

# Malaria Bounding Boxes

## 1. Business Problem

### 1.1. Description

Data Source: <https://www.kaggle.com/kmader/malaria-bounding-boxes>

Data: malaria-bounding-boxes

#### **Problem statement :**

Malaria is a disease caused by Plasmodium parasites that remains a major threat in global health, affecting 200 million people and causing 400,000 deaths a year. The main species of malaria that affect humans are Plasmodium falciparum and Plasmodium vivax. For malaria as well as other microbial infections, manual inspection of thick and thin blood smears by trained microscopists remains the gold standard for parasite detection and stage determination because of its low reagent and instrument cost and high flexibility. Despite manual inspection being extremely low throughput and susceptible to human bias, automatic counting software remains largely unused because of the wide range of variations in brightfield microscopy images. However, a robust automatic counting and cell classification solution would provide enormous benefits due to faster and more accurate quantitative results without human variability; researchers and medical professionals could better characterize stage-specific drug targets and better quantify patient reactions to drugs.

The data consists of two classes of uninfected cells (RBCs and leukocytes) and four classes of infected cells (gametocytes, rings, trophozoites, and schizonts). Annotators were permitted to mark some cells as difficult if not clearly in one of the cell classes.

### 1.2. Acknowledgements

Original data available from the Broad Institute Repository at <https://data.broadinstitute.org/bbbc/BBBC041/>

These images were contributed by Jane Hung of MIT and the Broad Institute in Cambridge, MA.

There is also a Github repository that lists malaria parasite imaging datasets (blood smears):  
[https://github.com/tobsecret/Awesome\\_Malaria\\_Parasite\\_Imaging\\_Datasets](https://github.com/tobsecret/Awesome_Malaria_Parasite_Imaging_Datasets)

Published results using this image set These datasets will be evaluated in a publication to be submitted.

Recommended citation "We used image set BBBC041v1, available from the Broad Bioimage Benchmark Collection [Ljosa et al., Nature Methods, 2012]."

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### 1.3. Real-world/Business objectives and constraints.

- No low-latency requirement.
- Interpretability is also important. Model should provide the probability score of classifying into the specific category.
- As it is a matter of human health, misclassification very danger.

### 1.4. References

<https://arxiv.org/pdf/1504.08083.pdf>

<https://arxiv.org/ftp/arxiv/papers/1804/1804.09548.pdf>

<https://github.com/kbardool/keras-frcnn>

<https://medium.com/@whatdhack/a-deeper-look-at-how-faster-rcnn-works-84081284e1cd>

## 1.5. Environment

I am using Google Colab to build this model. Google Colab reconnects and loses all variables some times. So It is important to build a model in such a way that it should allow resuming of training if colab reconnect during training

## References

<https://arxiv.org/pdf/1504.08083.pdf>

<https://arxiv.org/ftp/arxiv/papers/1804/1804.09548.pdf>

<https://github.com/kbardool/keras-frcnn>

<https://medium.com/@whatdhack/a-deeper-look-at-how-faster-rcnn-works-84081284e1cd>

In [0]:

```
#Mounting Google Drive
from google.colab import drive
drive.mount('/content/drive', force_remount=True)
```

Go to this URL in a browser: [https://accounts.google.com/o/oauth2/auth?client\\_id=947318989803-6bn6qk8qdgf4n4g3pfee6491hc0brc4i.apps.googleusercontent.com&redirect\\_uri=urn%3aietf%3awg%3aoauth%3a2.0%b&response\\_type=code&scope=email%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdocs.test%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive.photos.readonly%20https%3a%2f%2fwww.googleapis.com%2fauth%2fpeopleapi.readonly](https://accounts.google.com/o/oauth2/auth?client_id=947318989803-6bn6qk8qdgf4n4g3pfee6491hc0brc4i.apps.googleusercontent.com&redirect_uri=urn%3aietf%3awg%3aoauth%3a2.0%b&response_type=code&scope=email%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdocs.test%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive%20https%3a%2f%2fwww.googleapis.com%2fauth%2fdrive.photos.readonly%20https%3a%2f%2fwww.googleapis.com%2fauth%2fpeopleapi.readonly)

Enter your authorization code:

.....

Mounted at /content/drive

In [0]:

```
# Importing necessary libraries
import pandas as pd
import matplotlib.pyplot as plt
from matplotlib import patches
import numpy as np
from os import path
from tqdm import tqdm
import tensorflow.python.keras
from tensorflow.python.keras import models, layers
from tensorflow.python.keras.layers import SeparableConv2D, DepthwiseConv2D
from tensorflow.python.keras.models import Model, load_model
from tensorflow.python.keras.layers import BatchNormalization, Activation, Flatten
from tensorflow.python.keras.optimizers import Adam
from keras.preprocessing.image import ImageDataGenerator
```

The default version of TensorFlow in Colab will soon switch to TensorFlow 2.x.

We recommend you [upgrade](#) now or ensure your notebook will continue to use TensorFlow 1.x via the `%tensorflow_version 1.x` magic: [more info](#).

Using TensorFlow backend.

In [0]:

```
!pip install keras==2.0.3
```

Requirement already satisfied: keras==2.0.3 in /usr/local/lib/python3.6/dist-packages (2.0.3)

Requirement already satisfied: pyyaml in /usr/local/lib/python3.6/dist-packages (from keras==2.0.3) (3.13)

Requirement already satisfied: theano in /usr/local/lib/python3.6/dist-packages (from keras==2.0.3) (1.0.4)

Requirement already satisfied: six in /usr/local/lib/python3.6/dist-packages (from keras==2.0.3) (1.12.0)

Requirement already satisfied: scipy>=0.14 in /usr/local/lib/python3.6/dist-packages (from theano->keras==2.0.3) (1.3.2)

Requirement already satisfied: numpy>=1.9.1 in /usr/local/lib/python3.6/dist-packages (from

requirements already satisfied: numpy=1.9.1 in /usr/local/lib/python3.6/dist-packages (from theano->keras==2.0.3) (1.17.4)

## Data Preprocessing

In [0]:

```
train_data = pd.read_json("/content/drive/My Drive/rcnn/training.json")
```

In [0]:

```
train_data.head()
```

Out[0]:

|   | image   | objects   |
|---|---|---|
| 0 | {'checksum': '676bb8e86fc2dbf05dd97d51a64ac0af... | [{'bounding_box': {'minimum': {'r': 1057, 'c':... |
| 1 | {'checksum': '1225a18efce159eddf7b0e80e0ea642c... | [{'bounding_box': {'minimum': {'r': 734, 'c': ... |
| 2 | {'checksum': '3eaf840523c30fdf38897ffa01e194eb... | [{'bounding_box': {'minimum': {'r': 724, 'c': ... |
| 3 | {'checksum': '8a111dffacfa433029492780b9535091... | [{'bounding_box': {'minimum': {'r': 563, 'c': ... |
| 4 | {'checksum': 'ccef403e971460b86444cca669e68ca1... | [{'bounding_box': {'minimum': {'r': 618, 'c': ... |

