federated-learning-rolling

December 21, 2023

0.1 Federated Learning Rolling

```
[8]: import torch
    from torchvision import datasets, transforms
    from torch.utils.data import DataLoader
    import torch.nn as nn
    import torch.optim as optim
    import time
    from torchvision.models import resnet50, ResNet50_Weights
[9]: dataset_paths = ['../Dataset/5_percent_data', '../Dataset/10_percent_data', '../
      →Dataset/15_percent_data', '../Dataset/20_percent_data', '../Dataset/
      train_transforms = transforms.Compose([
            transforms.Resize(64),
            transforms.ToTensor()
        1)
    dataset_5 = datasets.ImageFolder(root=dataset_paths[0],__
      stransform=train_transforms)
    dataset_10 = datasets.ImageFolder(root=dataset_paths[1],__
      →transform=train_transforms)
    dataset_15 = datasets.ImageFolder(root=dataset_paths[2],__
      stransform=train_transforms)
    dataset_20 = datasets.ImageFolder(root=dataset_paths[3],__
      ⇔transform=train_transforms)
    dataset_25 = datasets.ImageFolder(root=dataset_paths[4],__
      ⇔transform=train_transforms)
    num classes = 6
```

```
[10]: def train_model(global_model_name, train_dataset, output_model_name):
    # Load the model architecture
    model = resnet50(weights=None)
    model.eval()
```

```
# Replace the final fully connected layer for transfer learning with the
⇔same num_classes
  num_ftrs = model.fc.in_features
  num classes = 6
  model.fc = nn.Linear(num_ftrs, num_classes)
  # Load the trained weights from the saved .pth file
  model.load_state_dict(torch.load(global_model_name))
  model.eval()
  # Define the loss function and optimizer
  criterion = nn.CrossEntropyLoss()
  optimizer = optim.SGD(model.fc.parameters(), lr=0.001, momentum=0.9)
  # Move the model to GPU if available
  device = torch.device("cuda:0" if torch.cuda.is_available() else "cpu")
  model = model.to(device)
  train_dataloader = torch.utils.data.DataLoader(train_dataset,__
⇔batch_size=32, shuffle=True)
  # Train the model
  start_time = time.time() # Record the end time of the epoch
  num_epochs = 20 # You can change this
  for epoch in range(num_epochs):
      model.train()
      running_loss = 0.0
      for inputs, labels in train_dataloader:
          inputs = inputs.to(device)
          labels = labels.to(device)
          optimizer.zero_grad()
          outputs = model(inputs)
          loss = criterion(outputs, labels)
          loss.backward()
          optimizer.step()
          running_loss += loss.item() * inputs.size(0)
      epoch_loss = running_loss / len(train_dataset)
      print(f'Epoch {epoch+1}/{num_epochs} | Loss: {epoch_loss:.4f}')
      if epoch_loss <= 0.01:</pre>
          print(" Early Stopping ")
          break
  end_time = time.time() # Record the end time of the epoch
```

```
print(" Training Time ", end_time - start_time)

# Save the trained model
torch.save(model.state_dict(), output_model_name)
return model
```

```
[11]: def test_model(data_dir, model_name):
          import torch
          from torchvision import datasets, transforms
          from torch.utils.data import DataLoader
          import torch.nn as nn
          # Define paths to your test dataset folder
          test_data_dir = data_dir # Update with your test dataset path
          # Define transformations for testing (similar to training)
          test transforms = transforms.Compose([
              transforms.Resize(64),
              transforms.ToTensor()
          1)
          # Load the test dataset using ImageFolder with the defined transformations
          test_dataset = datasets.ImageFolder(root=test_data_dir,__
       ⇔transform=test_transforms)
          # Define the test dataloader
          test_dataloader = DataLoader(test_dataset, batch_size=32, shuffle=False,_
       →num workers=4)
          # Load the model architecture
          model = resnet50(weights=None)
          model.eval()
          # Replace the final fully connected layer for transfer learning with the
       \hookrightarrow same num_classes
          num_ftrs = model.fc.in_features
          num_classes = 6
          model.fc = nn.Linear(num_ftrs, num_classes)
          # Load the trained weights from the saved .pth file
          model.load_state_dict(torch.load(model_name))
          model.eval()
          # Move the model to GPU if available
          device = torch.device("cuda:0" if torch.cuda.is_available() else "cpu")
          model = model.to(device)
```

```
# Evaluate the model on the test dataset for both top-1 and top-3 accuracy
          correct_top1 = 0
          correct_top3 = 0
          total = 0
          with torch.no_grad():
              for images, labels in test_dataloader:
                  images = images.to(device)
                  labels = labels.to(device)
                  outputs = model(images)
                  _, preds = torch.topk(outputs, 3, dim=1) # Get top-3 predictions
                  total += labels.size(0)
                  for i in range(labels.size(0)):
                      if labels[i] == preds[i, 0]: # Check top-1 accuracy
                          correct_top1 += 1
                      if labels[i] in preds[i]: # Check top-3 accuracy
                          correct_top3 += 1
          top1_accuracy = 100 * correct_top1 / total
          top3_accuracy = 100 * correct_top3 / total
          print(f'Top-1 Accuracy on the {data_dir} dataset: {top1_accuracy:.2f}%')
          print(f'Top-3 Accuracy on the {data_dir} dataset: {top3_accuracy:.2f}%')
[12]: def update_global_model(model_5, model_10, model_15, model_20, model_25,__
       ⇔global_model, iteration):
          state_dict_5 = model_5.state_dict()
          state dict 10 = model 10.state dict()
          state_dict_15 = model_15.state_dict()
          state_dict_20 = model_20.state_dict()
          state_dict_25 = model_25.state_dict()
          for key in global_model.state_dict():
              w1 = state_dict_5[key]
              w2 = state_dict_10[key]
              w3 = state_dict_15[key]
              w4 = state_dict_20[key]
              w5 = state_dict_25[key]
              updated_weight = (w1 * 1 + w2 * 2 + w3 * 3 + w4 * 4 + w5 * 5) / 15
