP: 0.2011 -----
----- Class: sofa
                            AP: 0.2699 -----
----- Class: train
                            AP: 0.5539 -----
----- Class: tymonitor AP: 0.2899 -----
mAP: 0.3849
Avg loss: 0.17690984718501568
Evaluating classifier
Mean Precision Score for Testing on Epoch 185 is 0.384879584963702
Starting epoch number 186
Loss for Training on Epoch 186 is 0.15180732309818268
Starting epoch number 187
Loss for Training on Epoch 187 is 0.14852376282215118
Starting epoch number 188
Loss for Training on Epoch 188 is 0.14641207456588745
Starting epoch number 189
Loss for Training on Epoch 189 is 0.14880183339118958
Starting epoch number 190
Loss for Training on Epoch 190 is 0.15026171505451202
----- Class: aeroplane AP: 0.6125 -----
```

```
----- Class: bicycle
                                 0.3260 -----
                            AP:
----- Class: bird
                            AP: 0.3382 -----
----- Class: boat
                           AP: 0.3657 -----
----- Class: bottle
                           AP:
                                 0.1315 -----
----- Class: bus
                           AP: 0.2427 -----
----- Class: car
                           AP:
                                 0.5972 -----
----- Class: cat
                           AP:
                                 0.4223 -----
----- Class: chair
                           AP:
                                 0.4332 -----
----- Class: cow
                            AP:
                                 0.1463 -----
----- Class: diningtable
                            AP: 0.3641 -----
----- Class: dog
                            AP: 0.2903 -----
----- Class: horse
                           AP: 0.5645 -----
----- Class: motorbike
                           AP: 0.5092 -----
----- Class: person
                           AP: 0.8291 -----
----- Class: pottedplant
                           AP:
                                 0.2318 -----
----- Class: sheep
                           AP: 0.2217 -----
----- Class: sofa
                           AP:
                                 0.3199 -----
----- Class: train
                           AP: 0.5170 -----
----- Class: tymonitor AP: 0.3047 -----
mAP: 0.3884
Avg loss: 0.17766526117920875
Evaluating classifier
Mean Precision Score for Testing on Epoch 190 is 0.3883987343717693
Starting epoch number 191
Loss for Training on Epoch 191 is 0.1484549343585968
Starting epoch number 192
Loss for Training on Epoch 192 is 0.15071919560432434
Starting epoch number 193
Loss for Training on Epoch 193 is 0.14894194900989532
Starting epoch number 194
Loss for Training on Epoch 194 is 0.14534126222133636
Starting epoch number 195
Loss for Training on Epoch 195 is 0.14455072581768036
----- Class: aeroplane
                           AP: 0.6034 -----
----- Class: bicycle
                                 0.2737 -----
                           AP:
----- Class: bird
                           AP: 0.3391 -----
----- Class: boat
                           AP: 0.3460 -----
----- Class: bottle
                           AP: 0.1430 -----
----- Class: bus
                           AP: 0.2079 -----
----- Class: car
                           AP:
                                 0.5896 -----
----- Class: cat
                           AP: 0.3759 -----
----- Class: chair
                           AP:
                                 0.4352 -----
----- Class: cow
                            AP:
                                 0.1232 -----
----- Class: diningtable AP: 0.3644 -----
----- Class: dog
                            AP: 0.1985 -----
```

```
----- Class: horse
                                 0.5324 -----
                            AP:
----- Class: motorbike
                            AP: 0.5361 -----
----- Class: person
                            AP: 0.8146 -----
----- Class: pottedplant
                           AP: 0.2858 -----
----- Class: sheep
                           AP: 0.1401 -----
----- Class: sofa
                           AP: 0.2652 -----
----- Class: train
                           AP: 0.5281 -----
----- Class: tvmonitor AP:
                                 0.3129 -----
mAP: 0.3708
Avg loss: 0.19278214871883392
Evaluating classifier
Mean Precision Score for Testing on Epoch 195 is 0.37075961040454175
Starting epoch number 196
Loss for Training on Epoch 196 is 0.14641107618808746
