

Mehrdad Baradarn

Artificial Neural Network

Assignment 3

Train Intel-Image
Using ResNet Model

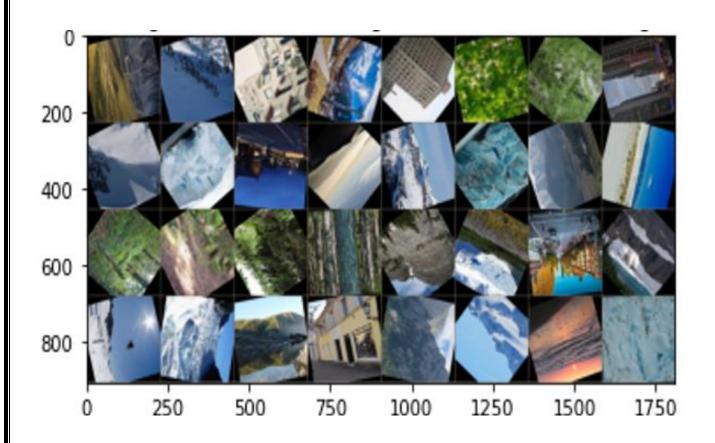
 $S_Id = 99222020$

Headline:
• Dataset
ResNet ModelWRNS
• Inception-ResNet
Best Model
Confusion matrix

Dataset : (Intel-Image)

This Data contains around 25k images of size 150x150 distributed under 6 categories.

{'buildings' -> 0, 'forest' -> 1, 'glacier' -> 2, 'mountain' -> 3, 'sea' -> 4, 'street' -> 5 }



At first, we use the simplest ResNet family to train the intel image dataset Before that, we import the required libraries.

```
import torch
import torch.nn as nn
import torch.optim as optim
from torch.optim import lr_scheduler
import torch.backends.cudnn as cudnn
import torchvision
from torchvision import datasets, models, transforms
import matplotlib.pyplot as plt
import numpy as np
import os, sys
import time
import copy
from glob import glob
import imageio
```

Next, we load the required data using kaggle api and store it in the variables. To improve the training of our own model, we use data augmentation to change the trian data into different forms, and finally, in our transform data, after changing the inputs, we normalize them and load the data.

Load data

```
image_datasets = {x: datasets.ImageFolder(os.path.join(x), data_transforms[x]) for x in [train, test]}

dataloader = {x: torch.utils.data.DataLoader(image_datasets[x], batch_size=32, shuffle=True, num_workers=4) for x in [train, test]}
```

We download the ResNet152 model and make one from it. Next, we will freeze the trainable parameters of the CNN part so that we can fit our linear part, which includes random weights.

And then we transfer our model to gpu.

```
for param in resnet.parameters():
    param.requires_grad = False

[ ] device = torch.device("cuda:0" if torch.cuda.is_available() else "cpu")
```

We change the fully connected model section and create our desired architecture. It includes three layers with Relu activation function and dropout method.

To train the model and apply forward/backward propagation, we need to set our loss function and optimizer.

```
[ ] criterion = nn.CrossEntropyLoss()
  optimizer = optim.Adam(resnet.parameters(), lr=1e-4)
```

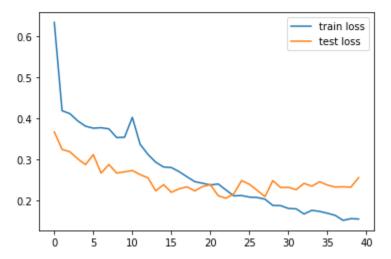
And then we need to implement the train_model method so that the resnet model starts training. At each epoch,

train loss, test loss and required time are displayed. In this function, it is necessary to unfreeze the parameters of the pre-trained model after a number of epochs.

```
train_losses, test_losses = train_model(
                                   criterion
                                   optimizer.
                                   dataloader[train],
                                   dataloader[test],
                                   epochs=40)
Epoch 1/40, Train_Loss: 0.6348, \Test_Loss: 0.3671, Duration: 0:02:18.012346
Epoch 2/40, Train_Loss: 0.4187, \Test_Loss: 0.3239, Duration: 0:02:12.348367
Epoch 3/40, Train_Loss: 0.4116, \Test_Loss: 0.3183, Duration: 0:02:12.303492
Epoch 4/40, Train_Loss: 0.3940, \Test_Loss: 0.3011, Duration: 0:02:11.797530
Epoch 5/40, Train_Loss: 0.3809, \Test_Loss: 0.2869, Duration: 0:02:12.182279
Epoch 6/40, Train_Loss: 0.3760, \Test_Loss: 0.3113, Duration: 0:02:12.008638
Epoch 7/40, Train_Loss: 0.3771, \Test_Loss: 0.2661, Duration: 0:02:12.230927
Epoch 8/40, Train_Loss: 0.3743, \Test_Loss: 0.2872, Duration: 0:02:12.286634
Epoch 9/40, Train Loss: 0.3530, \Test Loss: 0.2662, Duration: 0:02:13.266736
Epoch 10/40, Train_Loss: 0.3539, \Test_Loss: 0.2692, Duration: 0:02:12.489712
Epoch 11/40, Train_Loss: 0.4025, \Test_Loss: 0.2725, Duration: 0:06:02.206394
Epoch 12/40, Train_Loss: 0.3366, \Test_Loss: 0.2625, Duration: 0:06:00.994119
Epoch 13/40, Train_Loss: 0.3119, \Test_Loss: 0.2546, Duration: 0:06:00.693115
Epoch 14/40, Train_Loss: 0.2928, \Test_Loss: 0.2227, Duration: 0:06:01.171837
Epoch 15/40, Train_Loss: 0.2811, \Test_Loss: 0.2380, Duration: 0:06:00.407107
Epoch 16/40, Train_Loss: 0.2797, \Test_Loss: 0.2192, Duration: 0:06:00.845971
Epoch 17/40, Train_Loss: 0.2697, \Test_Loss: 0.2277, Duration: 0:06:00.459688
Epoch 18/40, Train_Loss: 0.2573, \Test_Loss: 0.2326, Duration: 0:06:00.712149
Epoch 19/40, Train_Loss: 0.2453, \Test_Loss: 0.2225, Duration: 0:06:00.095190
Epoch 20/40, Train_Loss: 0.2413, \Test_Loss: 0.2334, Duration: 0:06:00.221754
Epoch 21/40, Train_Loss: 0.2371, \Test_Loss: 0.2379, Duration: 0:05:59.689844
Epoch 22/40, Train_Loss: 0.2397, \Test_Loss: 0.2109, Duration: 0:05:59.977015
Epoch 23/40, Train_Loss: 0.2248, \Test_Loss: 0.2046, Duration: 0:05:59.677062
Epoch 24/40, Train_Loss: 0.2104, \Test_Loss: 0.2154, Duration: 0:05:59.551734
Epoch 25/40, Train_Loss: 0.2113, \Test_Loss: 0.2479, Duration: 0:05:59.383888
Epoch 26/40, Train_Loss: 0.2074, \Test_Loss: 0.2388, Duration: 0:05:59.620912
Epoch 27/40, Train_Loss: 0.2065, \Test_Loss: 0.2240, Duration: 0:05:59.554906
Epoch 28/40, Train_Loss: 0.2023, \Test_Loss: 0.2087, Duration: 0:05:57.515687
Epoch 29/40, Train_Loss: 0.1871, \Test_Loss: 0.2478, Duration: 0:05:55.495677
Epoch 30/40, Train_Loss: 0.1866, \Test_Loss: 0.2309, Duration: 0:05:55.362354
Epoch 31/40, Train_Loss: 0.1797, \Test_Loss: 0.2314, Duration: 0:05:55.285163
Epoch 32/40, Train_Loss: 0.1787, \Test_Loss: 0.2256, Duration: 0:05:54.940069
Epoch 33/40, Train_Loss: 0.1660, \Test_Loss: 0.2410, Duration: 0:05:56.998170
Epoch 34/40, Train_Loss: 0.1751, \Test_Loss: 0.2341, Duration: 0:05:55.879126
Epoch 35/40, Train_Loss: 0.1724, \Test_Loss: 0.2451, Duration: 0:05:55.100177
Epoch 36/40, Train_Loss: 0.1680, \Test_Loss: 0.2369, Duration: 0:05:54.989463
Epoch 37/40, Train_Loss: 0.1628, \Test_Loss: 0.2321, Duration: 0:05:55.205754
Epoch 38/40, Train_Loss: 0.1506, \Test_Loss: 0.2326, Duration: 0:05:54.941748
Epoch 39/40, Train_Loss: 0.1547, \Test_Loss: 0.2317, Duration: 0:05:54.979370
```

We will plot the changes of losses for a better view.

```
[ ] plt.plot(train_losses, label='train loss')
   plt.plot(test_losses, label='test loss')
   plt.legend()
   plt.show()
```



Got 2793/3000 with accuracy 93.1000

Now it's time to predict the model on the test data so that we can see the accuracy.

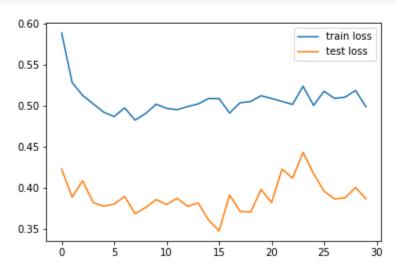
```
] train_losses=[]
    test_losses=[]
    def accuracy(loader, model):
         num corrects = 0
         num samples = 0
        model.eval()
        loop = tqdm(loader)
         with torch.no_grad():
             for x, y in loop:
                 x = x.to(device)
                 y = y.to(device)
                 scores = model(x)
                 test_losses.append(scores.data)
                 _, prediction = scores.max(1)
                 num_corrects += (prediction == y).sum()
                 num_samples += prediction.size(0)
                 acc = (num_corrects/num_samples) * 100
                 loop.set_postfix(acc=acc.item())
             print(f'Got {num_corrects}/{num_samples} with accuracy {acc:.4f}')
[ ] accuracy(dataloader[test], resnet)
```

94/94 [00:21<00:00, 4.93it/s, acc=93.1]

WRNS: [] wrn = models.wide_resnet101_2(pretrained=True) /usr/local/lib/python3.8/dist-packages/torchvision/models/_utils.py:223: \ warnings.warn(msg) Downloading: "https://download.pytorch.org/models/wide_resnet101_2-32ee11! 100% 243M/243M [00:01<00:00, 276MB/s] < [] for param in wrn.parameters(): param.requires_grad = False [] wrn.fc = nn.Sequential(nn.Linear(2048, 1024), nn.ReLU(), nn.Dropout(0.5), nn.Linear(1024, 6), nn.LogSoftmax(dim=1)) wrn = wrn.to(device)

In the picture, we can see that the changes in loss are not stable.