              global_model.state_dict()[key].copy_(updated_weight)
          global_model_name = 'updated_global_model_' + str(iteration) +'.pth'
          torch.save(global_model.state_dict(), global_model_name)
```

return global_model_name

```
[13]: # Load model
      model = resnet50(weights=ResNet50_Weights.DEFAULT)
      model.eval()
      # Replace the final fully connected layer for transfer learning with the same_
      ⇔num_classes
      num_ftrs = model.fc.in_features
      num classes = 6
      model.fc = nn.Linear(num_ftrs, num_classes)
      global_model_name = "trained_global_model.pth"
      torch.save(model.state_dict(), global_model_name)
      test_model('../Dataset/validation_data', global_model_name)
      global_model_name = "trained_global_model.pth"
      i = 0
      interval = 10
      for i in range(interval):
          print("Iteration: ", i+1)
          print(" Global model ", global_model_name)
          total_5 = len(dataset_5)
          start_index_5 = (i*total_5)//interval
          end_index_5 = min(total_5, ((i+1)*total_5)//interval)
          portion_dataset_5 = torch.utils.data.Subset(dataset_5,__
       →list(range(start_index_5, end_index_5)))
          model_name_5 = "trained_model_5_" + str(i+1) + ".pth"
          print(" Model : ", model_name_5)
          model_5 = train_model(global_model_name, portion_dataset_5, model_name_5)
          test_model('../Dataset/validation_data', model_name_5)
          total 10 = len(dataset 10)
          start_index_10 = (i*total_10)//interval
          end_index_10 = min(total_10, ((i+1)*total_10)//interval)
          portion_dataset_10 = torch.utils.data.Subset(dataset_10,__
       ⇔list(range(start_index_10, end_index_10)))
          model_name_10 = "trained_model_10_" + str(i+1) + ".pth"
          print(" Model : ", model_name_10)
          model_10 = train_model(global_model_name, portion_dataset_10, model_name_10)
          test_model('../Dataset/validation_data', model_name_10)
          total 15 = len(dataset 15)
          start index 15 = (i*total 15)//interval
          end_index_15 = min(total_15, ((i+1)*total_15)//interval)
          portion_dataset_15 = torch.utils.data.Subset(dataset_15,__
       ⇔list(range(start_index_15, end_index_15)))
          model_name_15 = "trained_model_15_" + str(i+1) + ".pth"
          print(" Model : ", model_name_15)
          model_15 = train_model(global_model_name, portion_dataset_15, model_name_15)
```

```
test_model('../Dataset/validation_data', model_name_15)
    total 20 = len(dataset 20)
    start_index_20 = (i*total_20)//interval
    end_index_20 = min(total_20, ((i+1)*total_20)//interval)
    portion_dataset_20 = torch.utils.data.Subset(dataset_20,__
 ⇔list(range(start_index_20, end_index_20)))
    model_name_20 = "trained_model_20_" + str(i+1) + ".pth"
    print(" Model : ", model_name_20)
    model_20 = train_model(global_model_name, portion_dataset_20, model_name_20)
    test_model('../Dataset/validation_data', model_name_20)
    total_25 = len(dataset_25)
    start_index_25 = (i*total_25)//interval
    end_index_25 = min(total_25, ((i+1)*total_25)//interval)
    portion_dataset_25 = torch.utils.data.Subset(dataset_25,__
 ⇔list(range(start_index_25, end_index_25)))
    model_name_25 = "trained_model_25_" + str(i+1) + ".pth"
    print(" Model : ", model_name_25)
    model_25 = train_model(global_model_name, portion_dataset_25, model_name_25)
    test_model('../Dataset/validation_data', model_name_25)
    ## Update global model
    # Load the model architecture
    global_model = resnet50(weights=None)
    global model.eval()
    # Replace the final fully connected layer for transfer learning with the \Box
 ⇔same num_classes
    num_ftrs = global_model.fc.in_features
    global_model.fc = nn.Linear(num_ftrs, num_classes)
    # Load the trained weights from the saved .pth file
    global_model.load_state_dict(torch.load(global_model_name))
    global_model.eval()
    global_model_name = update_global_model(model_5, model_10, model_15, __
 →model_20, model_25, global_model, i+1)
    print(" Updated global Model : ", global_model_name)
    test_model('../Dataset/validation_data', global_model_name)
Top-1 Accuracy on the ../Dataset/validation_data dataset: 13.94%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 53.68%
Iteration: 1
```

Global model trained_global_model.pth

```
Model : trained_model_5_1.pth
Epoch 1/20 | Loss: 1.4510
Epoch 2/20 | Loss: 0.5829
Epoch 3/20 | Loss: 0.2752
Epoch 4/20 | Loss: 0.1824
Epoch 5/20 | Loss: 0.0978
Epoch 6/20 | Loss: 0.0880
Epoch 7/20 | Loss: 0.0815
Epoch 8/20 | Loss: 0.0681
Epoch 9/20 | Loss: 0.0794
Epoch 10/20 | Loss: 0.0772
Epoch 11/20 | Loss: 0.0707
Epoch 12/20 | Loss: 0.0758
Epoch 13/20 | Loss: 0.0619
Epoch 14/20 | Loss: 0.0671
Epoch 15/20 | Loss: 0.0525
Epoch 16/20 | Loss: 0.0533
Epoch 17/20 | Loss: 0.0423
Epoch 18/20 | Loss: 0.0492
Epoch 19/20 | Loss: 0.0383
Epoch 20/20 | Loss: 0.0350
Training Time 7.331625938415527
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 70.12%
Model : trained_model_10_1.pth
Epoch 1/20 | Loss: 1.2011
Epoch 2/20 | Loss: 0.3110
Epoch 3/20 | Loss: 0.1514
Epoch 4/20 | Loss: 0.1088
Epoch 5/20 | Loss: 0.0868
Epoch 6/20 | Loss: 0.0737
Epoch 7/20 | Loss: 0.0730
Epoch 8/20 | Loss: 0.0563
Epoch 9/20 | Loss: 0.0689
Epoch 10/20 | Loss: 0.0433
Epoch 11/20 | Loss: 0.0484
Epoch 12/20 | Loss: 0.0365
Epoch 13/20 | Loss: 0.0284
Epoch 14/20 | Loss: 0.0371
Epoch 15/20 | Loss: 0.0418
Epoch 16/20 | Loss: 0.0302
Epoch 17/20 | Loss: 0.0339
Epoch 18/20 | Loss: 0.0379
Epoch 19/20 | Loss: 0.0278
Epoch 20/20 | Loss: 0.0253
Training Time 11.69282579421997
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 70.64%
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```
Model: trained_model_15_1.pth
Epoch 1/20 | Loss: 0.9297
Epoch 2/20 | Loss: 0.1748
Epoch 3/20 | Loss: 0.0990
Epoch 4/20 | Loss: 0.0758
Epoch 5/20 | Loss: 0.0552
Epoch 6/20 | Loss: 0.0590
Epoch 7/20 | Loss: 0.0499
Epoch 8/20 | Loss: 0.0403
Epoch 9/20 | Loss: 0.0381
Epoch 10/20 | Loss: 0.0413
Epoch 11/20 | Loss: 0.0329
Epoch 12/20 | Loss: 0.0254
Epoch 13/20 | Loss: 0.0299
Epoch 14/20 | Loss: 0.0226
Epoch 15/20 | Loss: 0.0229