Starting epoch number 197
Loss for Training on Epoch 197 is 0.1468696892261505
Starting epoch number 198
Loss for Training on Epoch 198 is 0.14727269113063812
Starting epoch number 199
Loss for Training on Epoch 199 is 0.14972154796123505
Starting epoch number 200
Loss for Training on Epoch 200 is 0.14986518025398254
----- Class: aeroplane
                           AP: 0.6158 -----
                                 0.2542 -----
----- Class: bicycle
                           AP:
----- Class: bird
                           AP: 0.2914 -----
----- Class: boat
                           AP:
                                 0.3341 -----
----- Class: bottle
                           AP: 0.1479 -----
----- Class: bus
                           AP: 0.2037 -----
----- Class: car
                           AP: 0.5788 -----
                           AP: 0.3862 -----
----- Class: cat
----- Class: chair
                           AP:
                                 0.3917 -----
----- Class: cow
                           AP:
                                 0.1468 -----
----- Class: diningtable
                           AP:
                                 0.3689 -----
----- Class: dog
                            AP:
                                 0.2750 -----
----- Class: horse
                                 0.5540 -----
                            AP:
----- Class: motorbike
                                 0.4938 -----
                           AP:
----- Class: person
                            AP: 0.8035 -----
----- Class: pottedplant
                           AP: 0.2604 -----
----- Class: sheep
                           AP: 0.1764 -----
----- Class: sofa
                           AP:
                                 0.2444 -----
----- Class: train
                           AP:
                                 0.5453 -----
----- Class: tvmonitor
                           AP:
                                 0.2603 -----
mAP: 0.3666
```

Avg loss: 0.18358068577945233

Evaluating classifier

```
Mean Precision Score for Testing on Epoch 200 is 0.36663439457080055
Starting epoch number 201
Loss for Training on Epoch 201 is 0.14543691277503967
Starting epoch number 202
Loss for Training on Epoch 202 is 0.14362691342830658
Starting epoch number 203
Loss for Training on Epoch 203 is 0.14487028121948242
Starting epoch number 204
Loss for Training on Epoch 204 is 0.14277638494968414
Starting epoch number 205
Loss for Training on Epoch 205 is 0.15497660636901855
----- Class: aeroplane
                             AP: 0.5765 -----
----- Class: bicycle
                            AP: 0.2644 -----
                            AP: 0.2948 -----
----- Class: bird
----- Class: boat
                            AP:
                                   0.3764 -----
----- Class: bottle
                            AP:
                                   0.1415 -----
----- Class: bus
                             AP:
                                   0.1851 -----
                                  0.4727 -----
----- Class: car
                             AP:
----- Class: cat
                            AP: 0.3677 -----
----- Class: chair
                            AP: 0.4212 -----
----- Class: cow
                             AP: 0.1094 -----
----- Class: diningtable
                            AP: 0.3562 -----
----- Class: dog
                             AP: 0.2811 -----
----- Class: horse
                            AP:
                                   0.4554 -----
----- Class: motorbike
                                   0.4031 -----
                            AP:
----- Class: person
                             AP:
                                   0.8156 -----
----- Class: pottedplant
                             AP: 0.2586 -----
----- Class: sheep
                             AP: 0.1855 -----
----- Class: sofa
                            AP: 0.3255 -----
----- Class: train
                             AP: 0.4467 -----
----- Class: tymonitor
                            AP: 0.3122 -----
mAP: 0.3525
Avg loss: 0.19844211861491204
Evaluating classifier
Mean Precision Score for Testing on Epoch 205 is 0.3524730663943089
Starting epoch number 206
Loss for Training on Epoch 206 is 0.14937587082386017
Starting epoch number 207
Loss for Training on Epoch 207 is 0.1458328515291214