In [0]:

```
train_data.shape
```

Out[0]:

```
(1208, 2)
```

In [0]:

```
#splitting into train and test
#https://stackoverflow.com/questions/24147278/how-do-i-create-test-and-train-samples-from-one-data-frame-with-pandas
msk = np.random.rand(len(train_data)) < 0.8

train = train_data[msk]

test = train_data[~msk]
```

In [0]:

```
train.reset_index(inplace=True)
test.reset_index(inplace=True)
```

In [0]:

```
train.head()
```

Out[0]:

|   | index | image   | objects   |
|---|-------|---|---|
| 0 | 1     | {'checksum': '1225a18efce159eddf7b0e80e0ea642c... | [{'bounding_box': {'minimum': {'r': 734, 'c': ... |
| 1 | 2     | {'checksum': '3eaf840523c30fdf38897ffa01e194eb... | [{'bounding_box': {'minimum': {'r': 724, 'c': ... |
| 2 | 3     | {'checksum': '8a111dffacfa433029492780b9535091... | [{'bounding_box': {'minimum': {'r': 563, 'c': ... |
| 3 | 4     | {'checksum': 'ccef403e971460b86444cca669e68ca1... | [{'bounding_box': {'minimum': {'r': 618, 'c': ... |
| 4 | 6     | {'checksum': '36f63469b09e117ade01d97d3c7e2120... | [{'bounding_box': {'minimum': {'r': 124, 'c': ... |

```
In [0]:
```

```
train.shape
```

```
Out[0]:
```

```
(959, 3)
```

```
In [0]:
```

```
test.shape
```

```
Out[0]:
```

```
(249, 3)
```

## Data Format

- Given dataset is in the form of json file, this format is not feasible to create moels.
- So decided to create a dataframe with each bounding box of an image as a datapoint

```
In [0]:
```

```
# creating dataframe with each bounding box as datapoint
train_image_list = []
y_max = []
y_min = []
x_max = []
x_min = []
class_label = []
for i in range(0,train.shape[0]):

    for j in range(0,len(train["objects"][i])):
        train_image_list.append(train["image"][i]["pathname"])

        y_max.append(train["objects"][i][j]["bounding_box"]["maximum"]["r"])
        y_min.append(train["objects"][i][j]["bounding_box"]["minimum"]["r"])
        x_max.append(train["objects"][i][j]["bounding_box"]["maximum"]["c"])
        x_min.append(train["objects"][i][j]["bounding_box"]["minimum"]["c"])

        class_label.append(train["objects"][i][j]["category"])
```

```
In [0]:
```

```
train_df = pd.DataFrame()
```

```
In [0]:
```

```
train_df["image"] = train_image_list
train_df["y_max"] = y_max
train_df["y_min"] = y_min
train_df["x_max"] = x_max
train_df["x_min"] = x_min
train_df["class_label"] = class_label
```

```
In [0]:
```

```
train_df.head()
```

```
Out[0]:
```

|   | image  | y_max | y_min | x_max | x_min | class_label    |
|---|--|-------|-------|-------|-------|----------------|
| 0 | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 832   | 734   | 834   | 735   | red blood cell |
| 1 | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 1039  | 939   | 1378  | 1283  | red blood      |

|   | image  | y_max | y_min | x_max | x_min | class_label    |
|---|--|-------|-------|-------|-------|----------------|
| 2 | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 476   | 367   | 1235  | 1134  | red blood cell |
| 3 | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 400   | 307   | 864   | 766   | red blood cell |
| 4 | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 701   | 596   | 1556  | 1463  | red blood cell |

In [0]:

```
#### checking whether all images are available in the image folder
```

In [0]:

```
train_exist = []
for i in range(0,train_df.shape[0]):
    x = train_df["image"][i]
    train_exist.append(path.isfile("/content/drive/My Drive/rcnn" + x))
```

In [0]:

```
train_exist[0:5]
```

Out[0]:

```
[True, True, True, True, True]
```

In [0]:

```
train_df["avialability"] = train_exist
```

In [0]:

```
#Taking only available images
train_df = train_df[train_df["avialability"] == True]
```

In [0]:

```
train_df[train_df["avialability"] == False]
```

Out[0]:

```
image y_max y_min x_max x_min class_label avialability
```

In [0]:

```
train_df["image"].nunique()
```

Out[0]:

```
959
```

**Total we have 959 unique images are available for training**

In [0]:

```
train_df.reset_index(inplace=True)
```

In [0]:

```
test_image_list = []
y_max = []
y_min = []
x_max = []
```

```

x_min = []
class_label = []
for i in range(0, test.shape[0]):

    for j in range(0, len(test["objects"][i])):
        test_image_list.append(test["image"][i]["pathname"])

        y_max.append(test["objects"][i][j]["bounding_box"]["maximum"]["r"])
        y_min.append(test["objects"][i][j]["bounding_box"]["minimum"]["r"])
        x_max.append(test["objects"][i][j]["bounding_box"]["maximum"]["c"])
        x_min.append(test["objects"][i][j]["bounding_box"]["minimum"]["c"])

    class_label.append(test["objects"][i][j]["category"])

```

In [0]:

```
test_df = pd.DataFrame()
```

In [0]:

```

test_df["image"] = test_image_list
test_df["y_max"] = y_max
test_df["y_min"] = y_min
test_df["x_max"] = x_max
test_df["x_min"] = x_min
test_df["class_label"] = class_label

```

In [0]:

```
test_df.head()
```

Out[0]:

|   | image  | y_max | y_min | x_max | x_min | class_label    |
|---|--|-------|-------|-------|-------|----------------|
| 0 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 1158  | 1057  | 1540  | 1440  | red blood cell |
| 1 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 971   | 868   | 1403  | 1303  | red blood cell |
| 2 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 689   | 578   | 1008  | 900   | red blood cell |
| 3 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 408   | 304   | 713   | 611   | red blood cell |
| 4 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 312   | 198   | 1003  | 881   | red blood cell |

In [0]:

```

test_exist = []
for i in range(0, test_df.shape[0]):
    x = test_df["image"][i]
    test_exist.append(path.isfile("/content/drive/My Drive/rcnn" + x))

```

In [0]:

```
test_exist[0:5]
```

Out[0]:

```
[True, True, True, True, True]
```

In [0]:

```
test_df["availability"] = test_exist
```

In [0]:

```
test_df = test_df[test_df["availability"] == True]
```

```
In [0]:
```

```
test_df.head()
```

```
Out[0]:
```

|   | image  | y_max | y_min | x_max | x_min | class_label    | avialability |
|---|--|-------|-------|-------|-------|----------------|--------------|
| 0 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 1158  | 1057  | 1540  | 1440  | red blood cell | True         |
| 1 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 971   | 868   | 1403  | 1303  | red blood cell | True         |
| 2 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 689   | 578   | 1008  | 900   | red blood cell | True         |
| 3 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 408   | 304   | 713   | 611   | red blood cell | True         |
| 4 | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 312   | 198   | 1003  | 881   | red blood cell | True         |

```
In [0]:
```

```
test_df[test_df["avialability"] == False]
```

```
Out[0]:
```

| image | y_max | y_min | x_max | x_min | class_label | avialability |
|-------|-------|-------|-------|-------|-------------|--------------|
|-------|-------|-------|-------|-------|-------------|--------------|

```
In [0]:
```

```
test_df['image'].nunique()
```

```
Out[0]:
```

```
248
```