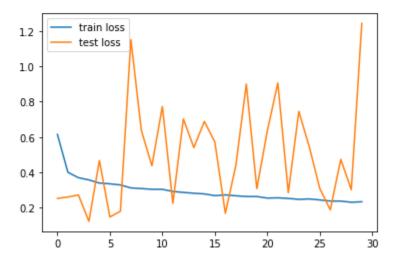
```
[ ] plt.plot(train_losses, label='train loss')
   plt.plot(test_losses, label='test loss')
   plt.legend()
   plt.show()
```



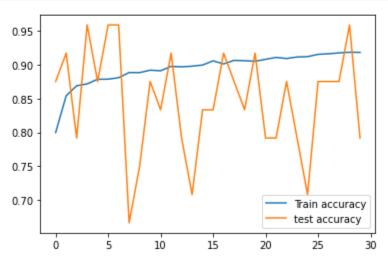
```
[ ] accuracy(dataloader[test], wrn)
                                                94/94 [00:29<00:00, 3.54it/s, acc=89.5]
     /usr/local/lib/python3.8/dist-packages/torch/utils/data/dataloader.py:554:
       warnings.warn(_create_warning_msg(
     Got 2685/3000 with accuracy 89.5000
In this model, the number of parameters is almost twice as much as the previous
model, and the calculation cost was much higher in training and resources. But still,
it can't perform as powerfully as the previous model.
```

Inception_v3:

```
[ ] plt.plot(train_losses, label='train loss')
   plt.plot(val_losses, label='test loss')
   plt.legend()
   plt.show()
```



```
[ ] plt.plot(train_accuracies, label='Train accuracy')
   plt.plot(val_accuracies, label='test accuracy')
   plt.legend()
   plt.show()
```



The inception model is improving on train data, while it is very unstable on train data. And as a result, in each epoch, it will have a different prediction compared to its next times. Of course, the model is much lighter and simpler than the previous two models, so it will be less efficient.

[] accuracy(dataloader[test], model)

100%

94/94 [00:10<00:00, 12.14it/s, acc=87]

Got 2609/3000 with accuracy 86.9667

For the effect of the number of layers and parameters, we show a summary for each model

ResNet152:

Layer (type)	Output Shape	Param #
 Conv2d-1	[-1, 64, 150, 150]	9,408
BatchNorm2d-2	[-1, 64, 150, 150]	128
ReLU-3	[-1, 64, 150, 150]	0
MaxPool2d-4	[-1, 64, 75, 75]	0
Conv2d-5	[-1, 64, 75, 75]	4,096
BatchNorm2d-6	[-1, 64, 75, 75]	128
ReLU-7	[-1, 64, 75, 75]	0
Conv2d-8	[-1, 64, 75, 75]	36,864
BatchNorm2d-9	[-1, 64, 75, 75]	128
ReLU-10	[-1, 64, 75, 75]	0
Conv2d-11	[-1, 256, 75, 75]	16,384
BatchNorm2d-12	[-1, 256, 75, 75]	512
Conv2d-13	[-1, 256, 75, 75]	16,384
BatchNorm2d-14	[-1, 256, 75, 75]	512
ReLU-15	[-1, 256, 75, 75]	0
Bottleneck-16	[-1, 256, 75, 75]	0
Conv2d-17	[-1, 64, 75, 75]	16,384
BatchNorm2d-18	[-1, 64, 75, 75]	128
ReLU-19	[-1, 64, 75, 75]	0
Conv2d-20	[-1, 64, 75, 75]	36,864
BatchNorm2d-21	[-1, 64, 75, 75]	128
ReLU-22	[-1, 64, 75, 75]	0
Conv2d-23	[-1, 256, 75, 75]	16,384
BatchNorm2d-24	[-1, 256, 75, 75]	512
ReLU-25	[-1, 256, 75, 75]	0
Bottleneck-26	[-1, 256, 75, 75]	0
Conv2d-27	[-1, 64, 75, 75]	16,384
BatchNorm2d-28	[-1, 64, 75, 75]	128
ReLU-29	[-1, 64, 75, 75]	0
Conv2d-30	[-1, 64, 75, 75]	36,864
BatchNorm2d-31	[-1, 64, 75, 75]	128
ReLU-32	[-1, 64, 75, 75]	0
Conv2d-33	[-1, 256, 75, 75]	16,384
BatchNorm2d-34	[-1, 256, 75, 75]	512
ReLU-35	[-1, 256, 75, 75]	0
Bottleneck-36	[-1, 256, 75, 75]	0
Conv2d-37	[-1, 128, 75, 75]	32,768
BatchNorm2d-38	[-1, 128, 75, 75]	256
ReLU-39	[-1, 128, 75, 75]	0
Conv2d-40	[-1, 128, 38, 38]	147,456
BatchNorm2d-41	[-1, 128, 38, 38]	256