Starting epoch number 208
Loss for Training on Epoch 208 is 0.14729247987270355
Starting epoch number 209
Loss for Training on Epoch 209 is 0.14472384750843048
Starting epoch number 210
Loss for Training on Epoch 210 is 0.14357614517211914
```

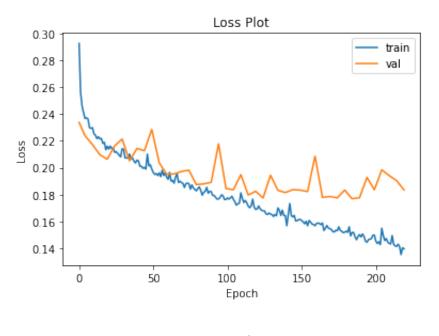
```
----- Class: aeroplane
                                 0.6205 -----
                            AP:
                            AP: 0.2795 -----
----- Class: bicycle
----- Class: bird
                            AP:
                                 0.3051 -----
----- Class: boat
                           AP:
                                 0.4012 -----
----- Class: bottle
                           AP:
                                 0.1453 -----
----- Class: bus
                           AP:
                                 0.1528 -----
----- Class: car
                                 0.5649 -----
                           AP:
----- Class: cat
                           AP:
                                 0.4520 -----
----- Class: chair
                            AP:
                                 0.4090 -----
----- Class: cow
                            AP:
                                 0.1502 -----
----- Class: diningtable
                                 0.3463 -----
                            AP:
----- Class: dog
                            AP: 0.2741 -----
----- Class: horse
                           AP:
                                 0.5405 -----
----- Class: motorbike
                           AP: 0.5037 -----
----- Class: person
                           AP:
                                 0.8253 -----
----- Class: pottedplant
                           AP: 0.2360 -----
----- Class: sheep
                            AP:
                                 0.2033 -----
----- Class: sofa
                            AP: 0.3091 -----
----- Class: train
                           AP: 0.4455 -----
----- Class: tymonitor
                           AP: 0.2896 -----
mAP: 0.3727
Avg loss: 0.1941513516008854
Evaluating classifier
Mean Precision Score for Testing on Epoch 210 is 0.37268310616018036
Starting epoch number 211
Loss for Training on Epoch 211 is 0.14327089488506317
Starting epoch number 212
Loss for Training on Epoch 212 is 0.14951078593730927
Starting epoch number 213
Loss for Training on Epoch 213 is 0.14304617047309875
Starting epoch number 214
Loss for Training on Epoch 214 is 0.14175565540790558
Starting epoch number 215
Loss for Training on Epoch 215 is 0.14143195748329163
----- Class: aeroplane
                          AP: 0.5807 -----
----- Class: bicycle
                           AP: 0.2681 -----
----- Class: bird
                           AP: 0.2805 -----
----- Class: boat
                           AP: 0.4387 -----
----- Class: bottle
                           AP: 0.1398 -----
----- Class: bus
                           AP:
                                 0.2200 -----
----- Class: car
                           AP:
                                 0.5805 -----
----- Class: cat
                           AP:
                                 0.4265 -----
----- Class: chair
                           AP:
                                 0.4195 -----
----- Class: cow
                           AP: 0.1469 -----
----- Class: diningtable
                           AP: 0.3363 -----
```

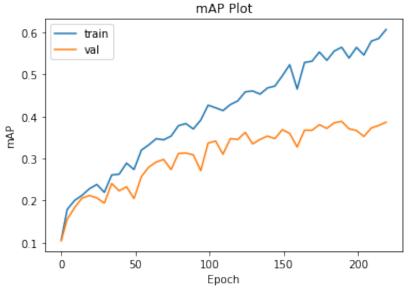
```
----- Class: dog
                                 0.3118 -----
                            AP:
----- Class: horse
                                 0.5217 -----
                            AP:
----- Class: motorbike
                                 0.5132 -----
                           AP:
----- Class: person
                           AP: 0.8226 -----
----- Class: pottedplant
                           AP: 0.2586 -----
----- Class: sheep
                           AP: 0.1862 -----
----- Class: sofa
                           AP: 0.2837 -----
----- Class: train
                           AP:
                                 0.5227 -----
----- Class: tvmonitor
                           AP: 0.3148 -----
mAP: 0.3786
Avg loss: 0.19037353247404099
Evaluating classifier
Mean Precision Score for Testing on Epoch 215 is 0.3786491200104951
Starting epoch number 216
Loss for Training on Epoch 216 is 0.1430961787700653
Starting epoch number 217