**Total we have 248 unique images are available for testing**

```
In [0]:
```

```
train_df.to_csv("/content/drive/My Drive/rcnn/train_df.csv",index = False)  
test_df.to_csv("/content/drive/My Drive/rcnn/test_df.csv",index = False)
```

```
In [0]:
```

```
train_df['class_label'].value_counts()
```

```
Out[0]:
```

```
red blood cell    62875  
trophozoite       1207  
difficult         335  
ring              281  
schizont          142  
gametocyte        113  
leukocyte         85  
Name: class_label, dtype: int64
```

- Our Dataset is greatly imbalanced

**Creating annotation text file for training purpose**

- It should be in the below form

- filename, x\_min, y\_min, x\_max, y\_max

In [0]:

```
data = pd.DataFrame()
data['format'] = train_df['image']
print(data.shape)
for i in range(data.shape[0]):
    data['format'][i] = '/content/drive/My Drive/rcnn' + data['format'][i]

f= open(f"/content/drive/My Drive/rcnn/annotate_train.txt","w+")
for i in range(data.shape[0]):
    data['format'][i] = data['format'][i] + ',' + str(train_df['x_min'][i]) + ',' + str(train_df['y_min'][i]) + ',' + str(train_df['x_max'][i]) + ',' + str(train_df['y_max'][i]) + ',' + train_df['class_label'][i]
    f.write(data['format'][i])
    f.write("\n")
f.close()
```

(65038, 1)

In [0]:

```
test_df.reset_index(inplace=True)
```

In [0]:

```
data = pd.DataFrame()
data['format'] = test_df['image']
for i in range(data.shape[0]):
    data['format'][i] = '/content/drive/My Drive/rcnn' + data['format'][i]

f= open(f"/content/drive/My Drive/rcnn/annotate_test.txt","w+")
for i in range(data.shape[0]):
    data['format'][i] = data['format'][i] + ',' + str(test_df['x_min'][i]) + ',' + str(test_df['y_min'][i]) + ',' + str(test_df['x_max'][i]) + ',' + str(test_df['y_max'][i]) + ',' + test_df['class_label'][i]
    f.write(data['format'][i])
    f.write("\n")
f.close()
```

In [0]:

```
### Sample image with actual Bounding boxes
```

In [0]:

```
fig = plt.figure()

#add axes to the image
ax = fig.add_axes([0,0,1,1])

# read and plot the image
image = plt.imread('/content/drive/My Drive/rcnn/images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png')
plt.imshow(image)

# iterating over the image for different objects
for _,row in test_df[test_df.image == "/images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png"].iterrows():
    xmin = row.x_min
    #print(xmin)
    xmax = row.x_max
    ymin = row.y_min
    ymax = row.y_max

    width = xmax - xmin
    height = ymax - ymin
    # assign different color to different classes of objects
    if row.class_label == 'ring':
        edgecolor = 'r'
        ax.annotate('ring', xy=(xmax-40, ymin+20))
```



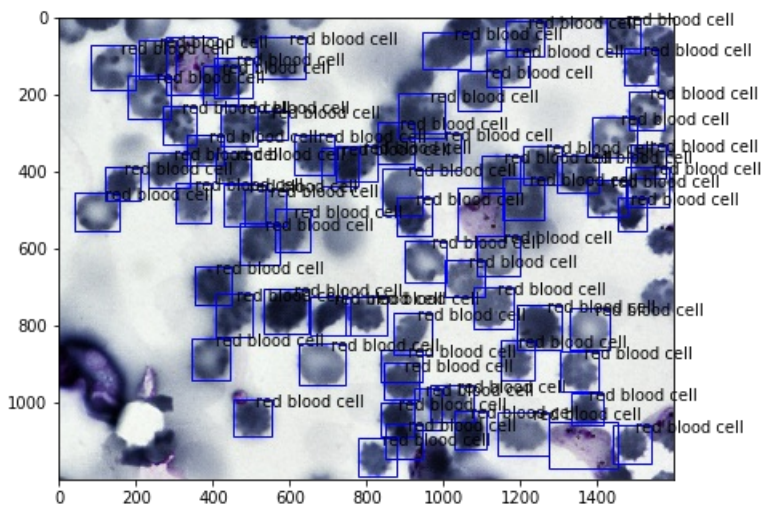
```

ax.annotate('ring', xy=(xmax-20, ymin+20))
elif row.class_label == 'red blood cell':
    edgecolor = 'b'
    ax.annotate('red blood cell', xy=(xmax-40, ymin+20))

# add bounding boxes to the image
rect = patches.Rectangle((xmin,ymin), width, height, edgecolor = edgecolor, facecolor = 'none')

ax.add_patch(rect)

```



## Modeling with Faster RCNN

- For training our dataset I have decided to use Faster RCNN

### How FasterRCNN works:

**Faster-RCNN is composed of 3 neural networks — Feature Network, Region Proposal Network (RPN), Detection Network**

#### Feature Network:

The Feature Network is usually a well known pre-trained image classification network such as VGG minus a few last/top layers. The function of this network is to generate good features from the images. The output of this network maintains the the shape and structure of the original image ( i.e. still rectangular, pixels in the original image roughly gets mapped to corresponding feature “pixels”, etc.)

#### Region Proposal Network (RPN):

The RPN is usually a simple network with a 3 convolutional layers. There is one common layer which feeds into a two layers — one for classification and the other for bounding box regression. The purpose of RPN is to generate a number of bounding boxes called Region of Interests ( ROIs) that has high probability of containing any object. The output from this network is a number of bounding boxes identified by the pixel co-ordinates of two diagonal corners, and a value (1, 0, or -1, indicating whether an object is in the bounding box or not or the box can be ignored respectively ).

#### Detection Network:

The Detection Network ( sometimes also called the RCNN network ) takes input from both the Feature Network and RPN , and generates the final class and bounding box. It is normally composed of 4 Fully Connected or Dense layers. There are 2 stacked common layers shared by a classification layer and a bounding box regression layer. To help it classify only the inside of the bounding boxes, the features are cropped according to the bounding boxes.