ReLU-42	[-1, 128, 38, 38]
Conv2d-43	[-1, 512, 38, 38] 65,536
BatchNorm2d-44	[-1, 512, 38, 38] 1,024
Conv2d-45	[-1, 512, 38, 38] 131,072
BatchNorm2d-46	[-1, 512, 38, 38] 1,024
ReLU-47	[-1, 512, 38, 38]
Bottleneck-48	[-1, 512, 38, 38]
Conv2d-49	[-1, 128, 38, 38] 65,536
BatchNorm2d-50	[-1, 128, 38, 38] 05,336 [-1, 128, 38, 38] 256
ReLU-51	[-1, 128, 38, 38] 0
Conv2d-52	[-1, 128, 38, 38] 147,456
BatchNorm2d-53	[-1, 128, 38, 38] 256
ReLU-54	[-1, 128, 38, 38] 0
Conv2d-55	[-1, 512, 38, 38] 65,536
BatchNorm2d-56	[-1, 512, 38, 38] 1,024
ReLU-57	[-1, 512, 38, 38]
Bottleneck-58	[-1, 512, 38, 38]
Conv2d-59	[-1, 128, 38, 38] 65,536
BatchNorm2d-60	[-1, 128, 38, 38] 256
ReLU-61	[-1, 128, 38, 38]
Conv2d-62	[-1, 128, 38, 38] 147,456
BatchNorm2d-63	[-1, 128, 38, 38] 256
ReLU-64	[-1, 128, 38, 38]
Conv2d-65	[-1, 512, 38, 38] 65,536
BatchNorm2d-66	[-1, 512, 38, 38] 1,024
ReLU-67	[-1, 512, 38, 38]
Bottleneck-68	[-1, 512, 38, 38]
Conv2d-69	[-1, 128, 38, 38] 65,536
BatchNorm2d-70	[-1, 128, 38, 38] 256
ReLU-71	[-1, 128, 38, 38]
Conv2d-72	[-1, 128, 38, 38] 147,456
BatchNorm2d-73	[-1, 128, 38, 38] 256
ReLU-74	[-1, 128, 38, 38]
Conv2d-75	[-1, 512, 38, 38] 65,536
BatchNorm2d-76	[-1, 512, 38, 38] 1,024
ReLU-77	[-1, 512, 38, 38] 0
Bottleneck-78	[-1, 512, 38, 38] 0
Conv2d-79	[-1, 128, 38, 38] 65,536
BatchNorm2d-80	[-1, 128, 38, 38]
ReLU-81	[-1, 128, 38, 38] 0
Conv2d-82	[-1, 128, 38, 38] 147,456
BatchNorm2d-83	[-1, 128, 38, 38]
ReLU-84	[-1, 128, 38, 38]
Conv2d-85	[-1, 512, 38, 38] 65,536
BatchNorm2d-86	[-1, 512, 38, 38] 03,330 [-1, 512, 38, 38] 1,024
ReLU-87	[-1, 512, 38, 38]
Bottleneck-88	[-1, 512, 36, 36] [-1, 512, 38, 38]
Conv2d-89	[-1, 312, 38, 38] 65,536
BatchNorm2d-90	[-1, 128, 38, 38] 65,336 [-1, 128, 38, 38] 256
ReLU-91	[-1, 128, 38, 38] 230 [-1, 128, 38, 38] 0
Conv2d-92	[-1, 128, 38, 38] 147,456
BatchNorm2d-93	[-1, 128, 38, 38]
ReLU-94 Conv2d-95	[-1, 128, 38, 38] 0 [-1, 512, 38, 38] 65,536
BatchNorm2d-96	[-1, 512, 38, 38] 1,024
ReLU-97	[-1, 512, 38, 38] 0
Bottleneck-98	[-1, 512, 38, 38] 0
Conv2d-99	[-1, 128, 38, 38] 65,536
BatchNorm2d-100	[-1, 128, 38, 38] 256
ReLU-101	[-1, 128, 38, 38] 0
Conv2d-102	[-1, 128, 38, 38] 147,456
BatchNorm2d-103	[-1, 128, 38, 38] 256
ReLU-104	[-1, 128, 38, 38]

```
Conv2d-105
                          [-1, 512, 38, 38]
                                                      65,536
                                                       1,024
BatchNorm2d-106
                          [-1, 512, 38, 38]
       ReLU-107
                          [-1, 512, 38, 38]
                                                            0
                                                            0
                          [-1, 512, 38, 38]
 Bottleneck-108
                          [-1, 128, 38, 38]
                                                      65,536
     Conv2d-109
                          [-1, 128, 38, 38]
                                                         256
BatchNorm2d-110
                          [-1, 128, 38, 38]
                                                           0
       ReLU-111
                          [-1, 128, 38, 38]
     Conv2d-112
                                                     147,456
                          [-1, 128, 38, 38]
BatchNorm2d-113
                                                         256
                          [-1, 128, 38, 38]
                                                            0
       ReLU-114
                          [-1, 512, 38, 38]
                                                     65,536
     Conv2d-115
                                                      1,024
                          [-1, 512, 38, 38]
BatchNorm2d-116
                          [-1, 512, 38, 38]
                                                            0
       ReLU-117
                          [-1, 512, 38, 38]
                                                            0
Bottleneck-118
                          [-1, 256, 38, 38]
     Conv2d-119
                                                     131,072
                          [-1, 256, 38, 38]
BatchNorm2d-120
                                                         512
                          [-1, 256, 38, 38]
      ReLU-121
                                                           0
     Conv2d-122
                          [-1, 256, 19, 19]
                                                     589,824
BatchNorm2d-123
                         [-1, 256, 19, 19]
                                                         512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-124
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-125
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-126
     Conv2d-127
                         [-1, 1024, 19, 19]
                                                     524,288
                        [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-128
                                                            0
       ReLU-129
                        [-1, 1024, 19, 19]
                        [-1, 1024, 19, 19]
                                                            0
Bottleneck-130
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-131
                          [-1, 256, 19, 19]
BatchNorm2d-132
                                                         512
      ReLU-133
                          [-1, 256, 19, 19]
                                                           0
     Conv2d-134
                          [-1, 256, 19, 19]
                                                     589,824
                         [-1, 256, 19, 19]
BatchNorm2d-135
                                                         512
      ReLU-136
                         [-1, 256, 19, 19]
                                                            0
     Conv2d-137
                         [-1, 1024, 19, 19]
                                                     262,144
                        [-1, 1024, 19, 19]
BatchNorm2d-138
                                                       2,048
                         [-1, 1024, 19, 19]
       ReLU-139
                                                            0
 Bottleneck-140
                         [-1, 1024, 19, 19]
                                                            0
     Conv2d-141
                         [-1, 256, 19, 19]
                                                     262,144
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-142
       ReLU-143
                         [-1, 256, 19, 19]
                                                            0
     Conv2d-144
                         [-1, 256, 19, 19]
                                                     589,824
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-145
                          [-1, 256, 19, 19]
                                                           0
       ReLU-146
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-147
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-148
                         [-1, 1024, 19, 19]
                                                            0
      ReLU-149
                                                            0
 Bottleneck-150
                         [-1, 1024, 19, 19]
     Conv2d-151
                         [-1, 256, 19, 19]
                                                     262,144
                          [-1, 256, 19, 19]
                                                         512
BatchNorm2d-152
                          [-1, 256, 19, 19]
       ReLU-153
                                                            0
                          [-1, 256, 19, 19]
                                                     589,824
     Conv2d-154
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-155
                                                            0
       ReLU-156
                         [-1, 256, 19, 19]
     Conv2d-157
                         [-1, 1024, 19, 19]
                                                     262,144
                                                       2,048
                         [-1, 1024, 19, 19]
BatchNorm2d-158
                         [-1, 1024, 19, 19]
       ReLU-159
                                                            0
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-160
                         [-1, 256, 19, 19]
     Conv2d-161
                                                     262,144
                         [-1, 256, 19, 19]
                                                         512
BatchNorm2d-162
                                                            0
                         [-1, 256, 19, 19]
       ReLU-163
                         [-1, 256, 19, 19]
                                                     589,824
     Conv2d-164
BatchNorm2d-165
                          [-1, 256, 19, 19]
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-166
                         [-1, 1024, 19, 19]
     Conv2d-167
                                                     262,144
```

```
2,048
BatchNorm2d-168
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-169
                         [-1, 1024, 19, 19]
 Bottleneck-170
                         [-1, 1024, 19, 19]
                                                            0
                          [-1, 256, 19, 19]
                                                     262,144
     Conv2d-171
                          [-1, 256, 19, 19]
                                                         512
BatchNorm2d-172
                          [-1, 256, 19, 19]
                                                            0
       ReLU-173
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-174
                          [-1, 256, 19, 19]
BatchNorm2d-175
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-176
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-177
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-178
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-179
                        [-1, 1024, 19, 19]
                                                            0
Bottleneck-180
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-181
                          [-1, 256, 19, 19]
BatchNorm2d-182
                                                         512
                          [-1, 256, 19, 19]
       ReLU-183
                                                            0
     Conv2d-184
                         [-1, 256, 19, 19]
                                                     589,824
                         [-1, 256, 19, 19]
                                                         512
BatchNorm2d-185
       ReLU-186
                         [-1, 256, 19, 19]
                                                            0
     Conv2d-187
                         [-1, 1024, 19, 19]
                                                     262,144
                         [-1, 1024, 19, 19]
BatchNorm2d-188
                                                        2,048
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-189
Bottleneck-190
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 256, 19, 19]
     Conv2d-191
                                                     262,144
                                                          512
BatchNorm2d-192
                         [-1, 256, 19, 19]
                                                            0
       ReLU-193
                         [-1, 256, 19, 19]
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-194
                          [-1, 256, 19, 19]
BatchNorm2d-195
                                                          512
       ReLU-196
                          [-1, 256, 19, 19]
                                                            0
     Conv2d-197
                         [-1, 1024, 19, 19]
                                                     262,144
                                                       2,048
BatchNorm2d-198
                         [-1, 1024, 19, 19]
       ReLU-199
                         [-1, 1024, 19, 19]
                                                            0
 Bottleneck-200
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 256, 19, 19]
     Conv2d-201
                                                     262,144
                          [-1, 256, 19, 19]
BatchNorm2d-202
                                                         512
       ReLU-203
                          [-1, 256, 19, 19]
                                                            0
     Conv2d-204
                          [-1, 256, 19, 19]
                                                     589,824
                         [-1, 256, 19, 19]
                                                          512
BatchNorm2d-205
       ReLU-206
                         [-1, 256, 19, 19]
                                                            0
     Conv2d-207
                         [-1, 1024, 19, 19]
                                                     262,144
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-208
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-209
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-210
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-211
                                                         512
                         [-1, 256, 19, 19]
BatchNorm2d-212
                                                            0
       ReLU-213
                         [-1, 256, 19, 19]
     Conv2d-214
                         [-1, 256, 19, 19]
                                                      589,824
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-215
                          [-1, 256, 19, 19]
       ReLU-216
                                                            0
                                                     262,144
                         [-1, 1024, 19, 19]
     Conv2d-217
                                                        2,048
                         [-1, 1024, 19, 19]
BatchNorm2d-218
                                                            0
       ReLU-219
                        [-1, 1024, 19, 19]
Bottleneck-220
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-221
                          [-1, 256, 19, 19]
                                                         512
BatchNorm2d-222
                          [-1, 256, 19, 19]
                                                            0
       ReLU-223
                          [-1, 256, 19, 19]
     Conv2d-224
                                                      589,824
                                                         512
                         [-1, 256, 19, 19]
BatchNorm2d-225
                                                            0
                         [-1, 256, 19, 19]
       ReLU-226
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-227
                                                       2,048
                         [-1, 1024, 19, 19]
BatchNorm2d-228
                         [-1, 1024, 19, 19]
       ReLU-229
                                                            0
                                                            0
 Bottleneck-230
                         [-1, 1024, 19, 19]
```

```
Conv2d-231
                          [-1, 256, 19, 19]
                                                     262,144
BatchNorm2d-232
                          [-1, 256, 19, 19]
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-233
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-234
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-235
                          [-1, 256, 19, 19]
                                                            0
       ReLU-236
                         [-1, 1024, 19, 19]
     Conv2d-237
                                                     262,144
                         [-1, 1024, 19, 19]
BatchNorm2d-238
                                                        2,048
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-239
                                                            0
Bottleneck-240
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-241
                         [-1, 256, 19, 19]
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-242
                          [-1, 256, 19, 19]
                                                            0
       ReLU-243
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-244
                          [-1, 256, 19, 19]
BatchNorm2d-245
                                                          512
                         [-1, 256, 19, 19]
       ReLU-246
                                                            0
                         [-1, 1024, 19, 19]
     Conv2d-247
                                                     262,144
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-248
       ReLU-249
                         [-1, 1024, 19, 19]
                                                            0
 Bottleneck-250
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 256, 19, 19]
                                                      262,144
     Conv2d-251
BatchNorm2d-252
                          [-1, 256, 19, 19]
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-253
                          [-1, 256, 19, 19]
                                                     589,824
     Conv2d-254
                                                          512
BatchNorm2d-255
                         [-1, 256, 19, 19]
                                                            0
       ReLU-256
                         [-1, 256, 19, 19]
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-257
                         [-1, 1024, 19, 19]
BatchNorm2d-258
                                                       2,048
      ReLU-259
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-260
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 256, 19, 19]
     Conv2d-261
                                                     262,144
BatchNorm2d-262
                         [-1, 256, 19, 19]
                                                          512
       ReLU-263
                         [-1, 256, 19, 19]
                                                            0
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-264
                          [-1, 256, 19, 19]
BatchNorm2d-265
                                                          512
       ReLU-266
                          [-1, 256, 19, 19]
                                                            0
     Conv2d-267
                         [-1, 1024, 19, 19]
                                                     262,144
                        [-1, 1024, 19, 19]
                                                        2,048
BatchNorm2d-268
       ReLU-269
                        [-1, 1024, 19, 19]
                                                            0
Bottleneck-270
                        [-1, 1024, 19, 19]
                                                            0
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-271
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-272
                          [-1, 256, 19, 19]
                                                            0
       ReLU-273
                          [-1, 256, 19, 19]
                                                     589,824
     Conv2d-274
                                                          512
BatchNorm2d-275
                          [-1, 256, 19, 19]
                                                            0
       ReLU-276
                          [-1, 256, 19, 19]
                         [-1, 1024, 19, 19]
     Conv2d-277
                                                     262,144
                         [-1, 1024, 19, 19]
                                                        2,048
BatchNorm2d-278
                         [-1, 1024, 19, 19]
       ReLU-279
                                                            0
                         [-1, 1024, 19, 19]
                                                            0
 Bottleneck-280
                         [-1, 256, 19, 19]
                                                      262,144
     Conv2d-281
                                                          512
BatchNorm2d-282
                          [-1, 256, 19, 19]
       ReLU-283
                         [-1, 256, 19, 19]
                                                            0
     Conv2d-284
                          [-1, 256, 19, 19]
                                                      589,824
                          [-1, 256, 19, 19]
BatchNorm2d-285
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-286
                         [-1, 1024, 19, 19]
     Conv2d-287
                                                     262,144
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-288
                                                            0
                         [-1, 1024, 19, 19]
       ReLU-289
                                                            0
 Bottleneck-290
                         [-1, 1024, 19, 19]
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-291
                          [-1, 256, 19, 19]
BatchNorm2d-292
                                                          512
                                                            0
       ReLU-293
                          [-1, 256, 19, 19]
```

```
Conv2d-294
                          [-1, 256, 19, 19]
                                                      589,824
BatchNorm2d-295
                          [-1, 256, 19, 19]
                                                          512
       ReLU-296
                          [-1, 256, 19, 19]
                                                            0
                         [-1, 1024, 19, 19]
                                                      262,144
     Conv2d-297
                         [-1, 1024, 19, 19]
                                                        2,048
BatchNorm2d-298
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-299
                         [-1, 1024, 19, 19]
                                                            0
 Bottleneck-300
                          [-1, 256, 19, 19]
     Conv2d-301
                                                      262,144
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-302
                          [-1, 256, 19, 19]
                                                            0
       ReLU-303
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-304
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-305
                          [-1, 256, 19, 19]
                                                            0
       ReLU-306
                         [-1, 1024, 19, 19]