Loss for Training on Epoch 217 is 0.1412310153245926
Starting epoch number 218
Loss for Training on Epoch 218 is 0.13530686497688293
Starting epoch number 219
Loss for Training on Epoch 219 is 0.1404377967119217
Starting epoch number 220
Loss for Training on Epoch 220 is 0.13960568606853485
----- Class: aeroplane AP: 0.5790 -----
----- Class: bicycle
                           AP: 0.2837 -----
----- Class: bird
                           AP:
                                 0.2872 -----
----- Class: boat
                           AP: 0.4435 -----
----- Class: bottle
                           AP: 0.1513 -----
----- Class: bus
                           AP: 0.1898 -----
----- Class: car
                           AP: 0.5992 -----
----- Class: cat
                           AP:
                                 0.4628 -----
----- Class: chair
                                 0.4329 -----
                           AP:
----- Class: cow
                           AP:
                                 0.1480 -----
----- Class: diningtable
                           AP:
                                 0.3542 -----
----- Class: dog
                                 0.3156 -----
                            AP:
----- Class: horse
                            AP:
                                 0.5461 -----
----- Class: motorbike
                           AP: 0.5184 -----
----- Class: person
                           AP: 0.8295 -----
----- Class: pottedplant
                           AP:
                                 0.2436 -----
----- Class: sheep
                            AP:
                                 0.2154 -----
----- Class: sofa
                           AP:
                                 0.3141 -----
----- Class: train
                           AP:
                                 0.4992 -----
----- Class: tvmonitor
                           AP: 0.3141 -----
mAP: 0.3864
```

Avg loss: 0.18345072902739049

Evaluating classifier
Mean Precision Score for Testing on Epoch 220 is 0.38638158935276246

plot_losses(train_losses, val_losses, test_frequency, num_epochs)
plot_mAP(train_mAPs, val_mAPs, test_frequency, num_epochs)





mAP_test, test_loss, test_aps = test_classifier(test_loader, classifier, cr print(mAP_test)

```
----- Class: aeroplane
                           AP:
                                0.5421 -----
----- Class: bicycle
                           AP:
                                0.3113 -----
----- Class: bird
                           AP:
                                0.3541 -----
----- Class: boat
                                0.3647 -----
                           AP:
----- Class: bottle
                          AP:
                                0.1705 -----
----- Class: bus
                                0.1953 -----
                           AP:
----- Class: car
                           AP:
                                0.6274 -----
----- Class: cat
                           AP:
                                0.4384 -----
----- Class: chair
                                0.4212 -----
                           AP:
----- Class: cow
                                0.1968 -----
                           AP:
                                0.2967 -----
----- Class: diningtable
                           AP:
----- Class: dog
                           AP:
                                0.3794 -----
----- Class: horse
                           AP:
                                0.6706 -----
----- Class: motorbike
                           AP:
                                0.5364 -----
----- Class: person
                           AP:
                                0.8533 -----
----- Class: pottedplant
                                0.2518 -----
                           AP:
----- Class: sheep
                           AP:
                                0.2381 -----
----- Class: sofa
                           AP:
                                0.2573 -----
----- Class: train
                           AP:
                                0.4620 -----
----- Class: tvmonitor
                           AP:
                                0.2755 -----
mAP: 0.3922
Avg loss: 0.1803646880464676
0.39215158683089213
```

```
torch.save(classifier.state_dict(), './voc_my_best_classifier.pth')
output_submission_csv('my_solution.csv', test_aps)
```