- I have did necessary modification to this repo <https://github.com/kbardool/keras-frcnn> and cloned here

In [0]:

```
%cd /content
```

/content

In [0]:

```
!rm -rf drive
```

```
rm: cannot remove 'drive/My Drive/netflix/data_folder/test.csv': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/data.csv': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/combined_data_4.txt': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/combined_data_3.txt': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/combined_data_1.txt': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/train.csv': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/images/arrow.jpg': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/images/data_c.jpg': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/images/data_sparse_c.jpg': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/images/models.jpg': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/images/netflix-q.jpg': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/small_sample_results.csv': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/sample_test_sparse_matrix.npz': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/reg_train.csv': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/movie_titles.csv': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/combined_data_2.txt': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/reg_test.csv': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/trunc_sparse_matrix.npz': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/m_m_sim_sparse.npz': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/sample_train_sparse_matrix.npz': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/Netflix_Movie.ipynb': Operation not permitted
rm: cannot remove 'drive/My Drive/netflix/data_folder/reg_train.gsheet': Operation not permitted
```

In [0]:

```
!git clone https://github.com/sandeepburra/keras-frcnn
```

```
Cloning into 'keras-frcnn'...
remote: Enumerating objects: 29, done.
remote: Counting objects: 100% (29/29), done.
remote: Compressing objects: 100% (29/29), done.
remote: Total 640 (delta 15), reused 0 (delta 0), pack-reused 611
Receiving objects: 100% (640/640), 194.05 KiB | 544.00 KiB/s, done.
Resolving deltas: 100% (431/431), done.
```

In [0]:

```
%cd keras-frcnn
```

/content/keras-frcnn

## Training Parameters:

### parser details:

- -p : path for annotation file
- config\_filename : path to create configuration file
- output\_weight\_path : path to create output weight file

- result\_path : path to save training loss details in a csv format--> this is file allow as to resume training which is very important as we are running this on Google Colab
  - number of Epochs : 1000 ##### Data Augmentation
  - Horizontal Flip
  - Vertical Flip
  - rotation
- 
- training logs are removed as they are very bigger

In [0]:

```
!python train_frcnn.py \
-o simple \
-p /content/drive/My\ Drive/rcnn/annotate_train.txt \
--config_filename /content/drive/My\ Drive/rcnn/Data_model/config.pickle \
--output_weight_path /content/drive/My\ Drive/rcnn/Data_model/model_frcnn.hdf5 \
--hf True \
--vf True \
--rot True \
--result_path /content/drive/My\ Drive/rcnn/Data_model/result_df.csv \
--num_epochs 1000
```

In [0]:

```
!python train_frcnn.py \
-o simple \
-p /content/drive/My\ Drive/rcnn/annotate_train.txt \
--config_filename /content/drive/My\ Drive/rcnn/Data_model/config.pickle \
--output_weight_path /content/drive/My\ Drive/rcnn/Data_model/model_frcnn.hdf5 \
--hf True \
--vf True \
--rot True \
--result_path /content/drive/My\ Drive/rcnn/Data_model/result_df.csv \
--input_weight_path /content/drive/My\ Drive/rcnn/Data_model/model_frcnn.hdf5 \
--num_epochs 1000
```

In [0]:

```
### Plotting all the losses During training
```

In [0]:

```
result = pd.read_csv("/content/drive/My Drive/rcnn/Data_model/result_df.csv")
```

In [0]:

```
result.shape
```

Out[0]:

```
(1000, 7)
```

In [0]:

```
result.head()
```

Out[0]:

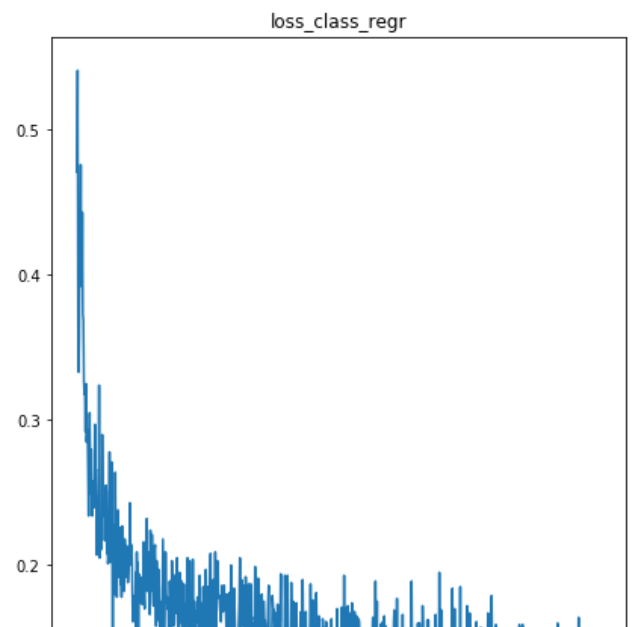
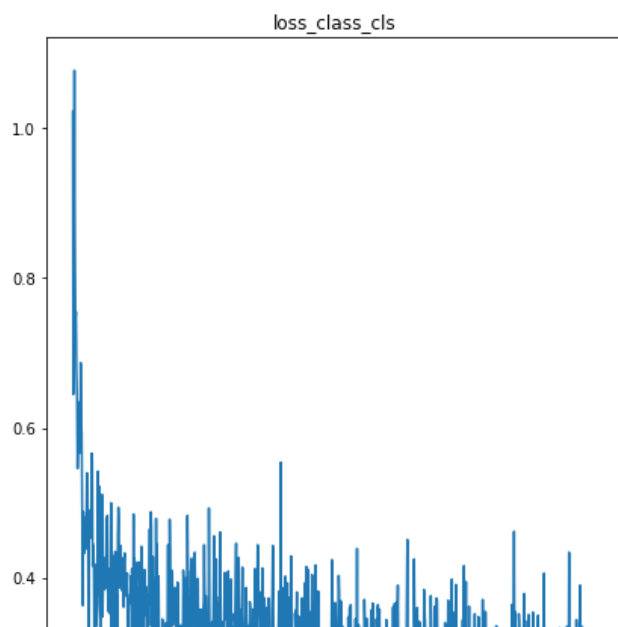
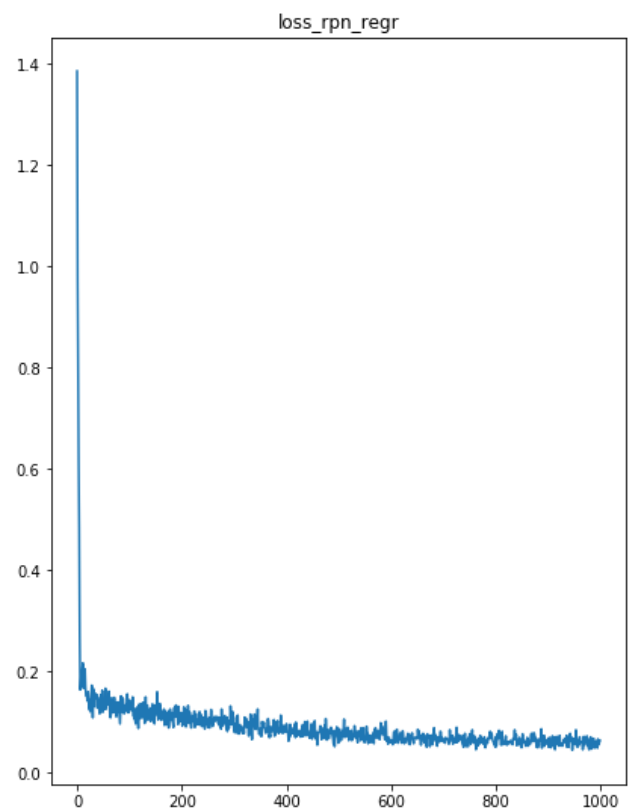
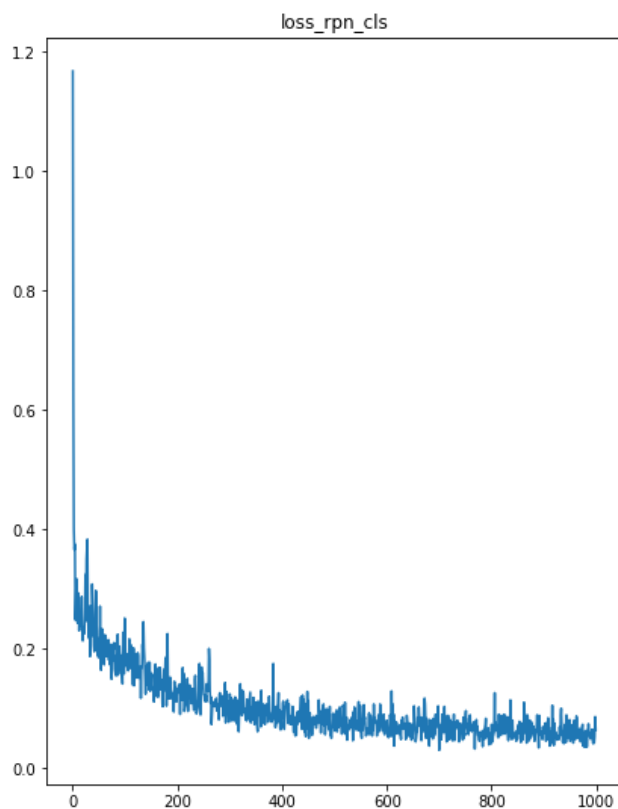
|   | mean_overlapping_bboxes | class_acc | loss_rpn_cls | loss_rpn_regr | loss_class_cls | loss_class_regr | curr_loss |
|---|-------------------------|-----------|--------------|---------------|----------------|-----------------|-----------|
| 0 | 2.0                     | 0.838     | 1.167        | 1.386         | 1.022          | 0.471           | 4.045     |
| 1 | 2.7                     | 0.916     | 0.621        | 0.975         | 0.645          | 0.541           | 2.781     |
| 2 | 15.6                    | 0.716     | 0.400        | 0.773         | 0.837          | 0.368           | 2.378     |
| 3 | 22.7                    | 0.416     | 0.366        | 0.614         | 1.077          | 0.333           | 2.391     |
| 4 | 42.1                    | 0.500     | 0.375        | 0.482         | 0.856          | 0.356           | 2.070     |