                                                      262,144
     Conv2d-307
                         [-1, 1024, 19, 19]
BatchNorm2d-308
                                                       2,048
                         [-1, 1024, 19, 19]
       ReLU-309
                                                            0
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-310
                                                      262,144
                          [-1, 256, 19, 19]
     Conv2d-311
BatchNorm2d-312
                          [-1, 256, 19, 19]
                                                          512
                          [-1, 256, 19, 19]
       ReLU-313
                                                            0
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-314
BatchNorm2d-315
                          [-1, 256, 19, 19]
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-316
                         [-1, 1024, 19, 19]
     Conv2d-317
                                                     262,144
                                                        2,048
BatchNorm2d-318
                        [-1, 1024, 19, 19]
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-319
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-320
                          [-1, 256, 19, 19]
     Conv2d-321
                                                     262,144
BatchNorm2d-322
                          [-1, 256, 19, 19]
                                                          512
       ReLU-323
                          [-1, 256, 19, 19]
                                                            0
                          [-1, 256, 19, 19]
     Conv2d-324
                                                      589,824
BatchNorm2d-325
                          [-1, 256, 19, 19]
                                                          512
       ReLU-326
                          [-1, 256, 19, 19]
                                                            0
                         [-1, 1024, 19, 19]
                                                      262,144
     Conv2d-327
                         [-1, 1024, 19, 19]
BatchNorm2d-328
                                                        2,048
       ReLU-329
                         [-1, 1024, 19, 19]
                                                            0
 Bottleneck-330
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 256, 19, 19]
                                                      262,144
     Conv2d-331
BatchNorm2d-332
                          [-1, 256, 19, 19]
                                                          512
       ReLU-333
                          [-1, 256, 19, 19]
                                                            0
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-334
                          [-1, 256, 19, 19]
BatchNorm2d-335
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-336
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-337
                         [-1, 1024, 19, 19]
BatchNorm2d-338
                                                        2,048
                                                            0
      ReLU-339
                         [-1, 1024, 19, 19]
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-340
                         [-1, 256, 19, 19]
     Conv2d-341
                                                      262,144
                          [-1, 256, 19, 19]
BatchNorm2d-342
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-343
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-344
                                                          512
BatchNorm2d-345
                          [-1, 256, 19, 19]
       ReLU-346
                          [-1, 256, 19, 19]
                                                            0
     Conv2d-347
                         [-1, 1024, 19, 19]
                                                     262,144
                         [-1, 1024, 19, 19]
BatchNorm2d-348
                                                       2,048
                         [-1, 1024, 19, 19]
       ReLU-349
                                                            0
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-350
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-351
                                                          512
                          [-1, 256, 19, 19]
BatchNorm2d-352
                          [-1, 256, 19, 19]
                                                            0
       ReLU-353
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-354
                          [-1, 256, 19, 19]
BatchNorm2d-355
                                                          512
                                                            0
       ReLU-356
                          [-1, 256, 19, 19]
```

```
Conv2d-357
                         [-1, 1024, 19, 19]
                                                      262,144
                                                        2,048
BatchNorm2d-358
                         [-1, 1024, 19, 19]
       ReLU-359
                         [-1, 1024, 19, 19]
                                                            0
                                                            0
                         [-1, 1024, 19, 19]
 Bottleneck-360
                          [-1, 256, 19, 19]
                                                      262,144
     Conv2d-361
                          [-1, 256, 19, 19]
BatchNorm2d-362
                                                          512
                          [-1, 256, 19, 19]
       ReLU-363
                                                            0
                          [-1, 256, 19, 19]
     Conv2d-364
                                                      589,824
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-365
                          [-1, 256, 19, 19]
                                                            0
       ReLU-366
                         [-1, 1024, 19, 19]
                                                      262,144
     Conv2d-367
                                                        2,048
                         [-1, 1024, 19, 19]
BatchNorm2d-368
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-369
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-370
                          [-1, 256, 19, 19]
     Conv2d-371
                                                     262,144
                          [-1, 256, 19, 19]
BatchNorm2d-372
                                                          512
                          [-1, 256, 19, 19]
       ReLU-373
                                                            0
                          [-1, 256, 19, 19]
     Conv2d-374
                                                      589,824
                          [-1, 256, 19, 19]
BatchNorm2d-375
                                                          512
                          [-1, 256, 19, 19]
       ReLU-376
                                                            0
                         [-1, 1024, 19, 19]
                                                      262,144
     Conv2d-377
                         [-1, 1024, 19, 19]
                                                        2,048
BatchNorm2d-378
       ReLU-379
                         [-1, 1024, 19, 19]
                                                            0
                                                            0
                         [-1, 1024, 19, 19]
 Bottleneck-380
     Conv2d-381
                         [-1, 256, 19, 19]
                                                      262,144
                                                          512
BatchNorm2d-382
                          [-1, 256, 19, 19]
                          [-1, 256, 19, 19]
                                                            0
       ReLU-383
                          [-1, 256, 19, 19]
     Conv2d-384
                                                      589,824
BatchNorm2d-385
                          [-1, 256, 19, 19]
                                                          512
       ReLU-386
                          [-1, 256, 19, 19]
                                                            0
                         [-1, 1024, 19, 19]
     Conv2d-387
                                                     262,144
BatchNorm2d-388
                         [-1, 1024, 19, 19]
                                                        2,048
       ReLU-389
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-390
                         [-1, 1024, 19, 19]
                                                            0
                          [-1, 256, 19, 19]
     Conv2d-391
                                                      262,144
BatchNorm2d-392
                          [-1, 256, 19, 19]
                                                          512
       ReLU-393
                          [-1, 256, 19, 19]
                                                            0
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-394
BatchNorm2d-395
                          [-1, 256, 19, 19]
                                                          512
       ReLU-396
                          [-1, 256, 19, 19]
                                                            0
     Conv2d-397
                         [-1, 1024, 19, 19]
                                                     262,144
                         [-1, 1024, 19, 19]
BatchNorm2d-398
                                                       2,048
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-399
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-400
     Conv2d-401
                          [-1, 256, 19, 19]
                                                      262,144
BatchNorm2d-402
                          [-1, 256, 19, 19]
                                                          512
       ReLU-403
                          [-1, 256, 19, 19]
                                                            0
                          [-1, 256, 19, 19]
                                                      589,824
     Conv2d-404
                          [-1, 256, 19, 19]
BatchNorm2d-405
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-406
     Conv2d-407
                         [-1, 1024, 19, 19]
                                                      262,144
                                                        2,048
BatchNorm2d-408
                         [-1, 1024, 19, 19]
       ReLU-409
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-410
                          [-1, 256, 19, 19]
                                                     262,144
     Conv2d-411
                          [-1, 256, 19, 19]
BatchNorm2d-412
                                                          512
                          [-1, 256, 19, 19]
       ReLU-413
                                                            0
                                                      589,824
                          [-1, 256, 19, 19]
     Conv2d-414
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-415
                          [-1, 256, 19, 19]
                                                            0
       ReLU-416
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-417
                         [-1, 1024, 19, 19]
BatchNorm2d-418
                                                        2,048
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-419
```

```
Bottleneck-420
                         [-1, 1024, 19, 19]
     Conv2d-421
                          [-1, 256, 19, 19]
                                                     262,144
BatchNorm2d-422
                          [-1, 256, 19, 19]
                                                         512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-423
                          [-1, 256, 19, 19]
                                                     589,824
     Conv2d-424
                          [-1, 256, 19, 19]
BatchNorm2d-425
                                                          512
                          [-1, 256, 19, 19]
       ReLU-426
                                                            0
                         [-1, 1024, 19, 19]
     Conv2d-427
                                                     262,144
                         [-1, 1024, 19, 19]
BatchNorm2d-428
                                                       2,048
                                                            0
                         [-1, 1024, 19, 19]
       ReLU-429
                                                            0
                         [-1, 1024, 19, 19]
 Bottleneck-430
                         [-1, 256, 19, 19]
                                                     262,144
     Conv2d-431
                          [-1, 256, 19, 19]
                                                          512
BatchNorm2d-432
                          [-1, 256, 19, 19]
                                                            0
       ReLU-433
                          [-1, 256, 19, 19]
     Conv2d-434
                                                     589,824
                         [-1, 256, 19, 19]
BatchNorm2d-435
                                                          512
                         [-1, 256, 19, 19]
                                                            0
      ReLU-436
                                                     262,144
                         [-1, 1024, 19, 19]
     Conv2d-437
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-438
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-439
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-440
                          [-1, 256, 19, 19]
                                                     262,144
     Conv2d-441
BatchNorm2d-442
                          [-1, 256, 19, 19]
                                                          512
                         [-1, 256, 19, 19]
                                                            0
       ReLU-443
                                                     589,824
     Conv2d-444
                         [-1, 256, 19, 19]
                                                          512
BatchNorm2d-445
                         [-1, 256, 19, 19]
                         [-1, 256, 19, 19]
       ReLU-446
                                                            0
                         [-1, 1024, 19, 19]
     Conv2d-447
                                                     262,144
                         [-1, 1024, 19, 19]
BatchNorm2d-448
                                                       2,048
      ReLU-449
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-450
     Conv2d-451
                         [-1, 256, 19, 19]
                                                     262,144
BatchNorm2d-452
                         [-1, 256, 19, 19]
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReLU-453
                          [-1, 256, 19, 19]
     Conv2d-454
                                                     589,824
BatchNorm2d-455
                          [-1, 256, 19, 19]
                                                          512
       ReLU-456
                         [-1, 256, 19, 19]
                                                            0
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-457
BatchNorm2d-458
                        [-1, 1024, 19, 19]
                                                       2,048
       ReLU-459
                         [-1, 1024, 19, 19]
                                                            0
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-460
                          [-1, 256, 19, 19]
                                                     262,144
     Conv2d-461
                          [-1, 256, 19, 19]
BatchNorm2d-462
                                                         512
                         [-1, 256, 19, 19]
                                                            0
       ReLU-463
                         [-1, 256, 19, 19]
                                                     589,824
     Conv2d-464
BatchNorm2d-465
                         [-1, 256, 19, 19]
                                                         512
                          [-1, 256, 19, 19]
       ReLU-466
                                                            0
                         [-1, 1024, 19, 19]
     Conv2d-467
                                                     262,144
                         [-1, 1024, 19, 19]
BatchNorm2d-468
                                                       2,048
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-469
                         [-1, 1024, 19, 19]
                                                            0
Bottleneck-470
     Conv2d-471
                         [-1, 256, 19, 19]
                                                     262,144
BatchNorm2d-472
                         [-1, 256, 19, 19]
                                                          512
                          [-1, 256, 19, 19]
                                                            0
       ReIJI-473
                          [-1, 256, 19, 19]
                                                     589,824
     Conv2d-474
                          [-1, 256, 19, 19]
BatchNorm2d-475
                                                         512
                         [-1, 256, 19, 19]
       ReLU-476
                                                            0
                         [-1, 1024, 19, 19]
                                                     262,144
     Conv2d-477
                                                       2,048
                         [-1, 1024, 19, 19]
BatchNorm2d-478
                         [-1, 1024, 19, 19]
                                                            0
       ReLU-479
                         [-1, 1024, 19, 19]
                                                            0
 Bottleneck-480
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-481
BatchNorm2d-482
                          [-1, 512, 19, 19]
                                                       1,024
```

```
[-1, 512, 19, 19]
             ReLU-483
                              [-1, 512, 10, 10]
                                                      2,359,296
          Conv2d-484
      BatchNorm2d-485
                              [-1, 512, 10, 10]
                                                         1,024
            ReLU-486
                              [-1, 512, 10, 10]
                                                               0
           Conv2d-487
                             [-1, 2048, 10, 10]
                                                       1,048,576
                             [-1, 2048, 10, 10]
      BatchNorm2d-488
                                                        4,096
                             [-1, 2048, 10, 10]
                                                       2,097,152
           Conv2d-489
                             [-1, 2048, 10, 10]
      BatchNorm2d-490
                                                         4,096
                             [-1, 2048, 10, 10]
                                                               0
             ReLU-491
                             [-1, 2048, 10, 10]
                                                               0
      Bottleneck-492
                              [-1, 512, 10, 10]
                                                      1,048,576
           Conv2d-493
                                                        1,024
      BatchNorm2d-494
                              [-1, 512, 10, 10]
                              [-1, 512, 10, 10]
            ReLU-495
                                                              0
                              [-1, 512, 10, 10]
                                                       2,359,296
           Conv2d-496
                              [-1, 512, 10, 10]
     BatchNorm2d-497
                                                        1,024
                              [-1, 512, 10, 10]
            ReLU-498
                                                               0
                            [-1, 2048, 10, 10]
                                                      1,048,576
           Conv2d-499
                                                         4,096
                             [-1, 2048, 10, 10]
     BatchNorm2d-500
            ReLU-501
                             [-1, 2048, 10, 10]
                                                               0
      Bottleneck-502
                             [-1, 2048, 10, 10]
                                                               0
                              [-1, 512, 10, 10]
                                                       1,048,576
           Conv2d-503
                                                         1,024
                              [-1, 512, 10, 10]
      BatchNorm2d-504
                              [-1, 512, 10, 10]
            ReLU-505
                                                               0
                                                      2,359,296
                              [-1, 512, 10, 10]
           Conv2d-506
                                                        1,024
     BatchNorm2d-507
                              [-1, 512, 10, 10]
                              [-1, 512, 10, 10]
                                                               0
             ReLU-508
           Conv2d-509
                            [-1, 2048, 10, 10]
                                                      1,048,576
                             [-1, 2048, 10, 10]
     BatchNorm2d-510
                                                         4,096
                             [-1, 2048, 10, 10]
            ReLU-511
                                                               0
                                                               0
      Bottleneck-512
                            [-1, 2048, 10, 10]
                                                               0
AdaptiveAvgPool2d-513
                              [-1, 2048, 1, 1]
         Linear-514
                                     [-1, 1000]
                                                     2,049,000
                                        Total params: 60,192,808
                                    Trainable params: 60,192,808
                                        Non-trainable params: 0
                                           Input size (MB): 1.03
```