Epoch 16/20 | Loss: 0.0280
Epoch 17/20 | Loss: 0.0241
Epoch 18/20 | Loss: 0.0249
Epoch 19/20 | Loss: 0.0193
Epoch 20/20 | Loss: 0.0207
Training Time 17.494003534317017
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 71.87%
Model : trained_model_20_1.pth
Epoch 1/20 | Loss: 0.8324
Epoch 2/20 | Loss: 0.1632
Epoch 3/20 | Loss: 0.1046
Epoch 4/20 | Loss: 0.0822
Epoch 5/20 | Loss: 0.0802
Epoch 6/20 | Loss: 0.0491
Epoch 7/20 | Loss: 0.0483
Epoch 8/20 | Loss: 0.0468
Epoch 9/20 | Loss: 0.0402
Epoch 10/20 | Loss: 0.0390
Epoch 11/20 | Loss: 0.0291
Epoch 12/20 | Loss: 0.0270
Epoch 13/20 | Loss: 0.0250
Epoch 14/20 | Loss: 0.0243
Epoch 15/20 | Loss: 0.0268
Epoch 16/20 | Loss: 0.0237
Epoch 17/20 | Loss: 0.0262
Epoch 18/20 | Loss: 0.0204
Epoch 19/20 | Loss: 0.0170
Epoch 20/20 | Loss: 0.0227
Training Time 21.685173749923706
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 72.45%
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Model: trained_model_25_1.pth
Epoch 1/20 | Loss: 0.6500
Epoch 2/20 | Loss: 0.1037
Epoch 3/20 | Loss: 0.0642
Epoch 4/20 | Loss: 0.0531
Epoch 5/20 | Loss: 0.0447
Epoch 6/20 | Loss: 0.0334
Epoch 7/20 | Loss: 0.0320
Epoch 8/20 | Loss: 0.0289
Epoch 9/20 | Loss: 0.0234
Epoch 10/20 | Loss: 0.0223
Epoch 11/20 | Loss: 0.0199
Epoch 12/20 | Loss: 0.0207
Epoch 13/20 | Loss: 0.0206
Epoch 14/20 | Loss: 0.0200
Epoch 15/20 | Loss: 0.0163
Epoch 16/20 | Loss: 0.0132
Epoch 17/20 | Loss: 0.0170
Epoch 18/20 | Loss: 0.0148
Epoch 19/20 | Loss: 0.0144
Epoch 20/20 | Loss: 0.0119
Training Time 28.948309898376465
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 71.26%
Updated global Model : updated_global_model_1.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 71.53%
Iteration: 2
Global model updated_global_model_1.pth
Model : trained_model_5_2.pth
Epoch 1/20 | Loss: 2.0103
Epoch 2/20 | Loss: 1.5211
Epoch 3/20 | Loss: 0.9293
Epoch 4/20 | Loss: 0.4724
Epoch 5/20 | Loss: 0.2531
Epoch 6/20 | Loss: 0.1924
Epoch 7/20 | Loss: 0.1602
Epoch 8/20 | Loss: 0.1569
Epoch 9/20 | Loss: 0.1451
Epoch 10/20 | Loss: 0.1257
Epoch 11/20 | Loss: 0.1362
Epoch 12/20 | Loss: 0.1280
Epoch 13/20 | Loss: 0.1141
Epoch 14/20 | Loss: 0.0952
Epoch 15/20 | Loss: 0.0861
Epoch 16/20 | Loss: 0.0942
Epoch 17/20 | Loss: 0.0863
Epoch 18/20 | Loss: 0.0861
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Epoch 19/20 | Loss: 0.0926
Epoch 20/20 | Loss: 0.1148
Training Time 7.321229457855225
Top-1 Accuracy on the ../Dataset/validation_data dataset: 31.52%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.56%
Model : trained_model_10_2.pth
Epoch 1/20 | Loss: 1.9707
Epoch 2/20 | Loss: 1.0819
Epoch 3/20 | Loss: 0.3236
Epoch 4/20 | Loss: 0.1892
Epoch 5/20 | Loss: 0.1553
Epoch 6/20 | Loss: 0.1493
Epoch 7/20 | Loss: 0.1434
Epoch 8/20 | Loss: 0.1282
Epoch 9/20 | Loss: 0.1325
Epoch 10/20 | Loss: 0.1243
Epoch 11/20 | Loss: 0.1080
Epoch 12/20 | Loss: 0.1040
Epoch 13/20 | Loss: 0.0953
Epoch 14/20 | Loss: 0.0956
Epoch 15/20 | Loss: 0.1091
Epoch 16/20 | Loss: 0.0817
Epoch 17/20 | Loss: 0.0782
Epoch 18/20 | Loss: 0.0841
Epoch 19/20 | Loss: 0.0789
Epoch 20/20 | Loss: 0.0652
Training Time 11.691212892532349
Top-1 Accuracy on the .../Dataset/validation_data dataset: 31.84%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.48%
Model : trained_model_15_2.pth
Epoch 1/20 | Loss: 1.6676
Epoch 2/20 | Loss: 0.5483
Epoch 3/20 | Loss: 0.1806
Epoch 4/20 | Loss: 0.1495
Epoch 5/20 | Loss: 0.1581
Epoch 6/20 | Loss: 0.1403
Epoch 7/20 | Loss: 0.1216
Epoch 8/20 | Loss: 0.1033
Epoch 9/20 | Loss: 0.1053
Epoch 10/20 | Loss: 0.0977
Epoch 11/20 | Loss: 0.0910
Epoch 12/20 | Loss: 0.0950
Epoch 13/20 | Loss: 0.0848
Epoch 14/20 | Loss: 0.0679
Epoch 15/20 | Loss: 0.0715
Epoch 16/20 | Loss: 0.0747
Epoch 17/20 | Loss: 0.0643
Epoch 18/20 | Loss: 0.0593
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Epoch 19/20 | Loss: 0.0612
Epoch 20/20 | Loss: 0.0569
Training Time 17.440737009048462
Top-1 Accuracy on the ../Dataset/validation_data dataset: 31.92%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.69%
Model : trained_model_20_2.pth
Epoch 1/20 | Loss: 1.6001
Epoch 2/20 | Loss: 0.3240
Epoch 3/20 | Loss: 0.1742
Epoch 4/20 | Loss: 0.1517
Epoch 5/20 | Loss: 0.1356
Epoch 6/20 | Loss: 0.1136
Epoch 7/20 | Loss: 0.1123
Epoch 8/20 | Loss: 0.0927
Epoch 9/20 | Loss: 0.0975
Epoch 10/20 | Loss: 0.0798
Epoch 11/20 | Loss: 0.0792
Epoch 12/20 | Loss: 0.0877
Epoch 13/20 | Loss: 0.0828
Epoch 14/20 | Loss: 0.0677
Epoch 15/20 | Loss: 0.0616
Epoch 16/20 | Loss: 0.0631
Epoch 17/20 | Loss: 0.0607
Epoch 18/20 | Loss: 0.0574
Epoch 19/20 | Loss: 0.0523
Epoch 20/20 | Loss: 0.0615
Training Time 21.546999216079712
Top-1 Accuracy on the ../Dataset/validation_data dataset: 31.94%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 52.08%
Model : trained_model_25_2.pth
Epoch 1/20 | Loss: 1.3263
Epoch 2/20 | Loss: 0.2130
Epoch 3/20 | Loss: 0.1488
Epoch 4/20 | Loss: 0.1401
Epoch 5/20 | Loss: 0.1068
Epoch 6/20 | Loss: 0.0901
Epoch 7/20 | Loss: 0.0984
Epoch 8/20 | Loss: 0.0857
Epoch 9/20 | Loss: 0.0945
Epoch 10/20 | Loss: 0.0769
Epoch 11/20 | Loss: 0.0622
Epoch 12/20 | Loss: 0.0688
Epoch 13/20 | Loss: 0.0639
Epoch 14/20 | Loss: 0.0636
Epoch 15/20 | Loss: 0.0571
Epoch 16/20 | Loss: 0.0531
Epoch 17/20 | Loss: 0.0537
Epoch 18/20 | Loss: 0.0474
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Epoch 19/20 | Loss: 0.0474
Epoch 20/20 | Loss: 0.0577
Training Time 29.05228042602539
Top-1 Accuracy on the ../Dataset/validation_data dataset: 31.89%
Top-3 Accuracy on the ../Dataset/validation data dataset: 50.76%
Updated global Model : updated_global_model_2.pth
Top-1 Accuracy on the ../Dataset/validation data dataset: 31.94%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.22%
Iteration: 3
Global model updated_global_model_2.pth
Model : trained_model_5_3.pth
Epoch 1/20 | Loss: 2.2370
Epoch 2/20 | Loss: 0.6803
Epoch 3/20 | Loss: 0.1854
Epoch 4/20 | Loss: 0.0906
Epoch 5/20 | Loss: 0.0707
Epoch 6/20 | Loss: 0.0642
Epoch 7/20 | Loss: 0.0543
Epoch 8/20 | Loss: 0.0613
Epoch 9/20 | Loss: 0.0435
Epoch 10/20 | Loss: 0.0409
Epoch 11/20 | Loss: 0.0381
Epoch 12/20 | Loss: 0.0411
Epoch 13/20 | Loss: 0.0372
Epoch 14/20 | Loss: 0.0304
Epoch 15/20 | Loss: 0.0361
Epoch 16/20 | Loss: 0.0276
Epoch 17/20 | Loss: 0.0300