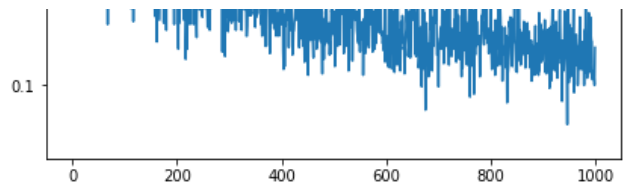
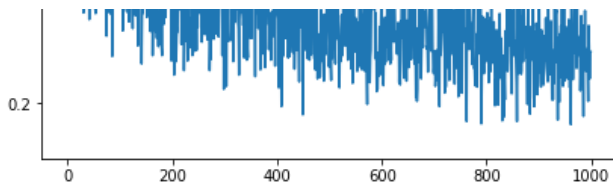
In [0]:

```
plt.figure(figsize=(15,20))
plt.subplot(2,2,1)
plt.plot(range(0, 1000), result['loss_rpn_cls'])
plt.title('loss_rpn_cls')
plt.subplot(2,2,2)
plt.plot(range(0, 1000), result['loss_rpn_regr'])
plt.title('loss_rpn_regr')

plt.subplot(2,2,3)
plt.plot(range(0, 1000), result['loss_class_cls'])
plt.title('loss_class_cls')
plt.subplot(2,2,4)
plt.plot(range(0, 1000), result['loss_class_regr'])
plt.title('loss_class_regr')

plt.show()
```





## Testing

- -p: path for test image
- --result\_path\_2class : path to create prediction csv file
- config\_filename: path to config file name which was created during training

In [0]:

```
!python test_frcnn.py \
-p /content/drive/My\ Drive/rcnn/testing \
--result_path_2class /content/drive/My\ Drive/rcnn/Data_model/prediction_df.csv \
--config_filename /content/drive/My\ Drive/rcnn/Data_model/config.pickle
```

Using TensorFlow backend.

```
{0: 'red blood cell', 1: 'schizont', 2: 'difficult', 3: 'ring', 4: 'leukocyte', 5: 'gametocyte',
6: 'trophozoite', 7: 'bg'}
```

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:47: The name tf.get\_default\_graph is deprecated. Please use tf.compat.v1.get\_default\_graph instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:351: The name tf.placeholder is deprecated. Please use tf.compat.v1.placeholder instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3176: The name tf.random\_uniform is deprecated. Please use tf.random.uniform instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3043: The name tf.nn.max\_pool is deprecated. Please use tf.nn.max\_pool2d instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3153: The name tf.random\_normal is deprecated. Please use tf.random.normal instead.

WARNING:tensorflow:From /content/keras-frcnn/keras\_frcnn/RoiPoolingConv.py:105: The name tf.image.resize\_images is deprecated. Please use tf.image.resize instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3045: The name tf.nn.avg\_pool is deprecated. Please use tf.nn.avg\_pool2d instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:1064: calling reduce\_prod\_v1 (from tensorflow.python.ops.math\_ops) with keep\_dims is deprecated and will be removed in a future version.

Instructions for updating:

keep\_dims is deprecated, use keepdims instead

Loading weights from /content/drive/My Drive/rcnn/Data\_model/model\_frcnn.hdf5

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:141: The name tf.get\_default\_session is deprecated. Please use tf.compat.v1.get\_default\_session instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:146: The name tf.ConfigProto is deprecated. Please use tf.compat.v1.ConfigProto instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:151: The name tf.Session is deprecated. Please use tf.compat.v1.Session instead.