Forward/backward pass size (MB): 1113.07

Estimated Total Size (MB): 1343.71

Params size (MB): 229.62

WRN:

 Layer (type)	Output Shape	Param #
 Conv2d-1	[-1, 64, 150, 150]	9,408
BatchNorm2d-2	[-1, 64, 150, 150]	128
ReLU-3	[-1, 64, 150, 150]	0
MaxPool2d-4	[-1, 64, 75, 75]	0
Conv2d-5	[-1, 128, 75, 75]	8,192
BatchNorm2d-6	[-1, 128, 75, 75]	256
ReLU-7	[-1, 128, 75, 75]	0
Conv2d-8	[-1, 128, 75, 75]	147,456
BatchNorm2d-9	[-1, 128, 75, 75]	256
ReLU-10	[-1, 128, 75, 75]	0
Conv2d-11	[-1, 256, 75, 75]	32,768
BatchNorm2d-12	[-1, 256, 75, 75]	512
Conv2d-13	[-1, 256, 75, 75]	16,384
BatchNorm2d-14	[-1, 256, 75, 75]	512
ReLU-15 Bottleneck-16	[-1, 256, 75, 75]	0
Conv2d-17	[-1, 256, 75, 75] [-1, 128, 75, 75]	32 , 768
BatchNorm2d-18	[-1, 128, 75, 75]	256
ReLU-19	[-1, 128, 75, 75]	0
Conv2d-20	[-1, 128, 75, 75]	147,456
BatchNorm2d-21	[-1, 128, 75, 75]	256
ReLU-22	[-1, 128, 75, 75]	0
Conv2d-23	[-1, 256, 75, 75]	32 , 768
BatchNorm2d-24	[-1, 256, 75, 75]	512
ReLU-25	[-1, 256, 75, 75]	0
Bottleneck-26	[-1, 256, 75, 75]	0
Conv2d-27	[-1, 128, 75, 75]	32 , 768
BatchNorm2d-28	[-1, 128, 75, 75]	256
ReLU-29	[-1, 128, 75, 75]	0
Conv2d-30	[-1, 128, 75, 75]	147,456
BatchNorm2d-31	[-1, 128, 75, 75]	256
ReLU-32	[-1, 128, 75, 75]	0
Conv2d-33	[-1, 256, 75, 75]	32 , 768
BatchNorm2d-34	[-1 , 256, 75, 75]	512
ReLU-35	[-1, 256, 75, 75]	0
Bottleneck-36	[-1, 256, 75, 75]	0
Conv2d-37	[-1, 256, 75, 75]	65 , 536
BatchNorm2d-38	[-1, 256, 75, 75]	512
ReLU-39	[-1, 256, 75, 75]	0
Conv2d-40	[-1, 256, 38, 38]	589 , 824
BatchNorm2d-41	[-1, 256, 38, 38]	512
ReLU-42	[-1, 256, 38, 38]	0
Conv2d-43	[-1, 512, 38, 38]	131,072
BatchNorm2d-44	[-1, 512, 38, 38]	1,024
Conv2d-45	[-1, 512, 38, 38]	131,072
BatchNorm2d-46	[-1, 512, 38, 38]	1,024
ReLU-47	[-1, 512, 38, 38]	0
Bottleneck-48	[-1, 512, 38, 38]	0
Conv2d-49	[-1, 256, 38, 38]	131,072
BatchNorm2d-50	[-1, 256, 38, 38]	512
ReLU-51	[-1, 256, 38, 38]	500 024
Conv2d-52	[-1, 256, 38, 38]	589 , 824
BatchNorm2d-53 ReLU-54	[-1, 256, 38, 38] [-1, 256, 38, 38]	512 0
Conv2d-55	[-1, 256, 38, 38]	131,072
BatchNorm2d-56	[-1, 512, 36, 36] [-1, 512, 38, 38]	1,024
ReLU-57	[-1, 512, 38, 38]	1,024
Bottleneck-58	[-1, 512, 38, 38]	0
DOCCICIOCK JO	[1, 312, 30, 30]	0

```
Conv2d-59
                          [-1, 256, 38, 38]
                                                     131,072
                          [-1, 256, 38, 38]
 BatchNorm2d-60
                                                         512
                          [-1, 256, 38, 38]
                                                           0
        ReLU-61
                         [-1, 256, 38, 38]
                                                     589,824
      Conv2d-62
                         [-1, 256, 38, 38]
                                                         512
 BatchNorm2d-63
                         [-1, 256, 38, 38]
                                                           0
        ReLU-64
                          [-1, 512, 38, 38]
                                                     131,072
      Conv2d-65
                          [-1, 512, 38, 38]
 BatchNorm2d-66
                                                       1,024
                         [-1, 512, 38, 38]
                                                           0
        ReLU-67
                                                           0
                         [-1, 512, 38, 38]
 Bottleneck-68
                                                     131,072
                         [-1, 256, 38, 38]
      Conv2d-69
                         [-1, 256, 38, 38]
                                                         512
 BatchNorm2d-70
                         [-1, 256, 38, 38]
                                                           0
        ReLU-71
                         [-1, 256, 38, 38]
                                                     589,824
      Conv2d-72
                         [-1, 256, 38, 38]
 BatchNorm2d-73
                                                         512
                         [-1, 256, 38, 38]
        ReLU-74
                                                           0
                         [-1, 512, 38, 38]
                                                     131,072
      Conv2d-75
                         [-1, 512, 38, 38]
                                                      1,024
 BatchNorm2d-76
        ReLU-77
                         [-1, 512, 38, 38]
                                                           0
                         [-1, 512, 38, 38]
                                                           0
 Bottleneck-78
                         [-1, 512, 38, 38]
      Conv2d-79
                                                     262,144
                          [-1, 512, 38, 38]
 BatchNorm2d-80
                                                       1,024
                         [-1, 512, 38, 38]
                                                           0
        ReLU-81
                         [-1, 512, 19, 19]
                                                   2,359,296
      Conv2d-82
 BatchNorm2d-83
                         [-1, 512, 19, 19]
                                                     1,024
                         [-1, 512, 19, 19]
                                                           0
        ReLU-84
                        [-1, 1024, 19, 19]
                                                    524,288
      Conv2d-85
                         [-1, 1024, 19, 19]
 BatchNorm2d-86
                                                       2,048
                         [-1, 1024, 19, 19]
     Conv2d-87
                                                     524,288
                                                      2,048
 BatchNorm2d-88
                        [-1, 1024, 19, 19]
       ReLU-89
                        [-1, 1024, 19, 19]
                                                           0
                                                           0
 Bottleneck-90
                        [-1, 1024, 19, 19]
      Conv2d-91
                         [-1, 512, 19, 19]
                                                     524,288
 BatchNorm2d-92
                         [-1, 512, 19, 19]
                                                       1,024
                         [-1, 512, 19, 19]
        ReLU-93
                                                           0
      Conv2d-94
                         [-1, 512, 19, 19]
                                                   2,359,296
                                                      1,024
 BatchNorm2d-95
                         [-1, 512, 19, 19]
                         [-1, 512, 19, 19]
                                                           0
        ReLU-96
      Conv2d-97
                        [-1, 1024, 19, 19]
                                                    524,288
BatchNorm2d-98
                        [-1, 1024, 19, 19]
                                                       2,048
                        [-1, 1024, 19, 19]
                                                           0
        ReLU-99
                        [-1, 1024, 19, 19]
                                                           0
 Bottleneck-100
                         [-1, 512, 19, 19]
                                                    524,288
     Conv2d-101
                         [-1, 512, 19, 19]
BatchNorm2d-102
                                                      1,024
                         [-1, 512, 19, 19]
                                                           0
      ReLU-103
     Conv2d-104
                         [-1, 512, 19, 19]
                                                   2,359,296
                         [-1, 512, 19, 19]
BatchNorm2d-105
                                                       1,024
                         [-1, 512, 19, 19]
       ReLU-106
                                                           0
                         [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-107
                        [-1, 1024, 19, 19]
BatchNorm2d-108
                                                       2,048
                        [-1, 1024, 19, 19]
                                                           0
       ReLU-109
                                                           0
 Bottleneck-110
                        [-1, 1024, 19, 19]
     Conv2d-111
                         [-1, 512, 19, 19]
                                                     524,288
                                                       1,024
                         [-1, 512, 19, 19]
BatchNorm2d-112
                         [-1, 512, 19, 19]
                                                           0
       ReLU-113
                         [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-114
                         [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-115
                         [-1, 512, 19, 19]
                                                           0
       ReLU-116
                        [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-117
                        [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-118
                        [-1, 1024, 19, 19]
                                                           0
       ReLU-119
                         [-1, 1024, 19, 19]
                                                           0
 Bottleneck-120
                         [-1, 512, 19, 19]
     Conv2d-121
                                                     524,288
```

```
BatchNorm2d-122
                          [-1, 512, 19, 19]
                                                       1,024
       ReLU-123
                          [-1, 512, 19, 19]
                                                           0
     Conv2d-124
                          [-1, 512, 19, 19]
                                                   2,359,296
                          [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-125
                          [-1, 512, 19, 19]
                                                           0
       ReLU-126
                         [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-127
                         [-1, 1024, 19, 19]
BatchNorm2d-128
                                                       2,048
                         [-1, 1024, 19, 19]
       ReLU-129
                                                           0
                         [-1, 1024, 19, 19]
                                                           0
 Bottleneck-130
                                                     524,288
                         [-1, 512, 19, 19]
     Conv2d-131
                                                       1,024
BatchNorm2d-132
                          [-1, 512, 19, 19]
                          [-1, 512, 19, 19]
                                                           0
       ReLU-133
     Conv2d-134
                          [-1, 512, 19, 19]
                                                   2,359,296
                          [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-135
                          [-1, 512, 19, 19]
       ReLU-136
                                                           0
                                                     524,288
                         [-1, 1024, 19, 19]
     Conv2d-137
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-138
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-139
                         [-1, 1024, 19, 19]
Bottleneck-140
                                                           0
                                                     524,288
                         [-1, 512, 19, 19]
     Conv2d-141
                          [-1, 512, 19, 19]
BatchNorm2d-142
                                                       1,024
                          [-1, 512, 19, 19]
                                                           0
       ReLU-143
                                                   2,359,296
     Conv2d-144
                          [-1, 512, 19, 19]
                                                      1,024
                         [-1, 512, 19, 19]
BatchNorm2d-145
                                                           0
       ReLU-146
                         [-1, 512, 19, 19]
                        [-1, 1024, 19, 19]
                                                    524,288
     Conv2d-147
                         [-1, 1024, 19, 19]
BatchNorm2d-148
                                                       2,048
                         [-1, 1024, 19, 19]
       ReLU-149
                                                           0
                         [-1, 1024, 19, 19]
 Bottleneck-150
                                                           0
     Conv2d-151
                         [-1, 512, 19, 19]
                                                     524,288
                         [-1, 512, 19, 19]
                                                       1,024
BatchNorm2d-152
      ReLU-153
                         [-1, 512, 19, 19]
                                                           0
     Conv2d-154
                         [-1, 512, 19, 19]
                                                   2,359,296
                          [-1, 512, 19, 19]
                                                       1,024
BatchNorm2d-155
                          [-1, 512, 19, 19]
       ReLU-156
                                                           0
     Conv2d-157
                         [-1, 1024, 19, 19]
                                                     524,288
                                                       2,048
BatchNorm2d-158
                         [-1, 1024, 19, 19]
                        [-1, 1024, 19, 19]
                                                           0
       ReLU-159
 Bottleneck-160
                         [-1, 1024, 19, 19]
                                                           0
     Conv2d-161
                         [-1, 512, 19, 19]
                                                     524,288
                          [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-162
                          [-1, 512, 19, 19]
                                                           0
       ReLU-163
                          [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-164
                          [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-165
                         [-1, 512, 19, 19]
                                                           0
       ReLU-166
     Conv2d-167
                         [-1, 1024, 19, 19]
                                                     524,288
                         [-1, 1024, 19, 19]
BatchNorm2d-168
                                                       2,048
                         [-1, 1024, 19, 19]
       ReLU-169
                                                           0
                         [-1, 1024, 19, 19]
 Bottleneck-170
                                                           0
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-171
                                                       1,024
BatchNorm2d-172
                          [-1, 512, 19, 19]
                                                           0
       ReLU-173
                         [-1, 512, 19, 19]
     Conv2d-174
                          [-1, 512, 19, 19]
                                                   2,359,296
                                                      1,024
BatchNorm2d-175
                          [-1, 512, 19, 19]
                          [-1, 512, 19, 19]
                                                           0
       ReLU-176
                         [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-177
                         [-1, 1024, 19, 19]
BatchNorm2d-178
                                                       2,048
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-179
                                                           0
                         [-1, 1024, 19, 19]
 Bottleneck-180
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-181
                          [-1, 512, 19, 19]
                                                       1,024
BatchNorm2d-182
                          [-1, 512, 19, 19]
                                                           0
       ReLU-183
                                                   2,359,296
     Conv2d-184
                          [-1, 512, 19, 19]
```

```
1,024
BatchNorm2d-185
                          [-1, 512, 19, 19]
                         [-1, 512, 19, 19]
                                                           0
       ReLU-186
                                                     524,288
     Conv2d-187
                         [-1, 1024, 19, 19]
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-188
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-189
                         [-1, 1024, 19, 19]
                                                           0
 Bottleneck-190
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-191
                          [-1, 512, 19, 19]
                                                       1,024
BatchNorm2d-192
                          [-1, 512, 19, 19]
                                                           0
       ReLU-193