Epoch 18/20 | Loss: 0.0277
Epoch 19/20 | Loss: 0.0217
Epoch 20/20 | Loss: 0.0266
Training Time 7.1968724727630615
Top-1 Accuracy on the ../Dataset/validation_data dataset: 15.17%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 58.02%
Model: trained model 10 3.pth
Epoch 1/20 | Loss: 1.6868
Epoch 2/20 | Loss: 0.2071
Epoch 3/20 | Loss: 0.0809
Epoch 4/20 | Loss: 0.0595
Epoch 5/20 | Loss: 0.0493
Epoch 6/20 | Loss: 0.0496
Epoch 7/20 | Loss: 0.0431
Epoch 8/20 | Loss: 0.0393
Epoch 9/20 | Loss: 0.0366
Epoch 10/20 | Loss: 0.0396
Epoch 11/20 | Loss: 0.0325
Epoch 12/20 | Loss: 0.0271
Epoch 13/20 | Loss: 0.0278
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Epoch 14/20 | Loss: 0.0281
Epoch 15/20 | Loss: 0.0240
Epoch 16/20 | Loss: 0.0222
Epoch 17/20 | Loss: 0.0260
Epoch 18/20 | Loss: 0.0235
Epoch 19/20 | Loss: 0.0208
Epoch 20/20 | Loss: 0.0208
Training Time 11.621193647384644
Top-1 Accuracy on the .../Dataset/validation_data dataset: 15.18%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 58.37%
Model : trained_model_15_3.pth
Epoch 1/20 | Loss: 1.2243
Epoch 2/20 | Loss: 0.1095
Epoch 3/20 | Loss: 0.0643
Epoch 4/20 | Loss: 0.0459
Epoch 5/20 | Loss: 0.0445
Epoch 6/20 | Loss: 0.0397
Epoch 7/20 | Loss: 0.0343
Epoch 8/20 | Loss: 0.0298
Epoch 9/20 | Loss: 0.0274
Epoch 10/20 | Loss: 0.0274
Epoch 11/20 | Loss: 0.0267
Epoch 12/20 | Loss: 0.0250
Epoch 13/20 | Loss: 0.0255
Epoch 14/20 | Loss: 0.0227
Epoch 15/20 | Loss: 0.0215
Epoch 16/20 | Loss: 0.0192
Epoch 17/20 | Loss: 0.0206
Epoch 18/20 | Loss: 0.0157
Epoch 19/20 | Loss: 0.0160
Epoch 20/20 | Loss: 0.0175
Training Time 17.602529764175415
Top-1 Accuracy on the ../Dataset/validation_data dataset: 15.18%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 57.86%
Model: trained model 20 3.pth
Epoch 1/20 | Loss: 1.0410
Epoch 2/20 | Loss: 0.0812
Epoch 3/20 | Loss: 0.0534
Epoch 4/20 | Loss: 0.0479
Epoch 5/20 | Loss: 0.0365
Epoch 6/20 | Loss: 0.0331
Epoch 7/20 | Loss: 0.0304
Epoch 8/20 | Loss: 0.0313
Epoch 9/20 | Loss: 0.0233
Epoch 10/20 | Loss: 0.0245
Epoch 11/20 | Loss: 0.0192
Epoch 12/20 | Loss: 0.0214
Epoch 13/20 | Loss: 0.0194
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Epoch 14/20 | Loss: 0.0176
Epoch 15/20 | Loss: 0.0186
Epoch 16/20 | Loss: 0.0157
Epoch 17/20 | Loss: 0.0179
Epoch 18/20 | Loss: 0.0170
Epoch 19/20 | Loss: 0.0142
Epoch 20/20 | Loss: 0.0131
Training Time 21.26693868637085
Top-1 Accuracy on the .../Dataset/validation_data dataset: 15.18%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 58.22%
Model : trained_model_25_3.pth
Epoch 1/20 | Loss: 0.7746
Epoch 2/20 | Loss: 0.0564
Epoch 3/20 | Loss: 0.0434
Epoch 4/20 | Loss: 0.0370
Epoch 5/20 | Loss: 0.0308
Epoch 6/20 | Loss: 0.0289
Epoch 7/20 | Loss: 0.0252
Epoch 8/20 | Loss: 0.0227
Epoch 9/20 | Loss: 0.0190
Epoch 10/20 | Loss: 0.0200
Epoch 11/20 | Loss: 0.0170
Epoch 12/20 | Loss: 0.0160
Epoch 13/20 | Loss: 0.0147
Epoch 14/20 | Loss: 0.0143
Epoch 15/20 | Loss: 0.0127
Epoch 16/20 | Loss: 0.0136
Epoch 17/20 | Loss: 0.0135
Epoch 18/20 | Loss: 0.0108
Epoch 19/20 | Loss: 0.0130
Epoch 20/20 | Loss: 0.0106
Training Time 29.262059926986694
Top-1 Accuracy on the ../Dataset/validation_data dataset: 15.18%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 58.72%
Updated global Model: updated global model 3.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 15.18%
Top-3 Accuracy on the ../Dataset/validation data dataset: 58.78%
Iteration: 4
Global model updated_global_model_3.pth
Model : trained_model_5_4.pth
Epoch 1/20 | Loss: 7.2719
Epoch 2/20 | Loss: 4.4160
Epoch 3/20 | Loss: 1.4038
Epoch 4/20 | Loss: 0.3198
Epoch 5/20 | Loss: 0.2039
Epoch 6/20 | Loss: 0.1952
Epoch 7/20 | Loss: 0.2296
Epoch 8/20 | Loss: 0.1599
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Epoch 9/20 | Loss: 0.1575
Epoch 10/20 | Loss: 0.1687
Epoch 11/20 | Loss: 0.1531
Epoch 12/20 | Loss: 0.1102
Epoch 13/20 | Loss: 0.1040
Epoch 14/20 | Loss: 0.1121
Epoch 15/20 | Loss: 0.1296
Epoch 16/20 | Loss: 0.1256
Epoch 17/20 | Loss: 0.1048
Epoch 18/20 | Loss: 0.1055
Epoch 19/20 | Loss: 0.0878
Epoch 20/20 | Loss: 0.0838
Training Time 7.380084991455078
Top-1 Accuracy on the .../Dataset/validation_data_dataset: 31.52%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 49.64%
Model : trained_model_10_4.pth
Epoch 1/20 | Loss: 6.1166
Epoch 2/20 | Loss: 2.1329
Epoch 3/20 | Loss: 0.2575
Epoch 4/20 | Loss: 0.2296
Epoch 5/20 | Loss: 0.1789
Epoch 6/20 | Loss: 0.1534
Epoch 7/20 | Loss: 0.1351
Epoch 8/20 | Loss: 0.1327
Epoch 9/20 | Loss: 0.1204
Epoch 10/20 | Loss: 0.1288
Epoch 11/20 | Loss: 0.1122
Epoch 12/20 | Loss: 0.0997
Epoch 13/20 | Loss: 0.1181
Epoch 14/20 | Loss: 0.0981
Epoch 15/20 | Loss: 0.0722
Epoch 16/20 | Loss: 0.0987
Epoch 17/20 | Loss: 0.1028
Epoch 18/20 | Loss: 0.0846
Epoch 19/20 | Loss: 0.0705
Epoch 20/20 | Loss: 0.0747
Training Time 11.844669342041016
Top-1 Accuracy on the ../Dataset/validation_data dataset: 31.97%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.07%
Model : trained_model_15_4.pth
Epoch 1/20 | Loss: 5.1561
Epoch 2/20 | Loss: 0.6059
Epoch 3/20 | Loss: 0.2277
Epoch 4/20 | Loss: 0.1692
Epoch 5/20 | Loss: 0.1490
Epoch 6/20 | Loss: 0.1335
Epoch 7/20 | Loss: 0.1270
Epoch 8/20 | Loss: 0.1159
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Epoch 9/20 | Loss: 0.1200
Epoch 10/20 | Loss: 0.0987
Epoch 11/20 | Loss: 0.1000
Epoch 12/20 | Loss: 0.0967
Epoch 13/20 | Loss: 0.0823
Epoch 14/20 | Loss: 0.0752
Epoch 15/20 | Loss: 0.0741
Epoch 16/20 | Loss: 0.0729
Epoch 17/20 | Loss: 0.0577
Epoch 18/20 | Loss: 0.0626
Epoch 19/20 | Loss: 0.0702
Epoch 20/20 | Loss: 0.0624
Training Time 17.675637006759644
Top-1 Accuracy on the ../Dataset/validation_data_dataset: 31.98%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.53%
Model : trained_model_20_4.pth
Epoch 1/20 | Loss: 4.5208
Epoch 2/20 | Loss: 0.2769
Epoch 3/20 | Loss: 0.1845
Epoch 4/20 | Loss: 0.1448
Epoch 5/20 | Loss: 0.1260
Epoch 6/20 | Loss: 0.1216
Epoch 7/20 | Loss: 0.1000
Epoch 8/20 | Loss: 0.1084
Epoch 9/20 | Loss: 0.0840
Epoch 10/20 | Loss: 0.0904
Epoch 11/20 | Loss: 0.0780
Epoch 12/20 | Loss: 0.0846
Epoch 13/20 | Loss: 0.0730
Epoch 14/20 | Loss: 0.0642
Epoch 15/20 | Loss: 0.0585
Epoch 16/20 | Loss: 0.0550
Epoch 17/20 | Loss: 0.0568