2019-11-15 06:01:54.478321: I tensorflow/core/platform/profile\_utils/cpu\_utils.cc:94] CPU Frequency: 2300000000 Hz

2019-11-15 06:01:54.478567: I tensorflow/compiler/xla/service/service.cc:168] XLA service

```

0x9314540 initialized for platform Host (this does not guarantee that XLA will be used). Devices:
2019-11-15 06:01:54.478605: I tensorflow/compiler/xla/service/service.cc:176] StreamExecutor dev
ice (0): Host, Default Version
2019-11-15 06:01:54.480713: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcuda.so.1
2019-11-15 06:01:54.549027: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-15 06:01:54.549924: I tensorflow/compiler/xla/service/service.cc:168] XLA service
0x9314700 initialized for platform CUDA (this does not guarantee that XLA will be used). Devices:
2019-11-15 06:01:54.549958: I tensorflow/compiler/xla/service/service.cc:176] StreamExecutor dev
ice (0): Tesla K80, Compute Capability 3.7
2019-11-15 06:01:54.550162: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-15 06:01:54.550892: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1618] Found device
0 with properties:
name: Tesla K80 major: 3 minor: 7 memoryClockRate(GHz): 0.8235
pciBusID: 0000:00:04.0
2019-11-15 06:01:54.551220: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudart.so.10.0
2019-11-15 06:01:54.552487: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcublas.so.10.0
2019-11-15 06:01:54.553610: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcufft.so.10.0
2019-11-15 06:01:54.554006: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcurand.so.10.0
2019-11-15 06:01:54.555782: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcusolver.so.10.0
2019-11-15 06:01:54.557093: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcusparsesolver.so.10.0
2019-11-15 06:01:54.560582: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudnn.so.7
2019-11-15 06:01:54.560740: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-15 06:01:54.561564: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-15 06:01:54.562267: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1746] Adding
visible gpu devices: 0
2019-11-15 06:01:54.562347: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudart.so.10.0
2019-11-15 06:01:54.564032: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1159] Device
interconnect StreamExecutor with strength 1 edge matrix:
2019-11-15 06:01:54.564069: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1165]      0
2019-11-15 06:01:54.564087: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1178] 0:    N
2019-11-15 06:01:54.564266: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-15 06:01:54.565119: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-15 06:01:54.565862: W tensorflow/core/common_runtime/gpu/gpu_bfc_allocator.cc:39]
Overriding allow_growth setting because the TF_FORCE_GPU_ALLOW_GROWTH environment variable is set.
Original config value was 0.
2019-11-15 06:01:54.565920: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1304] Created
TensorFlow device (/job:localhost/replica:0/task:0/device:GPU:0 with 10805 MB memory) -> physical
GPU (device: 0, name: Tesla K80, pci bus id: 0000:00:04.0, compute capability: 3.7)
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:300: The name tf.global_variables is deprecated. Plea
se use tf.compat.v1.global_variables instead.

```

```

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:308: The name tf.variables_initializer is deprecated.
Please use tf.compat.v1.variables_initializer instead.

```

```

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/optimizers.py:675: The name t
f.train.Optimizer is deprecated. Please use tf.compat.v1.train.Optimizer instead.

```

a9fecdda-18f2-405e-9aa1-409falf49fe4.png

```

2019-11-15 06:01:57.993751: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudnn.so.7
2019-11-15 06:02:00.574833: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcublas.so.10.0
Elapsed time = 7.304379224777222

```

In [0]:

```
image = plt.imread('/content/drive/My Drive/rcnn/images/10be6380-cbbb-4886-8b9e-ff56b1710576.png')
```

In [0]:

```
image.shape
```

Out[0]:

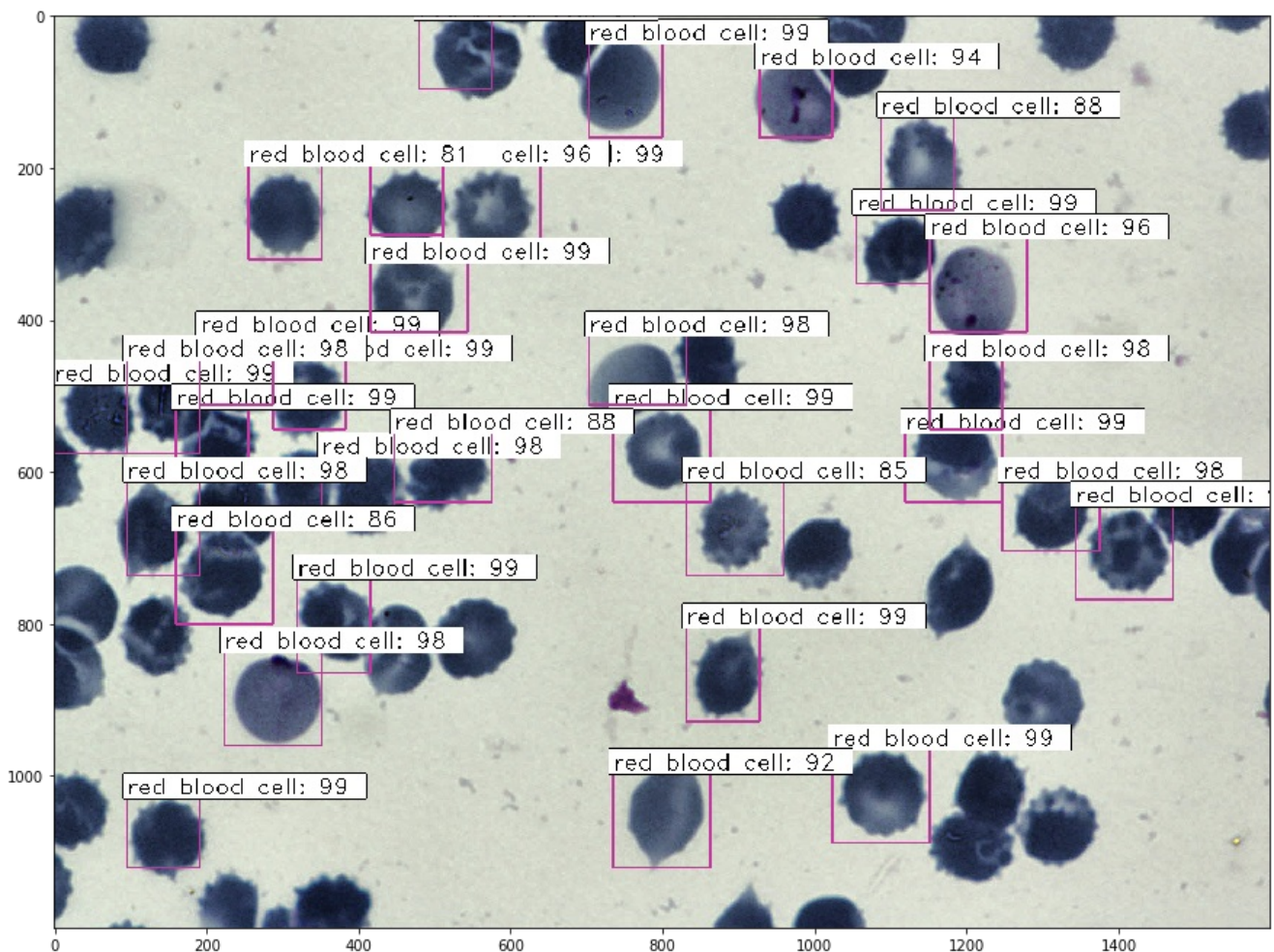
```
(1200, 1600, 3)
```

In [0]:

```
plt.figure(figsize=(15,20))  
plt.imshow(image)
```

Out[0]:

```
<matplotlib.image.AxesImage at 0x7f787bb6b0f0>
```



In [0]:

```
result_df_2class = pd.read_csv("/content/drive/My Drive/rcnn/Data_model_2/result_df_2class.csv")
```