                                                   2,359,296
     Conv2d-194
                         [-1, 512, 19, 19]
                                                     1,024
BatchNorm2d-195
                         [-1, 512, 19, 19]
                         [-1, 512, 19, 19]
                                                           0
       ReLU-196
                                                    524,288
     Conv2d-197
                        [-1, 1024, 19, 19]
                         [-1, 1024, 19, 19]
BatchNorm2d-198
                                                      2,048
                         [-1, 1024, 19, 19]
       ReLU-199
                                                           0
                        [-1, 1024, 19, 19]
                                                           0
 Bottleneck-200
                         [-1, 512, 19, 19]
     Conv2d-201
                                                     524,288
                                                       1,024
                         [-1, 512, 19, 19]
BatchNorm2d-202
       ReLU-203
                         [-1, 512, 19, 19]
                                                           0
     Conv2d-204
                         [-1, 512, 19, 19]
                                                   2,359,296
                          [-1, 512, 19, 19]
BatchNorm2d-205
                                                       1,024
                          [-1, 512, 19, 19]
                                                           0
       ReLU-206
                                                     524,288
     Conv2d-207
                         [-1, 1024, 19, 19]
                        [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-208
                                                           0
       ReLU-209
                        [-1, 1024, 19, 19]
                        [-1, 1024, 19, 19]
                                                           0
 Bottleneck-210
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-211
                          [-1, 512, 19, 19]
BatchNorm2d-212
                                                       1,024
                         [-1, 512, 19, 19]
       ReLU-213
                                                           0
     Conv2d-214
                         [-1, 512, 19, 19]
                                                   2,359,296
                         [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-215
      ReLU-216
                         [-1, 512, 19, 19]
                                                           0
     Conv2d-217
                        [-1, 1024, 19, 19]
                                                     524,288
                        [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-218
                         [-1, 1024, 19, 19]
       ReLU-219
                                                           0
 Bottleneck-220
                         [-1, 1024, 19, 19]
                                                           0
     Conv2d-221
                         [-1, 512, 19, 19]
                                                     524,288
                                                       1,024
                         [-1, 512, 19, 19]
BatchNorm2d-222
       ReLU-223
                         [-1, 512, 19, 19]
                                                           0
     Conv2d-224
                         [-1, 512, 19, 19]
                                                   2,359,296
                         [-1, 512, 19, 19]
                                                     1,024
BatchNorm2d-225
                         [-1, 512, 19, 19]
                                                           0
       ReLU-226
                         [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-227
                         [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-228
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-229
                                                           0
 Bottleneck-230
                         [-1, 1024, 19, 19]
     Conv2d-231
                         [-1, 512, 19, 19]
                                                     524,288
                          [-1, 512, 19, 19]
                                                       1,024
BatchNorm2d-232
                          [-1, 512, 19, 19]
       ReLU-233
                                                           0
                          [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-234
                                                       1,024
                         [-1, 512, 19, 19]
BatchNorm2d-235
                                                           0
       ReLU-236
                         [-1, 512, 19, 19]
     Conv2d-237
                         [-1, 1024, 19, 19]
                                                     524,288
                                                       2,048
BatchNorm2d-238
                        [-1, 1024, 19, 19]
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-239
                         [-1, 1024, 19, 19]
                                                           0
 Bottleneck-240
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-241
                         [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-242
                                                           0
                         [-1, 512, 19, 19]
       ReLU-243
                         [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-244
BatchNorm2d-245
                         [-1, 512, 19, 19]
                                                       1,024
                          [-1, 512, 19, 19]
                                                           0
       ReLU-246
                         [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-247
```

```
2,048
BatchNorm2d-248
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-249
                         [-1, 1024, 19, 19]
 Bottleneck-250
                         [-1, 1024, 19, 19]
                                                           0
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-251
                                                       1,024
                         [-1, 512, 19, 19]
BatchNorm2d-252
                         [-1, 512, 19, 19]
                                                           0
       ReLU-253
                          [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-254
                          [-1, 512, 19, 19]
                                                       1,024
BatchNorm2d-255
                         [-1, 512, 19, 19]
                                                           0
       ReLU-256
                                                     524,288
                         [-1, 1024, 19, 19]
     Conv2d-257
                        [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-258
                        [-1, 1024, 19, 19]
                                                           0
       ReLU-259
                        [-1, 1024, 19, 19]
                                                           0
Bottleneck-260
                         [-1, 512, 19, 19]
     Conv2d-261
                                                     524,288
                         [-1, 512, 19, 19]
BatchNorm2d-262
                                                      1,024
                         [-1, 512, 19, 19]
       ReLU-263
                                                           0
     Conv2d-264
                                                   2,359,296
                         [-1, 512, 19, 19]
                         [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-265
       ReLU-266
                         [-1, 512, 19, 19]
                                                           0
     Conv2d-267
                        [-1, 1024, 19, 19]
                                                     524,288
                        [-1, 1024, 19, 19]
BatchNorm2d-268
                                                       2,048
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-269
                                                           0
Bottleneck-270
                        [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-271
                         [-1, 512, 19, 19]
                                                       1,024
BatchNorm2d-272
                         [-1, 512, 19, 19]
                         [-1, 512, 19, 19]
                                                           0
       ReLU-273
                         [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-274
                          [-1, 512, 19, 19]
BatchNorm2d-275
                                                      1,024
       ReLU-276
                         [-1, 512, 19, 19]
                                                           0
     Conv2d-277
                        [-1, 1024, 19, 19]
                                                     524,288
                                                       2,048
BatchNorm2d-278
                        [-1, 1024, 19, 19]
      ReLU-279
                        [-1, 1024, 19, 19]
                                                           0
 Bottleneck-280
                        [-1, 1024, 19, 19]
                                                           0
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-281
                          [-1, 512, 19, 19]
BatchNorm2d-282
                                                       1,024
       ReLU-283
                          [-1, 512, 19, 19]
                                                           0
     Conv2d-284
                         [-1, 512, 19, 19]
                                                   2,359,296
                         [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-285
       ReLU-286
                         [-1, 512, 19, 19]
                                                           0
     Conv2d-287
                        [-1, 1024, 19, 19]
                                                     524,288
                        [-1, 1024, 19, 19]
                                                       2,048
BatchNorm2d-288
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-289
                        [-1, 1024, 19, 19]
                                                           0
Bottleneck-290
                         [-1, 512, 19, 19]
                                                     524,288
     Conv2d-291
BatchNorm2d-292
                         [-1, 512, 19, 19]
                                                       1,024
                                                           0
       ReLU-293
                         [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-294
                         [-1, 512, 19, 19]
                         [-1, 512, 19, 19]
BatchNorm2d-295
                                                       1,024
                          [-1, 512, 19, 19]
       ReLU-296
                                                           0
                         [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-297
                                                       2,048
                        [-1, 1024, 19, 19]
BatchNorm2d-298
                                                           0
       ReLU-299
                        [-1, 1024, 19, 19]
Bottleneck-300
                        [-1, 1024, 19, 19]
                                                           0
     Conv2d-301
                         [-1, 512, 19, 19]
                                                     524,288
                          [-1, 512, 19, 19]
BatchNorm2d-302
                                                       1,024
                          [-1, 512, 19, 19]
                                                           0
       ReLU-303
                         [-1, 512, 19, 19]
                                                   2,359,296
     Conv2d-304
                         [-1, 512, 19, 19]
                                                      1,024
BatchNorm2d-305
                                                           0
                         [-1, 512, 19, 19]
       ReLU-306
                         [-1, 1024, 19, 19]
                                                     524,288
     Conv2d-307
                                                       2,048
                        [-1, 1024, 19, 19]
BatchNorm2d-308
                         [-1, 1024, 19, 19]
                                                           0
       ReLU-309
                         [-1, 1024, 19, 19]
                                                           0
 Bottleneck-310
```

```
[-1, 1024, 19, 19]
                                                     1,048,576
          Conv2d-311
                             [-1, 1024, 19, 19]
     BatchNorm2d-312
                                                       2,048
            ReLU-313
                            [-1, 1024, 19, 19]
                                                            Ω
                                                     9,437,184
          Conv2d-314
                            [-1, 1024, 10, 10]
     BatchNorm2d-315
                            [-1, 1024, 10, 10]
                                                       2,048
            ReLU-316
                            [-1, 1024, 10, 10]
                                                            0
                            [-1, 2048, 10, 10]
                                                     2,097,152
          Conv2d-317
                            [-1, 2048, 10, 10]
     BatchNorm2d-318
                                                       4,096
                            [-1, 2048, 10, 10]
                                                     2,097,152
          Conv2d-319
                            [-1, 2048, 10, 10]
                                                       4,096
     BatchNorm2d-320
                                                            0
                            [-1, 2048, 10, 10]
            ReLU-321
      Bottleneck-322
                            [-1, 2048, 10, 10]
                                                             0
                            [-1, 1024, 10, 10]
                                                     2,097,152
          Conv2d-323
                            [-1, 1024, 10, 10]
                                                      2,048
     BatchNorm2d-324
                            [-1, 1024, 10, 10]
           ReLU-325
                                                            0
                            [-1, 1024, 10, 10]
                                                     9,437,184
          Conv2d-326
                                                      2,048
                            [-1, 1024, 10, 10]
     BatchNorm2d-327
                            [-1, 1024, 10, 10]
            ReLU-328
                                                            0
          Conv2d-329
                            [-1, 2048, 10, 10]
                                                     2,097,152
                                                       4,096
     BatchNorm2d-330
                            [-1, 2048, 10, 10]
                            [-1, 2048, 10, 10]
                                                            0
            ReLU-331
                            [-1, 2048, 10, 10]
      Bottleneck-332
                                                            0
                            [-1, 1024, 10, 10]
                                                     2,097,152
          Conv2d-333
                                                      2,048
                            [-1, 1024, 10, 10]
     BatchNorm2d-334
                            [-1, 1024, 10, 10]
            ReLU-335
                                                            0
          Conv2d-336
                            [-1, 1024, 10, 10]
                                                    9,437,184
                            [-1, 1024, 10, 10]
                                                      2,048
     BatchNorm2d-337
                            [-1, 1024, 10, 10]
            ReLU-338
                                                            0
                            [-1, 2048, 10, 10]
                                                     2,097,152
          Conv2d-339
                            [-1, 2048, 10, 10]
                                                       4,096
     BatchNorm2d-340
                            [-1, 2048, 10, 10]
            ReLU-341
                                                            0
                                                             0
      Bottleneck-342
                           [-1, 2048, 10, 10]
AdaptiveAvgPool2d-343
                             [-1, 2048, 1, 1]
                                                             0
          Linear-344
                                    [-1, 1000]
                                                     2,049,000
______
                                     Total params: 126,886,696
                                  Trainable params: 126,886,696
                                       Non-trainable params: 0
```