Epoch 18/20 | Loss: 0.0566
Epoch 19/20 | Loss: 0.0551
Epoch 20/20 | Loss: 0.0721
Training Time 21.835453271865845
Top-1 Accuracy on the ../Dataset/validation_data dataset: 32.01%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.43%
Model : trained_model_25_4.pth
Epoch 1/20 | Loss: 3.4998
Epoch 2/20 | Loss: 0.2096
Epoch 3/20 | Loss: 0.1618
Epoch 4/20 | Loss: 0.1249
Epoch 5/20 | Loss: 0.1010
Epoch 6/20 | Loss: 0.0968
Epoch 7/20 | Loss: 0.0873
Epoch 8/20 | Loss: 0.0801
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Epoch 9/20 | Loss: 0.0697
Epoch 10/20 | Loss: 0.0792
Epoch 11/20 | Loss: 0.0628
Epoch 12/20 | Loss: 0.0633
Epoch 13/20 | Loss: 0.0627
Epoch 14/20 | Loss: 0.0615
Epoch 15/20 | Loss: 0.0469
Epoch 16/20 | Loss: 0.0540
Epoch 17/20 | Loss: 0.0478
Epoch 18/20 | Loss: 0.0515
Epoch 19/20 | Loss: 0.0474
Epoch 20/20 | Loss: 0.0405
Training Time 29.285688161849976
Top-1 Accuracy on the ../Dataset/validation_data dataset: 32.02%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.07%
Updated global Model : updated_global_model_4.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 31.98%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.54%
Iteration: 5
 Global model updated_global_model_4.pth
Model : trained_model_5_5.pth
Epoch 1/20 | Loss: 0.4975
Epoch 2/20 | Loss: 0.4755
Epoch 3/20 | Loss: 0.4297
Epoch 4/20 | Loss: 0.3626
Epoch 5/20 | Loss: 0.3181
Epoch 6/20 | Loss: 0.2478
Epoch 7/20 | Loss: 0.2213
Epoch 8/20 | Loss: 0.2032
Epoch 9/20 | Loss: 0.1676
Epoch 10/20 | Loss: 0.1604
Epoch 11/20 | Loss: 0.0998
Epoch 12/20 | Loss: 0.1130
Epoch 13/20 | Loss: 0.1022
Epoch 14/20 | Loss: 0.0798
Epoch 15/20 | Loss: 0.0861
Epoch 16/20 | Loss: 0.0677
Epoch 17/20 | Loss: 0.0634
Epoch 18/20 | Loss: 0.0661
Epoch 19/20 | Loss: 0.0630
Epoch 20/20 | Loss: 0.0706
Training Time 7.38347053527832
Top-1 Accuracy on the ../Dataset/validation_data dataset: 43.58%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 53.18%
Model : trained_model_10_5.pth
Epoch 1/20 | Loss: 0.5417
Epoch 2/20 | Loss: 0.4395
Epoch 3/20 | Loss: 0.3292
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Epoch 4/20 | Loss: 0.2694
Epoch 5/20 | Loss: 0.2100
Epoch 6/20 | Loss: 0.1588
Epoch 7/20 | Loss: 0.1367
Epoch 8/20 | Loss: 0.1334
Epoch 9/20 | Loss: 0.0956
Epoch 10/20 | Loss: 0.1137
Epoch 11/20 | Loss: 0.0927
Epoch 12/20 | Loss: 0.0709
Epoch 13/20 | Loss: 0.0579
Epoch 14/20 | Loss: 0.0537
Epoch 15/20 | Loss: 0.0611
Epoch 16/20 | Loss: 0.0693
Epoch 17/20 | Loss: 0.0442
Epoch 18/20 | Loss: 0.0477
Epoch 19/20 | Loss: 0.0410
Epoch 20/20 | Loss: 0.0467
Training Time 11.749433040618896
Top-1 Accuracy on the ../Dataset/validation_data dataset: 43.34%
Top-3 Accuracy on the ../Dataset/validation data dataset: 53.95%
Model : trained_model_15_5.pth
Epoch 1/20 | Loss: 0.4893
Epoch 2/20 | Loss: 0.3634
Epoch 3/20 | Loss: 0.2502
Epoch 4/20 | Loss: 0.1732
Epoch 5/20 | Loss: 0.1277
Epoch 6/20 | Loss: 0.1106
Epoch 7/20 | Loss: 0.0862
Epoch 8/20 | Loss: 0.0824
Epoch 9/20 | Loss: 0.0745
Epoch 10/20 | Loss: 0.0742
Epoch 11/20 | Loss: 0.0616
Epoch 12/20 | Loss: 0.0529
Epoch 13/20 | Loss: 0.0509
Epoch 14/20 | Loss: 0.0566
Epoch 15/20 | Loss: 0.0474
Epoch 16/20 | Loss: 0.0452
Epoch 17/20 | Loss: 0.0362
Epoch 18/20 | Loss: 0.0409
Epoch 19/20 | Loss: 0.0350
Epoch 20/20 | Loss: 0.0290
Training Time 17.540384769439697
Top-1 Accuracy on the ../Dataset/validation_data dataset: 42.87%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 53.45%
Model : trained_model_20_5.pth
Epoch 1/20 | Loss: 0.4739
Epoch 2/20 | Loss: 0.3206
Epoch 3/20 | Loss: 0.1896
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Epoch 4/20 | Loss: 0.1361
Epoch 5/20 | Loss: 0.0984
Epoch 6/20 | Loss: 0.0750
Epoch 7/20 | Loss: 0.0608
Epoch 8/20 | Loss: 0.0472
Epoch 9/20 | Loss: 0.0623
Epoch 10/20 | Loss: 0.0523
Epoch 11/20 | Loss: 0.0465
Epoch 12/20 | Loss: 0.0399
Epoch 13/20 | Loss: 0.0422
Epoch 14/20 | Loss: 0.0383
Epoch 15/20 | Loss: 0.0345
Epoch 16/20 | Loss: 0.0313
Epoch 17/20 | Loss: 0.0388
Epoch 18/20 | Loss: 0.0264
Epoch 19/20 | Loss: 0.0322
Epoch 20/20 | Loss: 0.0347
Training Time 21.827000379562378
Top-1 Accuracy on the ../Dataset/validation_data dataset: 41.09%
Top-3 Accuracy on the ../Dataset/validation data dataset: 54.80%
Model : trained_model_25_5.pth
Epoch 1/20 | Loss: 0.4444
Epoch 2/20 | Loss: 0.2559
Epoch 3/20 | Loss: 0.1634
Epoch 4/20 | Loss: 0.0994
Epoch 5/20 | Loss: 0.0754
Epoch 6/20 | Loss: 0.0643
Epoch 7/20 | Loss: 0.0610
Epoch 8/20 | Loss: 0.0561
Epoch 9/20 | Loss: 0.0471
Epoch 10/20 | Loss: 0.0425
Epoch 11/20 | Loss: 0.0441
Epoch 12/20 | Loss: 0.0401
Epoch 13/20 | Loss: 0.0353
Epoch 14/20 | Loss: 0.0405
Epoch 15/20 | Loss: 0.0337
Epoch 16/20 | Loss: 0.0359
Epoch 17/20 | Loss: 0.0306
Epoch 18/20 | Loss: 0.0401
Epoch 19/20 | Loss: 0.0295
Epoch 20/20 | Loss: 0.0250
Training Time 29.2343966960907
Top-1 Accuracy on the ../Dataset/validation_data dataset: 40.82%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 54.74%
Updated global Model : updated_global_model_5.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 42.21%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 54.13%
Iteration: 6
```

```
Global model updated_global_model_5.pth
Model : trained_model_5_6.pth
Epoch 1/20 | Loss: 6.4411
Epoch 2/20 | Loss: 2.5264
Epoch 3/20 | Loss: 0.3198
Epoch 4/20 | Loss: 0.1183
Epoch 5/20 | Loss: 0.0727
Epoch 6/20 | Loss: 0.0611
Epoch 7/20 | Loss: 0.0567
Epoch 8/20 | Loss: 0.0364
Epoch 9/20 | Loss: 0.0335
Epoch 10/20 | Loss: 0.0376
Epoch 11/20 | Loss: 0.0397
Epoch 12/20 | Loss: 0.0326
Epoch 13/20 | Loss: 0.0250
Epoch 14/20 | Loss: 0.0414
Epoch 15/20 | Loss: 0.0190
Epoch 16/20 | Loss: 0.0298
Epoch 17/20 | Loss: 0.0266
Epoch 18/20 | Loss: 0.0187
Epoch 19/20 | Loss: 0.0197
Epoch 20/20 | Loss: 0.0267
Training Time 7.247140645980835
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.28%
Model : trained_model_10_6.pth
Epoch 1/20 | Loss: 5.1151
Epoch 2/20 | Loss: 0.7635
Epoch 3/20 | Loss: 0.0985
Epoch 4/20 | Loss: 0.0765
Epoch 5/20 | Loss: 0.0655
Epoch 6/20 | Loss: 0.0490
Epoch 7/20 | Loss: 0.0520
Epoch 8/20 | Loss: 0.0364
Epoch 9/20 | Loss: 0.0369
Epoch 10/20 | Loss: 0.0464
Epoch 11/20 | Loss: 0.0375
Epoch 12/20 | Loss: 0.0381
Epoch 13/20 | Loss: 0.0320
Epoch 14/20 | Loss: 0.0402