In [0]:

```
result_df_2class["label"].value_counts()
```

Out[0]:

```
RBC      65  
Name: label, dtype: int64
```



In [0]:

```
fig = plt.figure()
ax = fig.add_axes([0,0,1,1])

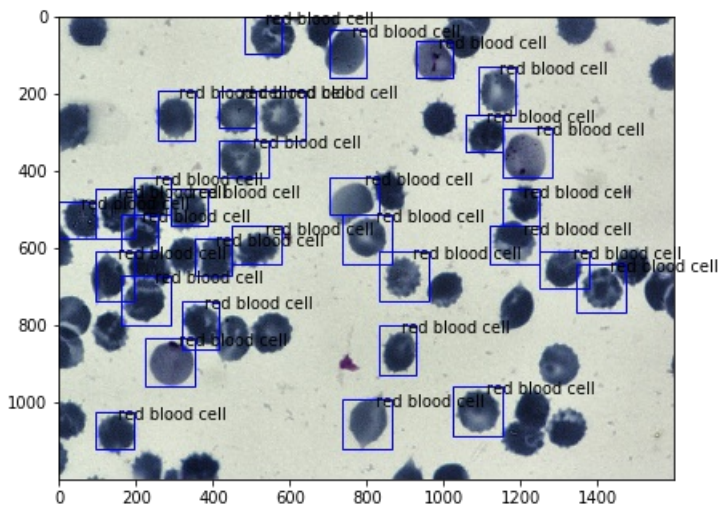
# read and plot the image
image = plt.imread('/content/drive/My Drive/rcnn/testing/a9fecdda-18f2-405e-9aa1-409falf49fe4.png')
plt.imshow(image)

# iterating over the image for different objects
for _,row in result_df_2class.iterrows():
    xmin = row.x1
    #print(xmin)
    xmax = row.x2
    ymin = row.y1
    ymax = row.y2

    width = xmax - xmin
    height = ymax - ymin
    # assign different color to different classes of objects
    if row.label == 'ring':
        edgecolor = 'r'
        ax.annotate('ring', xy=(xmax-40,ymin+20))
    elif row.label == 'red blood cell':
        edgecolor = 'b'
        ax.annotate('red blood cell', xy=(xmax-40,ymin+20))

    # add bounding boxes to the image
    rect = patches.Rectangle((xmin,ymin), width, height, edgecolor = edgecolor, facecolor = 'none')

    ax.add_patch(rect)
```



## Observations:

- As the dataset is highly imbalanced, Red Blood cells will dominate over other classes.
- We cannot predict minor classes like leukocyte(count:85) against Major class Red Blood Cell(count:62875)
- So to make our model efficient we will divide our problem into two models

## Procedure:

### Model 1:

- First we will create dataset with two labels, RBC and other(all classes together except RBC)
- FRCNN model will be trained on this data, and will predict Bounding boxes and two class labels RBC and other



## Model 2:

- we will crop the images with the bounding box dimensions other class(Except RBC).
- Train a densenet model on this cropped image,for all other classes.
- while testing we will take output of model 1 and feed to model 2

## Data for first classifier(Object detection with Bounding Boxes)

In [0]:

```
import pandas as pd
```

In [0]:

```
train_df = pd.read_csv("/content/drive/My Drive/rcnn/train_df.csv")
test_df = pd.read_csv("/content/drive/My Drive/rcnn/test_df.csv")
```

In [0]:

```
train_df['class_label'].value_counts()
```

Out[0]:

```
red blood cell    62875
trophozoite       1207
difficult         335
ring              281
schizont          142
gametocyte        113
leukocyte          85
Name: class_label, dtype: int64
```

In [0]:

```
train_df_final = train_df.copy()
```

In [0]:

```
train_df_final.head()
```

Out[0]:

|   | index | image  | y_max | y_min | x_max | x_min | class_label    | avialability |
|---|-------|--|-------|-------|-------|-------|----------------|--------------|
| 0 | 0     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 832   | 734   | 834   | 735   | red blood cell | True         |
| 1 | 1     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 1039  | 939   | 1378  | 1283  | red blood cell | True         |
| 2 | 2     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 476   | 367   | 1235  | 1134  | red blood cell | True         |
| 3 | 3     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 400   | 307   | 864   | 766   | red blood cell | True         |
| 4 | 4     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 701   | 596   | 1556  | 1463  | red blood cell | True         |

In [0]:

```
train_df_final['class_label'].value_counts()
```

Out[0]:

```
red blood cell    62875
trophozoite       1207
difficult         335
ring              281
schizont          142
gametocyte        113
```

```
leukocyte          85
Name: class_label, dtype: int64
```

```
In [0]:
```

```
train_df_final['class_label'].unique()
```

```
Out[0]:
```

```
array(['red blood cell', 'schizont', 'difficult', 'ring', 'leukocyte',
       'gametocyte', 'trophozoite'], dtype=object)
```

```
In [0]:
```

```
train_df_final["2class"] = train_df_final['class_label'].replace(['schizont', 'difficult', 'ring',
'leukocyte', 'gametocyte', 'trophozoite'], "other")
```

```
In [0]:
```

```
train_df_final.head()
```

```
Out[0]:
```

|   | index | image  | y_max | y_min | x_max | x_min | class_label    | avialability | 2class         |
|---|-------|--|-------|-------|-------|-------|----------------|--------------|----------------|
| 0 | 0     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 832   | 734   | 834   | 735   | red blood cell | True         | red blood cell |
| 1 | 1     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 1039  | 939   | 1378  | 1283  | red blood cell | True         | red blood cell |
| 2 | 2     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 476   | 367   | 1235  | 1134  | red blood cell | True         | red blood cell |
| 3 | 3     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 400   | 307   | 864   | 766   | red blood cell | True         | red blood cell |
| 4 | 4     | /images/10be6380-cbbb-4886-8b9e-ff56b1710576.png | 701   | 596   | 1556  | 1463  | red blood cell | True         | red blood cell |

```
In [0]:
```

```
train_df_final['class_label'].replace("red blood cell", "RBC", inplace= True)
```

```
In [0]:
```

```
train_df_final['2class'].replace("red blood cell", "RBC", inplace= True)
```

```
In [0]:
```

```
data = pd.DataFrame()
data['format'] = train_df_final['image']
print(data.shape)
for i in range(data.shape[0]):
    data['format'][i] = '/content/drive/My Drive/rcnn' + data['format'][i]

f= open(f"/content/drive/My Drive/rcnn/annotate_train_2class.txt", "w+")
for i in range(data.shape[0]):
    data['format'][i] = data['format'][i] + ',' + str(train_df_final['x_min'][i]) + ',' + str(train_df_final['y_min'][i]) + ',' + str(train_df_final['x_max'][i]) + ',' + str(train_df_final['y_max'][i]) + ',' + train_df_final['2class'][i]
    f.write(data['format'][i])
    f.write("\n")
f.close()
```

```
(65038, 1)
```

```
In [0]:
```

```
test_df_final = test_df.copy()
test_df_final["2class"] = test_df_final['class_label'].replace(['schizont', 'difficult', 'ring', 'l
```

```
eukocyte', 'gametocyte', 'trophozoite'], "other")
test_df_final['class_label'].replace("red blood cell", "RBC", inplace= True)
test_df_final['2class'].replace("red blood cell", "RBC", inplace= True)
```