Input size (MB): 1.03

Forward/backward pass size (MB): 996.59

Params size (MB): 484.03

Estimated Total Size (MB): 1481.65

Inception_v3:

Param #	Output Shape	Layer (type)
864	[-1, 32, 149, 149]	 Conv2d-1
64	[-1, 32, 149, 149]	BatchNorm2d-2
0	[-1, 32, 149, 149]	BasicConv2d-3
9,216	[-1, 32, 147, 147]	Conv2d-4
64	[-1, 32, 147, 147]	BatchNorm2d-5
0	[-1, 32, 147, 147]	BasicConv2d-6
18,432	[-1, 64, 147, 147]	Conv2d-7
128	[-1, 64, 147, 147]	BatchNorm2d-8
0	[-1, 64, 147, 147]	BasicConv2d-9
0	[-1, 64, 73, 73]	MaxPool2d-10
5,120	[-1, 80, 73, 73]	Conv2d-11
160	[-1, 80, 73, 73]	BatchNorm2d-12
0	[-1, 80, 73, 73]	BasicConv2d-13
138,240	[-1, 192, 71, 71]	Conv2d-14
384	[-1, 192, 71, 71]	BatchNorm2d-15
0	[-1, 192, 71, 71]	BasicConv2d-16
0	[-1 , 192, 35, 35]	MaxPool2d-17
12,288	[-1, 64, 35, 35]	Conv2d-18
128	[-1, 64, 35, 35]	BatchNorm2d-19
0	[-1, 64, 35, 35]	BasicConv2d-20
9,216	[-1, 48, 35, 35]	Conv2d-21
96	[-1, 48, 35, 35]	BatchNorm2d-22
0	[-1, 48, 35, 35]	BasicConv2d-23
76,800	[-1, 64, 35, 35]	Conv2d-24
128	[-1, 64, 35, 35]	BatchNorm2d-25
0	[-1, 64, 35, 35]	BasicConv2d-26
12,288	[-1, 64, 35, 35]	Conv2d-27
128	[-1, 64, 35, 35]	BatchNorm2d-28
0	[-1, 64, 35, 35]	BasicConv2d-29
55 , 296	[-1, 96, 35, 35]	Conv2d-30
192	[-1, 96, 35, 35]	BatchNorm2d-31
0	[-1, 96, 35, 35]	BasicConv2d-32
82,944	[-1, 96, 35, 35]	Conv2d-33
192	[-1, 96, 35, 35]	BatchNorm2d-34
0	[-1, 96, 35, 35]	BasicConv2d-35
6,144	[-1, 32, 35, 35]	Conv2d-36
64	[-1, 32, 35, 35]	BatchNorm2d-37
0	[-1, 32, 35, 35]	BasicConv2d-38
0	[-1, 256, 35, 35]	InceptionA-39
16,384	[-1, 230, 33, 33]	Conv2d-40
10,304	[-1, 64, 35, 35]	BatchNorm2d-41
0	[-1, 64, 35, 35]	BasicConv2d-42
12,288	[-1, 48, 35, 35]	Conv2d-43
96	[-1, 48, 35, 35]	BatchNorm2d-44
76.000	[-1, 48, 35, 35]	BasicConv2d-45
76,800	[-1, 64, 35, 35]	Conv2d-46
128	[-1, 64, 35, 35]	BatchNorm2d-47
0	[-1, 64, 35, 35]	BasicConv2d-48
16,384	[-1, 64, 35, 35]	Conv2d-49
128	[-1, 64, 35, 35]	BatchNorm2d-50
0	[-1, 64, 35, 35]	BasicConv2d-51
55,296	[-1, 96, 35, 35]	Conv2d-52
192	[-1, 96, 35, 35]	BatchNorm2d-53
0	[-1, 96, 35, 35]	BasicConv2d-54
82 , 944	[-1, 96, 35, 35]	Conv2d-55
192	[-1, 96, 35, 35]	BatchNorm2d-56
	[-1, 96, 35, 35]	BasicConv2d-57
0 16 , 384	[-1, 64, 35, 35]	

BatchNorm2d-59	[-1, 64, 35, 35] 128
BasicConv2d-60	[-1, 64, 35, 35]
InceptionA-61	[-1, 288, 35, 35]
Conv2d-62	[-1, 64, 35, 35] 18,432
BatchNorm2d-63	[-1, 64, 35, 35]
BasicConv2d-64	[-1, 64, 35, 35]
Conv2d-65	[-1, 48, 35, 35] 13,824
BatchNorm2d-66	
	2 , , , ,
BasicConv2d-67	[-1, 48, 35, 35] 0
Conv2d-68	[-1, 64, 35, 35] 76,800
BatchNorm2d-69	[-1, 64, 35, 35] 128
BasicConv2d-70	[-1, 64, 35, 35] 0
Conv2d-71	[-1, 64, 35, 35] 18,432
BatchNorm2d-72	[-1, 64, 35, 35] 128
BasicConv2d-73	[-1, 64, 35, 35]
Conv2d-74	[-1, 96, 35, 35] 55,296
BatchNorm2d-75	[-1, 96, 35, 35] 192
BasicConv2d-76	[-1, 96, 35, 35]
Conv2d-77	[-1, 96, 35, 35] 82,944
BatchNorm2d-78	[-1, 96, 35, 35] 192
BasicConv2d-79	[-1, 96, 35, 35]
Conv2d-80	[-1, 64, 35, 35] 18,432
BatchNorm2d-81	[-1, 64, 35, 35] 128
BasicConv2d-82	[-1, 64, 35, 35]
InceptionA-83	[-1, 288, 35, 35]
Conv2d-84	[-1, 384, 17, 17] 995,328
BatchNorm2d-85	[-1, 384, 17, 17]
BasicConv2d-86	[-1, 384, 17, 17]
Conv2d-87	[-1, 64, 35, 35] 18,432
BatchNorm2d-88	[-1, 64, 35, 35] 128
BasicConv2d-89	[-1, 64, 35, 35]
Conv2d-90	[-1, 94, 35, 35] 55,296
BatchNorm2d-91	
BasicConv2d-92	[-1, 96, 35, 35] 0
Conv2d-93	[-1, 96, 17, 17] 82,944
BatchNorm2d-94	[-1, 96, 17, 17]
BasicConv2d-95	[-1, 96, 17, 17]
InceptionB-96	[-1, 768, 17, 17] 0
Conv2d-97	[-1, 192, 17, 17] 147,456
BatchNorm2d-98	[-1, 192, 17, 17] 384
BasicConv2d-99	[-1, 192, 17, 17]
Conv2d-100	[-1, 128, 17, 17] 98,304
BatchNorm2d-101	[-1, 128, 17, 17] 256
BasicConv2d-102	[-1, 128, 17, 17] 0
Conv2d-103	[-1, 128, 17, 17] 114,688
BatchNorm2d-104	[-1, 128, 17, 17] 256
BasicConv2d-105	[-1, 128, 17, 17]
Conv2d-106	[-1, 192, 17, 17] 172,032
BatchNorm2d-107	[-1, 192, 17, 17] 384
BasicConv2d-108	[-1, 192, 17, 17]
Conv2d-109	[-1, 128, 17, 17] 98,304
BatchNorm2d-110	[-1, 128, 17, 17] 256
BasicConv2d-111	[-1, 128, 17, 17]
Conv2d-112	[-1, 128, 17, 17] 114,688
BatchNorm2d-113	[-1, 128, 17, 17] 256
BasicConv2d-114	[-1, 128, 17, 17]
Conv2d-114	[-1, 128, 17, 17] 114,688
BatchNorm2d-116	
BasicConv2d-117	[-1, 128, 17, 17] 0
Conv2d-118	[-1, 128, 17, 17] 114,688
BatchNorm2d-119	[-1, 128, 17, 17] 256
BasicConv2d-120	[-1, 128, 17, 17] 0
Conv2d-121	[-1, 192, 17, 17] 172,032