Epoch 15/20 | Loss: 0.0283
Epoch 16/20 | Loss: 0.0288
Epoch 17/20 | Loss: 0.0256
Epoch 18/20 | Loss: 0.0226
Epoch 19/20 | Loss: 0.0206
Epoch 20/20 | Loss: 0.0222
Training Time 11.858228921890259
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
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Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.10%
Model : trained_model_15_6.pth
Epoch 1/20 | Loss: 3.8978
Epoch 2/20 | Loss: 0.1489
Epoch 3/20 | Loss: 0.0493
Epoch 4/20 | Loss: 0.0537
Epoch 5/20 | Loss: 0.0436
Epoch 6/20 | Loss: 0.0385
Epoch 7/20 | Loss: 0.0358
Epoch 8/20 | Loss: 0.0287
Epoch 9/20 | Loss: 0.0299
Epoch 10/20 | Loss: 0.0259
Epoch 11/20 | Loss: 0.0297
Epoch 12/20 | Loss: 0.0274
Epoch 13/20 | Loss: 0.0201
Epoch 14/20 | Loss: 0.0201
Epoch 15/20 | Loss: 0.0201
Epoch 16/20 | Loss: 0.0243
Epoch 17/20 | Loss: 0.0165
Epoch 18/20 | Loss: 0.0187
Epoch 19/20 | Loss: 0.0227
Epoch 20/20 | Loss: 0.0191
Training Time 17.62905240058899
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.16%
Model : trained_model_20_6.pth
Epoch 1/20 | Loss: 3.1583
Epoch 2/20 | Loss: 0.0650
Epoch 3/20 | Loss: 0.0381
Epoch 4/20 | Loss: 0.0351
Epoch 5/20 | Loss: 0.0311
Epoch 6/20 | Loss: 0.0250
Epoch 7/20 | Loss: 0.0203
Epoch 8/20 | Loss: 0.0225
Epoch 9/20 | Loss: 0.0195
Epoch 10/20 | Loss: 0.0261
Epoch 11/20 | Loss: 0.0152
Epoch 12/20 | Loss: 0.0180
Epoch 13/20 | Loss: 0.0175
Epoch 14/20 | Loss: 0.0148
Epoch 15/20 | Loss: 0.0178
Epoch 16/20 | Loss: 0.0155
Epoch 17/20 | Loss: 0.0093
Early Stopping
Training Time 18.255753993988037
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.40%
Model: trained_model_25_6.pth
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Epoch 1/20 | Loss: 2.3970
Epoch 2/20 | Loss: 0.0625
Epoch 3/20 | Loss: 0.0446
Epoch 4/20 | Loss: 0.0337
Epoch 5/20 | Loss: 0.0295
Epoch 6/20 | Loss: 0.0290
Epoch 7/20 | Loss: 0.0223
Epoch 8/20 | Loss: 0.0220
Epoch 9/20 | Loss: 0.0191
Epoch 10/20 | Loss: 0.0172
Epoch 11/20 | Loss: 0.0147
Epoch 12/20 | Loss: 0.0177
Epoch 13/20 | Loss: 0.0125
Epoch 14/20 | Loss: 0.0137
Epoch 15/20 | Loss: 0.0138
Epoch 16/20 | Loss: 0.0131
Epoch 17/20 | Loss: 0.0124
Epoch 18/20 | Loss: 0.0115
Epoch 19/20 | Loss: 0.0110
Epoch 20/20 | Loss: 0.0085
Early Stopping
Training Time 29.576329231262207
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.08%
Updated global Model : updated_global_model_6.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 16.96%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 51.39%
Iteration: 7
 Global model updated_global_model_6.pth
Model : trained_model_5_7.pth
Epoch 1/20 | Loss: 3.5838
Epoch 2/20 | Loss: 2.6292
Epoch 3/20 | Loss: 1.6709
Epoch 4/20 | Loss: 0.8901
Epoch 5/20 | Loss: 0.4021
Epoch 6/20 | Loss: 0.2594
Epoch 7/20 | Loss: 0.2342
Epoch 8/20 | Loss: 0.2057
Epoch 9/20 | Loss: 0.1632
Epoch 10/20 | Loss: 0.2001
Epoch 11/20 | Loss: 0.1718
Epoch 12/20 | Loss: 0.1714
Epoch 13/20 | Loss: 0.1463
Epoch 14/20 | Loss: 0.1517
Epoch 15/20 | Loss: 0.1415
Epoch 16/20 | Loss: 0.1061
Epoch 17/20 | Loss: 0.1442
Epoch 18/20 | Loss: 0.1161
```

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Epoch 19/20 | Loss: 0.1174
Epoch 20/20 | Loss: 0.1301
Training Time 7.446937561035156
Top-1 Accuracy on the ../Dataset/validation_data dataset: 41.24%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 68.82%
Model : trained_model_10_7.pth
Epoch 1/20 | Loss: 3.4648
Epoch 2/20 | Loss: 1.7863
Epoch 3/20 | Loss: 0.5584
Epoch 4/20 | Loss: 0.2271
Epoch 5/20 | Loss: 0.1735
Epoch 6/20 | Loss: 0.1482
Epoch 7/20 | Loss: 0.1602
Epoch 8/20 | Loss: 0.1213
Epoch 9/20 | Loss: 0.1173
Epoch 10/20 | Loss: 0.1055
Epoch 11/20 | Loss: 0.1210
Epoch 12/20 | Loss: 0.0975
Epoch 13/20 | Loss: 0.0971
Epoch 14/20 | Loss: 0.1171
Epoch 15/20 | Loss: 0.1004
Epoch 16/20 | Loss: 0.1083
Epoch 17/20 | Loss: 0.0843
Epoch 18/20 | Loss: 0.0833
Epoch 19/20 | Loss: 0.0749
Epoch 20/20 | Loss: 0.0761
Training Time 11.847095489501953
Top-1 Accuracy on the ../Dataset/validation_data dataset: 38.55%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 69.94%
Model : trained_model_15_7.pth
Epoch 1/20 | Loss: 3.0021
Epoch 2/20 | Loss: 0.8674
Epoch 3/20 | Loss: 0.2274
Epoch 4/20 | Loss: 0.1714
Epoch 5/20 | Loss: 0.1545
Epoch 6/20 | Loss: 0.1345
Epoch 7/20 | Loss: 0.1234
Epoch 8/20 | Loss: 0.1190
Epoch 9/20 | Loss: 0.1046
Epoch 10/20 | Loss: 0.1063
Epoch 11/20 | Loss: 0.1097
Epoch 12/20 | Loss: 0.0841
Epoch 13/20 | Loss: 0.0877
Epoch 14/20 | Loss: 0.0760
Epoch 15/20 | Loss: 0.0846
Epoch 16/20 | Loss: 0.0713
Epoch 17/20 | Loss: 0.0839
Epoch 18/20 | Loss: 0.0786
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Epoch 19/20 | Loss: 0.0622
Epoch 20/20 | Loss: 0.0802
Training Time 17.628785371780396
Top-1 Accuracy on the ../Dataset/validation_data dataset: 37.51%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 68.80%
Model : trained_model_20_7.pth
Epoch 1/20 | Loss: 2.7023
Epoch 2/20 | Loss: 0.5132
Epoch 3/20 | Loss: 0.2016
Epoch 4/20 | Loss: 0.1566
Epoch 5/20 | Loss: 0.1257
Epoch 6/20 | Loss: 0.1442
Epoch 7/20 | Loss: 0.1208
Epoch 8/20 | Loss: 0.1117
Epoch 9/20 | Loss: 0.1009
Epoch 10/20 | Loss: 0.1012
Epoch 11/20 | Loss: 0.0845
Epoch 12/20 | Loss: 0.0823
Epoch 13/20 | Loss: 0.0840
Epoch 14/20 | Loss: 0.0757
Epoch 15/20 | Loss: 0.0706
Epoch 16/20 | Loss: 0.0838
Epoch 17/20 | Loss: 0.0650
Epoch 18/20 | Loss: 0.0651
Epoch 19/20 | Loss: 0.0625
Epoch 20/20 | Loss: 0.0658
Training Time 21.652684688568115
Top-1 Accuracy on the ../Dataset/validation_data dataset: 36.47%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 68.68%
Model : trained_model_25_7.pth
Epoch 1/20 | Loss: 2.2638
Epoch 2/20 | Loss: 0.2626
Epoch 3/20 | Loss: 0.1649
Epoch 4/20 | Loss: 0.1276
Epoch 5/20 | Loss: 0.1206
Epoch 6/20 | Loss: 0.1244
Epoch 7/20 | Loss: 0.0930
Epoch 8/20 | Loss: 0.0892
Epoch 9/20 | Loss: 0.0901
Epoch 10/20 | Loss: 0.0781
Epoch 11/20 | Loss: 0.0808
Epoch 12/20 | Loss: 0.0786
Epoch 13/20 | Loss: 0.0880
Epoch 14/20 | Loss: 0.0660
Epoch 15/20 | Loss: 0.0566
Epoch 16/20 | Loss: 0.0686
Epoch 17/20 | Loss: 0.0554
Epoch 18/20 | Loss: 0.0616
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Epoch 19/20 | Loss: 0.0521
Epoch 20/20 | Loss: 0.0511
Training Time 29.455316305160522