BatchNorm2d-122	[-1, 192, 17, 17]	384
BasicConv2d-123		
	[-1, 192, 17, 17]	0
Conv2d-124	[-1, 192, 17, 17]	147,456
BatchNorm2d-125	[-1, 192, 17, 17]	384
BasicConv2d-126	[-1, 192, 17, 17]	0
InceptionC-127	[-1 , 768, 17, 17]	0
Conv2d-128	[-1, 192, 17, 17]	147,456
BatchNorm2d-129	[-1, 192, 17, 17]	384
BasicConv2d-130	[-1, 192, 17, 17]	0
Conv2d-131	[-1, 160, 17, 17]	122 , 880
BatchNorm2d-132	[-1, 160, 17, 17]	320
BasicConv2d-133	[-1, 160, 17, 17]	0
Conv2d-134	[-1, 160, 17, 17]	179 , 200
BatchNorm2d-135	[-1, 160, 17, 17]	320
	[-1, 160, 17, 17]	0
BasicConv2d-136		
Conv2d-137	[-1, 192, 17, 17]	215,040
BatchNorm2d-138	[-1, 192, 17, 17]	384
BasicConv2d-139	[-1, 192, 17, 17]	0
Conv2d-140	[-1, 160, 17, 17]	122,880
BatchNorm2d-141	[-1, 160, 17, 17]	320
BasicConv2d-142	[-1, 160, 17, 17]	0
Conv2d-143	[-1, 160, 17, 17]	179,200
BatchNorm2d-144	[-1, 160, 17, 17]	320
BasicConv2d-145	[-1, 160, 17, 17]	0
Conv2d-146	[-1, 160, 17, 17]	179 , 200
BatchNorm2d-147	[-1, 160, 17, 17]	320
BasicConv2d-148	[-1, 160, 17, 17]	0
Conv2d-149	[-1, 160, 17, 17]	179,200
BatchNorm2d-150	[-1, 160, 17, 17]	320
BasicConv2d-151	[-1, 160, 17, 17]	0
Conv2d-152	[-1, 192, 17, 17]	215,040
BatchNorm2d-153	[-1 , 192, 17, 17]	384
BasicConv2d-154	[-1, 192, 17, 17]	0
Conv2d-155	[-1, 192, 17, 17]	147,456
BatchNorm2d-156	[-1, 192, 17, 17]	384
BasicConv2d-157	[-1, 192, 17, 17]	0
InceptionC-158	[-1, 768, 17, 17]	0
Conv2d-159	[-1, 192, 17, 17]	147,456
BatchNorm2d-160	[-1 , 192, 17, 17]	384
BasicConv2d-161	[-1, 192, 17, 17]	0
Conv2d-162	[-1, 160, 17, 17]	122,880
BatchNorm2d-163	[-1, 160, 17, 17]	320
BasicConv2d-164	[-1, 160, 17, 17]	0
Conv2d-165	[-1, 160, 17, 17]	179,200
BatchNorm2d-166	[-1, 160, 17, 17]	320
BasicConv2d-167	[-1, 160, 17, 17]	0
Conv2d-168	[-1, 192, 17, 17]	215 , 040
BatchNorm2d-169	[-1 , 192, 17, 17]	384
BasicConv2d-170	[-1, 192, 17, 17]	0
Conv2d-171	[-1, 160, 17, 17]	122,880
BatchNorm2d-172	[-1, 160, 17, 17]	320
BasicConv2d-173	[-1, 160, 17, 17]	0
		-
Conv2d-174	[-1, 160, 17, 17]	179,200
BatchNorm2d-175	[-1, 160, 17, 17]	320
BasicConv2d-176	[-1, 160, 17, 17]	0
Conv2d-177	[-1, 160, 17, 17]	179 , 200
BatchNorm2d-178	[-1, 160, 17, 17]	320
BasicConv2d-179	[-1, 160, 17, 17]	0
Conv2d-180	[-1, 160, 17, 17]	179,200
BatchNorm2d-181	[-1, 160, 17, 17]	320
BasicConv2d-182	[-1, 160, 17, 17]	0
Conv2d-183	[-1, 192, 17, 17]	215,040
BatchNorm2d-184	[-1 , 192, 17, 17]	384

Danis Carrold 10F	[1 100 17 17]	0
BasicConv2d-185	[-1, 192, 17, 17] [-1, 192, 17, 17]	147 450
Conv2d-186		147,456
BatchNorm2d-187	[-1, 192, 17, 17]	384
BasicConv2d-188	[-1, 192, 17, 17]	0
InceptionC-189	[-1, 768, 17, 17]	0
Conv2d-190	[-1, 192, 17, 17]	147,456
BatchNorm2d-191	[-1, 192, 17, 17]	384
BasicConv2d-192	[-1, 192, 17, 17]	0
Conv2d-193	[-1, 192, 17, 17]	147,456
BatchNorm2d-194	[-1 , 192, 17, 17]	384
BasicConv2d-195	[-1 , 192, 17, 17]	0
Conv2d-196	[-1, 192, 17, 17]	258 , 048
BatchNorm2d-197	[-1, 192, 17, 17]	384
BasicConv2d-198	[-1, 192, 17, 17]	0
Conv2d-199	[-1, 192, 17, 17]	258,048
BatchNorm2d-200	[-1, 192, 17, 17]	384
BasicConv2d-201	[-1, 192, 17, 17]	0
Conv2d-201	[-1, 192, 17, 17]	147,456
BatchNorm2d-203	[-1, 192, 17, 17]	384
BasicConv2d-204	[-1, 192, 17, 17]	0
Conv2d-205	[-1, 192, 17, 17]	258,048
BatchNorm2d-206	[-1, 192, 17, 17]	384
BasicConv2d-207	[-1, 192, 17, 17]	0
Conv2d-208	[-1, 192, 17, 17]	258,048
BatchNorm2d-209	[-1, 192, 17, 17]	384
BasicConv2d-210	[-1 , 192, 17, 17]	0
Conv2d-211	[-1, 192, 17, 17]	258 , 048
BatchNorm2d-212	[-1, 192, 17, 17]	384
BasicConv2d-213	[-1, 192, 17, 17]	0
Conv2d-214	[-1, 192, 17, 17]	258,048
BatchNorm2d-215	[-1, 192, 17, 17]	384
BasicConv2d-216	[-1, 192, 17, 17]	0
Conv2d-217	[-1, 192, 17, 17]	147,456
BatchNorm2d-218		·
		384
BasicConv2d-219	[-1, 192, 17, 17]	0
InceptionC-220	[-1, 768, 17, 17]	0
Conv2d-221	[-1, 128, 5, 5]	98,304
BatchNorm2d-222	[-1, 128, 5, 5]	256
BasicConv2d-223	[-1, 128, 5, 5]	0
Conv2d-224	[-1, 768, 1, 1]	2,457,600
BatchNorm2d-225	[-1, 768, 1, 1]	1,536
BasicConv2d-226	[-1, 768, 1, 1]	0
Linear-227	[-1, 1000]	769 , 000
InceptionAux-228	[-1, 1000]	0
Conv2d-229	[-1, 192, 17, 17]	147,456
BatchNorm2d-230	[-1, 192, 17, 17]	384
BasicConv2d-231	[-1, 192, 17, 17]	0
Conv2d-232	[-1, 320, 8, 8]	552 , 960
BatchNorm2d-233	[-1, 320, 8, 8]	640
BasicConv2d-234	[-1, 320, 8, 8]	0
Conv2d-235	[-1, 192, 17, 17]	147,456
BatchNorm2d-236	[-1, 192, 17, 17]	384
BasicConv2d-237		0
	[-1, 192, 17, 17]	
Conv2d-238	[-1, 192, 17, 17]	258,048
BatchNorm2d-239	[-1, 192, 17, 17]	384
BasicConv2d-240	[-1, 192, 17, 17]	0
Conv2d-241	[-1, 192, 17, 17]	258,048
BatchNorm2d-242	[-1, 192, 17, 17]	384
BasicConv2d-243	[-1, 192, 17, 17]	0
Conv2d-244	[-1, 192, 8, 8]	331 , 776
BatchNorm2d-245	[-1, 192, 8, 8]	384
BasicConv2d-246	[-1, 192, 8, 8]	0
InceptionD-247	[-1, 1280, 8, 8]	0

Conv2d-248	[-1, 320, 8, 8]	409,600
BatchNorm2d-249	[-1, 320, 8, 8]	640
BasicConv2d-250	[-1, 320, 8, 8]	0
Conv2d-251	[-1, 384, 8, 8]	491,520
BatchNorm2d-252	[-1, 384, 8, 8]	768
BasicConv2d-253	[-1, 384, 8, 8]	0
Conv2d-254	[-1, 384, 8, 8]	442,368
BatchNorm2d-255	[-1, 384, 8, 8]	768
BasicConv2d-256	[-1, 384, 8, 8]	0
Conv2d-257	[-1, 384, 8, 8]	442,368
BatchNorm2d-258	[-1, 384, 8, 8]	768
BasicConv2d-259	[-1, 384, 8, 8]	0
Conv2d-260	[-1, 448, 8, 8]	573 , 440
BatchNorm2d-261	[-1, 448, 8, 8]	896
BasicConv2d-262	[-1, 448, 8, 8]	0
Conv2d-263	[-1, 384, 8, 8]	1,548,288
BatchNorm2d-264	[-1, 384, 8, 8]	768
BasicConv2d-265	[-1, 384, 8, 8]	0
Conv2d-266	[-1, 384, 8, 8]	442,368
BatchNorm2d-267	[-1, 384, 8, 8]	768
BasicConv2d-268	[-1, 384, 8, 8]	0
Conv2d-269	[-1, 384, 8, 8]	442,368
BatchNorm2d-270	[-1, 384, 8, 8]	768
BasicConv2d-271	[-1, 384, 8, 8]	0
Conv2d-272	[-1, 192, 8, 8]	245,760
BatchNorm2d-273	[-1, 192, 8, 8]	384
BasicConv2d-274	[-1, 192, 8, 8]	0
InceptionE-275	[-1, 2048, 8, 8]	0
Conv2d-276	[-1, 320, 8, 8]	655 , 360
BatchNorm2d-277	[-1, 320, 8, 8]	640
BasicConv2d-278	[-1, 320, 8, 8]	0
Conv2d-279	[-1, 384, 8, 8]	786,432
BatchNorm2d-280	[-1, 384, 8, 8]	768
BasicConv2d-281	[-1, 384, 8, 8]	0
Conv2d-282	[-1, 384, 8, 8]	442,368
BatchNorm2d-283 BasicConv2d-284	[-1, 384, 8, 8]	768
	[-1, 384, 8, 8]	0
Conv2d-285	[-1, 384, 8, 8]	442,368
BatchNorm2d-286	[-1, 384, 8, 8]	768 0
BasicConv2d-287 Conv2d-288	[-1, 384, 8, 8] [-1, 448, 8, 8]	917,504
BatchNorm2d-289	[-1, 448, 8, 8]	917 , 504 896
BasicConv2d-290	[-1, 448, 8, 8]	0
Conv2d-291	[-1, 384, 8, 8]	1,548,288
BatchNorm2d-292	[-1, 384, 8, 8]	768
BasicConv2d-293	[-1, 384, 8, 8]	0
Conv2d-294	[-1, 384, 8, 8]	442,368
BatchNorm2d-295	[-1, 384, 8, 8]	768
BasicConv2d-296	[-1, 384, 8, 8]	0
Conv2d-297	[-1, 384, 8, 8]	442,368
BatchNorm2d-298	[-1, 384, 8, 8]	768
BasicConv2d-299	[-1, 384, 8, 8]	0
Conv2d-300	[-1, 192, 8, 8]	393,216
BatchNorm2d-301	[-1, 192, 8, 8]	384
BasicConv2d-302	[-1, 192, 8, 8]	0
InceptionE-303	[-1, 2048, 8, 8]	0
AdaptiveAvgPool2d-304	[-1, 2048, 1, 1]	0
Dropout-305	[-1, 2048, 1, 1]	0
Linear-306	[-1, 1000]	2,049,000
		07 161 064

Total params: 27,161,264
Trainable params: 27,161,264
Non-trainable params: 0

Input size (MB): 1.03
Input size (MB): 1.03 Forward/backward pass size (MB): 228.66 Params size (MB): 103.61
Params size (MB): 103.61
Estimated Total Size (MB): 333.30

Confusion Matrix:

For the first model, which had the best accuracy and prediction, we display the confusion matrix to identify the weak points of the model. We can also see the objects that have more errors in their detection.