Top-1 Accuracy on the ../Dataset/validation_data dataset: 41.11%
Top-3 Accuracy on the ../Dataset/validation data dataset: 73.57%
Updated global Model : updated_global_model_7.pth
Top-1 Accuracy on the ../Dataset/validation data dataset: 40.41%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 71.88%
Iteration: 8
Global model updated_global_model_7.pth
Model: trained_model_5_8.pth
Epoch 1/20 | Loss: 1.4312
Epoch 2/20 | Loss: 0.6885
Epoch 3/20 | Loss: 0.2585
Epoch 4/20 | Loss: 0.1963
Epoch 5/20 | Loss: 0.1424
Epoch 6/20 | Loss: 0.1129
Epoch 7/20 | Loss: 0.0607
Epoch 8/20 | Loss: 0.0812
Epoch 9/20 | Loss: 0.0709
Epoch 10/20 | Loss: 0.0790
Epoch 11/20 | Loss: 0.0814
Epoch 12/20 | Loss: 0.0605
Epoch 13/20 | Loss: 0.0691
Epoch 14/20 | Loss: 0.0585
Epoch 15/20 | Loss: 0.0685
Epoch 16/20 | Loss: 0.0536
Epoch 17/20 | Loss: 0.0374
Epoch 18/20 | Loss: 0.0475
Epoch 19/20 | Loss: 0.0358
Epoch 20/20 | Loss: 0.0488
Training Time 7.548370599746704
Top-1 Accuracy on the ../Dataset/validation_data dataset: 24.62%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 67.62%
Model: trained model 10 8.pth
Epoch 1/20 | Loss: 1.1408
Epoch 2/20 | Loss: 0.3590
Epoch 3/20 | Loss: 0.1734
Epoch 4/20 | Loss: 0.1285
Epoch 5/20 | Loss: 0.1102
Epoch 6/20 | Loss: 0.0870
Epoch 7/20 | Loss: 0.0723
Epoch 8/20 | Loss: 0.0683
Epoch 9/20 | Loss: 0.0552
Epoch 10/20 | Loss: 0.0593
Epoch 11/20 | Loss: 0.0528
Epoch 12/20 | Loss: 0.0534
Epoch 13/20 | Loss: 0.0495
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Epoch 14/20 | Loss: 0.0449
Epoch 15/20 | Loss: 0.0426
Epoch 16/20 | Loss: 0.0355
Epoch 17/20 | Loss: 0.0262
Epoch 18/20 | Loss: 0.0355
Epoch 19/20 | Loss: 0.0521
Epoch 20/20 | Loss: 0.0348
Training Time 11.826012372970581
Top-1 Accuracy on the ../Dataset/validation_data dataset: 24.95%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 70.89%
Model : trained_model_15_8.pth
Epoch 1/20 | Loss: 0.9587
Epoch 2/20 | Loss: 0.2230
Epoch 3/20 | Loss: 0.1327
Epoch 4/20 | Loss: 0.1117
Epoch 5/20 | Loss: 0.0767
Epoch 6/20 | Loss: 0.0678
Epoch 7/20 | Loss: 0.0497
Epoch 8/20 | Loss: 0.0482
Epoch 9/20 | Loss: 0.0460
Epoch 10/20 | Loss: 0.0508
Epoch 11/20 | Loss: 0.0357
Epoch 12/20 | Loss: 0.0349
Epoch 13/20 | Loss: 0.0360
Epoch 14/20 | Loss: 0.0315
Epoch 15/20 | Loss: 0.0311
Epoch 16/20 | Loss: 0.0315
Epoch 17/20 | Loss: 0.0239
Epoch 18/20 | Loss: 0.0305
Epoch 19/20 | Loss: 0.0255
Epoch 20/20 | Loss: 0.0195
Training Time 17.694520711898804
Top-1 Accuracy on the ../Dataset/validation_data dataset: 21.66%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 68.85%
Model: trained model 20 8.pth
Epoch 1/20 | Loss: 0.8026
Epoch 2/20 | Loss: 0.1456
Epoch 3/20 | Loss: 0.0998
Epoch 4/20 | Loss: 0.0652
Epoch 5/20 | Loss: 0.0639
Epoch 6/20 | Loss: 0.0554
Epoch 7/20 | Loss: 0.0413
Epoch 8/20 | Loss: 0.0401
Epoch 9/20 | Loss: 0.0414
Epoch 10/20 | Loss: 0.0321
Epoch 11/20 | Loss: 0.0345
Epoch 12/20 | Loss: 0.0300
Epoch 13/20 | Loss: 0.0279
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Epoch 14/20 | Loss: 0.0310
Epoch 15/20 | Loss: 0.0246
Epoch 16/20 | Loss: 0.0288
Epoch 17/20 | Loss: 0.0209
Epoch 18/20 | Loss: 0.0251
Epoch 19/20 | Loss: 0.0218
Epoch 20/20 | Loss: 0.0189
Training Time 21.971256494522095
Top-1 Accuracy on the ../Dataset/validation_data dataset: 21.79%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 71.27%
Model : trained_model_25_8.pth
Epoch 1/20 | Loss: 0.6533
Epoch 2/20 | Loss: 0.1201
Epoch 3/20 | Loss: 0.0768
Epoch 4/20 | Loss: 0.0666
Epoch 5/20 | Loss: 0.0570
Epoch 6/20 | Loss: 0.0396
Epoch 7/20 | Loss: 0.0354
Epoch 8/20 | Loss: 0.0343
Epoch 9/20 | Loss: 0.0277
Epoch 10/20 | Loss: 0.0358
Epoch 11/20 | Loss: 0.0308
Epoch 12/20 | Loss: 0.0277
Epoch 13/20 | Loss: 0.0203
Epoch 14/20 | Loss: 0.0200
Epoch 15/20 | Loss: 0.0203
Epoch 16/20 | Loss: 0.0182
Epoch 17/20 | Loss: 0.0196
Epoch 18/20 | Loss: 0.0144
Epoch 19/20 | Loss: 0.0155
Epoch 20/20 | Loss: 0.0171
Training Time 29.455976009368896
Top-1 Accuracy on the ../Dataset/validation_data dataset: 17.87%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 70.33%
Updated global Model: updated global model 8.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 20.83%
Top-3 Accuracy on the ../Dataset/validation data dataset: 70.46%
Iteration: 9
Global model updated_global_model_8.pth
Model : trained_model_5_9.pth
Epoch 1/20 | Loss: 6.0993
Epoch 2/20 | Loss: 4.5339
Epoch 3/20 | Loss: 2.6251
Epoch 4/20 | Loss: 1.1816
Epoch 5/20 | Loss: 0.4116
Epoch 6/20 | Loss: 0.2869
Epoch 7/20 | Loss: 0.2395
Epoch 8/20 | Loss: 0.1915
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Epoch 9/20 | Loss: 0.1679
Epoch 10/20 | Loss: 0.1717
Epoch 11/20 | Loss: 0.1518
Epoch 12/20 | Loss: 0.1866
Epoch 13/20 | Loss: 0.1596
Epoch 14/20 | Loss: 0.1567
Epoch 15/20 | Loss: 0.1305
Epoch 16/20 | Loss: 0.1663
Epoch 17/20 | Loss: 0.1431
Epoch 18/20 | Loss: 0.1445
Epoch 19/20 | Loss: 0.1359
Epoch 20/20 | Loss: 0.1293
Training Time 7.453106880187988
Top-1 Accuracy on the .../Dataset/validation_data_dataset: 33.77%
Top-3 Accuracy on the .../Dataset/validation_data dataset: 74.06%
Model : trained_model_10_9.pth
Epoch 1/20 | Loss: 5.7545
Epoch 2/20 | Loss: 2.8719
Epoch 3/20 | Loss: 0.6528
Epoch 4/20 | Loss: 0.2858
Epoch 5/20 | Loss: 0.2102
Epoch 6/20 | Loss: 0.1984
Epoch 7/20 | Loss: 0.1869
Epoch 8/20 | Loss: 0.1652
Epoch 9/20 | Loss: 0.1717
Epoch 10/20 | Loss: 0.1610
Epoch 11/20 | Loss: 0.1480
Epoch 12/20 | Loss: 0.1481
Epoch 13/20 | Loss: 0.1308
Epoch 14/20 | Loss: 0.1234
Epoch 15/20 | Loss: 0.1235
Epoch 16/20 | Loss: 0.1107
Epoch 17/20 | Loss: 0.1158
Epoch 18/20 | Loss: 0.1085
Epoch 19/20 | Loss: 0.1110
Epoch 20/20 | Loss: 0.1064
Training Time 11.79749321937561
Top-1 Accuracy on the ../Dataset/validation_data dataset: 33.75%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 74.41%
Model : trained_model_15_9.pth
Epoch 1/20 | Loss: 4.9971
Epoch 2/20 | Loss: 1.2789
Epoch 3/20 | Loss: 0.2733
Epoch 4/20 | Loss: 0.1874
Epoch 5/20 | Loss: 0.1897
Epoch 6/20 | Loss: 0.1596
Epoch 7/20 | Loss: 0.1552
Epoch 8/20 | Loss: 0.1462
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Epoch 9/20 | Loss: 0.1222
Epoch 10/20 | Loss: 0.1145
Epoch 11/20 | Loss: 0.1212
Epoch 12/20 | Loss: 0.1106
Epoch 13/20 | Loss: 0.1126
Epoch 14/20 | Loss: 0.1022
Epoch 15/20 | Loss: 0.1014
Epoch 16/20 | Loss: 0.1050
Epoch 17/20 | Loss: 0.0939
Epoch 18/20 | Loss: 0.0844
Epoch 19/20 | Loss: 0.0743
Epoch 20/20 | Loss: 0.0776
Training Time 17.529508352279663
Top-1 Accuracy on the ../Dataset/validation_data_dataset: 33.60%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 73.26%
Model : trained_model_20_9.pth
Epoch 1/20 | Loss: 4.3940
Epoch 2/20 | Loss: 0.7803
Epoch 3/20 | Loss: 0.2026
Epoch 4/20 | Loss: 0.1830
Epoch 5/20 | Loss: 0.1622
Epoch 6/20 | Loss: 0.1527
Epoch 7/20 | Loss: 0.1417
Epoch 8/20 | Loss: 0.1251
Epoch 9/20 | Loss: 0.1174
Epoch 10/20 | Loss: 0.1040
Epoch 11/20 | Loss: 0.1128
Epoch 12/20 | Loss: 0.1057
Epoch 13/20 | Loss: 0.1060
Epoch 14/20 | Loss: 0.0861
Epoch 15/20 | Loss: 0.0925
Epoch 16/20 | Loss: 0.0877
Epoch 17/20 | Loss: 0.0770
Epoch 18/20 | Loss: 0.0760
Epoch 19/20 | Loss: 0.0798
Epoch 20/20 | Loss: 0.0788
Training Time 21.652093410491943
Top-1 Accuracy on the ../Dataset/validation_data dataset: 33.67%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 78.03%
Model : trained_model_25_9.pth
Epoch 1/20 | Loss: 3.7376
Epoch 2/20 | Loss: 0.2864
Epoch 3/20 | Loss: 0.1858
Epoch 4/20 | Loss: 0.1619
Epoch 5/20 | Loss: 0.1443
Epoch 6/20 | Loss: 0.1244
Epoch 7/20 | Loss: 0.1202
Epoch 8/20 | Loss: 0.1090
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Epoch 9/20 | Loss: 0.0992
Epoch 10/20 | Loss: 0.1004
Epoch 11/20 | Loss: 0.0866
Epoch 12/20 | Loss: 0.0875
Epoch 13/20 | Loss: 0.0832
Epoch 14/20 | Loss: 0.0744
Epoch 15/20 | Loss: 0.0735
Epoch 16/20 | Loss: 0.0720
Epoch 17/20 | Loss: 0.0725
Epoch 18/20 | Loss: 0.0673
Epoch 19/20 | Loss: 0.0694
Epoch 20/20 | Loss: 0.0659
Training Time 29.384427547454834
Top-1 Accuracy on the ../Dataset/validation_data dataset: 33.44%
Top-3 Accuracy on the .../Dataset/validation_data dataset: 70.27%
Updated global Model : updated_global_model_9.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 33.58%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 74.06%
Iteration: 10
 Global model updated global model 9.pth
Model : trained_model_5_10.pth
Epoch 1/20 | Loss: 0.2011
Epoch 2/20 | Loss: 0.1406
Epoch 3/20 | Loss: 0.1150
Epoch 4/20 | Loss: 0.0819
Epoch 5/20 | Loss: 0.0781
Epoch 6/20 | Loss: 0.0758
Epoch 7/20 | Loss: 0.0553
Epoch 8/20 | Loss: 0.0619
Epoch 9/20 | Loss: 0.0561
Epoch 10/20 | Loss: 0.0380
Epoch 11/20 | Loss: 0.0421
Epoch 12/20 | Loss: 0.0385
Epoch 13/20 | Loss: 0.0422
Epoch 14/20 | Loss: 0.0376
Epoch 15/20 | Loss: 0.0302
Epoch 16/20 | Loss: 0.0315
Epoch 17/20 | Loss: 0.0293
Epoch 18/20 | Loss: 0.0288
Epoch 19/20 | Loss: 0.0285
Epoch 20/20 | Loss: 0.0258
Training Time 7.523771286010742
Top-1 Accuracy on the ../Dataset/validation_data dataset: 32.00%
Top-3 Accuracy on the ../Dataset/validation_data_dataset: 48.94%
Model : trained_model_10_10.pth
Epoch 1/20 | Loss: 0.2031
Epoch 2/20 | Loss: 0.1379
Epoch 3/20 | Loss: 0.0977
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Epoch 4/20 | Loss: 0.0774
Epoch 5/20 | Loss: 0.0646
Epoch 6/20 | Loss: 0.0683
Epoch 7/20 | Loss: 0.0562
Epoch 8/20 | Loss: 0.0547
Epoch 9/20 | Loss: 0.0457
Epoch 10/20 | Loss: 0.0516
Epoch 11/20 | Loss: 0.0495
Epoch 12/20 | Loss: 0.0407
Epoch 13/20 | Loss: 0.0334
Epoch 14/20 | Loss: 0.0381
Epoch 15/20 | Loss: 0.0280
Epoch 16/20 | Loss: 0.0320
Epoch 17/20 | Loss: 0.0277
Epoch 18/20 | Loss: 0.0269
Epoch 19/20 | Loss: 0.0341
Epoch 20/20 | Loss: 0.0269
Training Time 11.792267322540283
Top-1 Accuracy on the ../Dataset/validation_data dataset: 30.85%
Top-3 Accuracy on the ../Dataset/validation data dataset: 49.69%
Model : trained_model_15_10.pth
Epoch 1/20 | Loss: 0.1798
Epoch 2/20 | Loss: 0.1105
Epoch 3/20 | Loss: 0.0823
Epoch 4/20 | Loss: 0.0665
Epoch 5/20 | Loss: 0.0526
Epoch 6/20 | Loss: 0.0501
Epoch 7/20 | Loss: 0.0458
Epoch 8/20 | Loss: 0.0375
Epoch 9/20 | Loss: 0.0420
Epoch 10/20 | Loss: 0.0398
Epoch 11/20 | Loss: 0.0344
Epoch 12/20 | Loss: 0.0298
Epoch 13/20 | Loss: 0.0318
Epoch 14/20 | Loss: 0.0260
Epoch 15/20 | Loss: 0.0251
Epoch 16/20 | Loss: 0.0235
Epoch 17/20 | Loss: 0.0251
Epoch 18/20 | Loss: 0.0224
Epoch 19/20 | Loss: 0.0185
Epoch 20/20 | Loss: 0.0214
Training Time 17.41605257987976
Top-1 Accuracy on the ../Dataset/validation_data dataset: 29.78%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 50.49%
Model : trained_model_20_10.pth
Epoch 1/20 | Loss: 0.1715
Epoch 2/20 | Loss: 0.1016
Epoch 3/20 | Loss: 0.0696
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Epoch 4/20 | Loss: 0.0606
Epoch 5/20 | Loss: 0.0552
Epoch 6/20 | Loss: 0.0459
Epoch 7/20 | Loss: 0.0404
Epoch 8/20 | Loss: 0.0340
Epoch 9/20 | Loss: 0.0315
Epoch 10/20 | Loss: 0.0321
Epoch 11/20 | Loss: 0.0296
Epoch 12/20 | Loss: 0.0265
Epoch 13/20 | Loss: 0.0257
Epoch 14/20 | Loss: 0.0243
Epoch 15/20 | Loss: 0.0192
Epoch 16/20 | Loss: 0.0213
Epoch 17/20 | Loss: 0.0242
Epoch 18/20 | Loss: 0.0189
Epoch 19/20 | Loss: 0.0172
Epoch 20/20 | Loss: 0.0203
Training Time 21.625617504119873
Top-1 Accuracy on the ../Dataset/validation_data dataset: 30.11%
Top-3 Accuracy on the ../Dataset/validation data dataset: 50.69%
Model : trained_model_25_10.pth
Epoch 1/20 | Loss: 0.1541
Epoch 2/20 | Loss: 0.0826
Epoch 3/20 | Loss: 0.0547
Epoch 4/20 | Loss: 0.0484
Epoch 5/20 | Loss: 0.0412
Epoch 6/20 | Loss: 0.0350
Epoch 7/20 | Loss: 0.0305
Epoch 8/20 | Loss: 0.0265
Epoch 9/20 | Loss: 0.0270
Epoch 10/20 | Loss: 0.0210
Epoch 11/20 | Loss: 0.0204
Epoch 12/20 | Loss: 0.0219
Epoch 13/20 | Loss: 0.0188
Epoch 14/20 | Loss: 0.0192
Epoch 15/20 | Loss: 0.0190
Epoch 16/20 | Loss: 0.0159
Epoch 17/20 | Loss: 0.0163
Epoch 18/20 | Loss: 0.0152
Epoch 19/20 | Loss: 0.0136
Epoch 20/20 | Loss: 0.0156
Training Time 29.440067291259766
Top-1 Accuracy on the ../Dataset/validation_data dataset: 26.11%
Top-3 Accuracy on the ../Dataset/validation_data dataset: 49.40%
Updated global Model : updated_global_model_10.pth
Top-1 Accuracy on the ../Dataset/validation_data dataset: 29.48%
Top-3 Accuracy on the .../Dataset/validation_data dataset: 50.20%
```

```
[15]: test_model('../Dataset/test_data', global_model_name)

Top-1 Accuracy on the ../Dataset/test_data dataset: 29.48%
Top-3 Accuracy on the ../Dataset/test_data dataset: 50.40%

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