In [0]:

```
test_df_final.reset_index(inplace=True)
```

In [0]:

```
data = pd.DataFrame()
data['format'] = test_df_final['image']
for i in range(data.shape[0]):
    data['format'][i] = '/content/drive/My Drive/rcnn' + data['format'][i]

f= open(f"/content/drive/My Drive/rcnn/annotate_test_2class.txt","w+")
for i in range(data.shape[0]):
    data['format'][i] = data['format'][i] + ',' + str(test_df_final['x_min'][i]) + ',' + str(test_df_
_final['y_min'][i]) + ',' + str(test_df_final['x_max'][i]) + ',' + str(test_df_final['y_max'][i]) +
',' + test_df_final['2class'][i]
    f.write(data['format'][i])
    f.write("\n")
f.close()
```

## Data for Second classifier

In [0]:

```
other =train_df_final[train_df_final['2class']=="other"]
```

In [0]:

```
other.reset_index(inplace = True)
```

In [0]:

```
other.head()
```

Out[0]:

|   | level_0 | index | image  | y_max | y_min | x_max | x_min | class_label | avialability | 2class |
|---|---------|-------|--|-------|-------|-------|-------|-------------|--------------|--------|
| 0 | 78      | 78    | /images/6b14c855-8561-417c-97a4-63fa552842fd.png | 219   | 76    | 626   | 482   | schizont    | True         | other  |
| 1 | 79      | 79    | /images/6b14c855-8561-417c-97a4-63fa552842fd.png | 1143  | 1020  | 1314  | 1156  | difficult   | True         | other  |
| 2 | 82      | 82    | /images/13099edb-35d9-438f-b093-2cf2ebf9d255.png | 337   | 208   | 446   | 324   | ring        | True         | other  |
| 3 | 125     | 125   | /images/2559636b-f01a-4414-93da-210c3b12d153.png | 803   | 661   | 558   | 422   | difficult   | True         | other  |
| 4 | 138     | 138   | /images/2559636b-f01a-4414-93da-210c3b12d153.png | 324   | 169   | 717   | 576   | difficult   | True         | other  |

In [0]:

```
y = other["class_label"]
```

In [0]:

```
np.savez("/content/drive/My Drive/rcnn/train_image_array/y_target", y)
```

In [0]:

```
y_train = np.load("/content/drive/My Drive/rcnn/train_image_array/y_target.npz")
```

In [0]:

```
y_train["arr_0"].shape
```

Out[0]:

(2163,)

In [0]:

```
import cv2
x = []
y = []
WIDTH = 64
HEIGHT = 64

for i in tqdm(range(other.shape[0])):
    image = plt.imread('/content/drive/My Drive/rcnn/' + other["image"][i])
    image_crop = image[other["y_min"][i]:other["y_max"][i], other["x_min"][i]:other["x_max"][i]]
    x.append(cv2.resize(image_crop, (WIDTH, HEIGHT), interpolation=cv2.INTER_CUBIC))
```

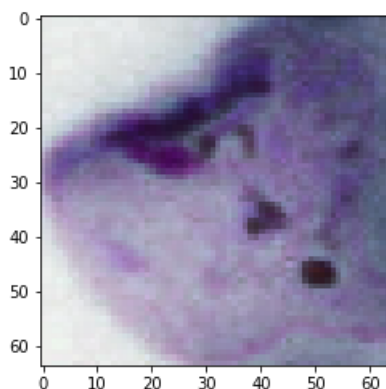
100%|██████████| 2163/2163 [05:49<00:00, 6.46it/s]

In [0]:

```
np.savez("/content/drive/My Drive/rcnn/train_image_array/x_train_images_arrays_64pix", x)
```

In [0]:

```
from matplotlib import pyplot as plt
plt.imshow(x_test["arr_0"][1], interpolation='nearest')
plt.show()
```



In [0]:

```
other_test = test_df_final[test_df_final['2class']=="other"]
```

In [0]:

```
other_test.reset_index(inplace = True)
```

In [0]:

```
other_test.head()
```

Out[0]:

|   | level_0 | index | image  | y_max | y_min | x_max | x_min | class_label | avialability | 2class |
|---|---------|-------|--|-------|-------|-------|-------|-------------|--------------|--------|
| 0 | 54      | 54    | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 200   | 52    | 409   | 279   | trophozoite | True         | other  |
| 1 | 61      | 61    | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 578   | 441   | 1155  | 1037  | trophozoite | True         | other  |
| 2 | 62      | 62    | /images/8d02117d-6c71-4e47-b50a-6cc8d5eb1d55.png | 1172  | 1050  | 1454  | 1273  | trophozoite | True         | other  |
| 3 | 92      | 92    | /images/0dcca702-a4ef-4fb3-a940-9c0c140b21c7.png | 317   | 194   | 356   | 237   | trophozoite | True         | other  |
| 4 | 94      | 94    | /images/0dcca702-a4ef-4fb3-a940-9c0c140b21c7.png | 713   | 578   | 178   | 53    | trophozoite | True         | other  |

In [0]:

```
y_test = other_test["class_label"]
```

In [0]:

```
np.savez("/content/drive/My Drive/rcnn/test_image_array/y_target_test", y_test)
```

In [0]:

```
import cv2
x = []
y = []
WIDTH = 64
HEIGHT = 64

for i in tqdm(range(other_test.shape[0])):
    image = plt.imread('/content/drive/My Drive/rcnn/' + other_test["image"][i])
    image_crop = image[other_test["y_min"][i]:other_test["y_max"][i], other_test["x_min"][i]:other_test["x_max"][i]]
    x.append(cv2.resize(image_crop, (WIDTH, HEIGHT), interpolation=cv2.INTER_CUBIC))

100%|██████████| 527/527 [03:26<00:00, 2.49it/s]
```

In [0]:

```
np.savez("/content/drive/My Drive/rcnn/test_image_array/x_images_arrays_test_64pix", x)
```

In [0]:

```
x_test = np.load("/content/drive/My Drive/rcnn/test_image_array/x_images_arrays_test_64pix.npz")
```

## First level Classifier Training

### Using weights from the model trained before

In [0]:

```
!python train_frcnn.py \
-o simple \
-p /content/drive/My Drive/rcnn/annotate_train_2class.txt \
--config_filename /content/drive/My Drive/rcnn/Data_model_2/config.pickle \
--output_weight_path /content/drive/My Drive/rcnn/Data_model_2/model_frcnn.hdf5 \
--hf True \
--vf True \
--rot True \
--result_path /content/drive/My Drive/rcnn/Data_model/result_df.csv \
--input_weight_path /content/drive/My Drive/rcnn/Data_model/model_frcnn.hdf5 \
--num_epochs 1000
```

Using TensorFlow backend.

Parsing annotation files

959

Training images per class:

```
{'RBC': 62875, 'bg': 0, 'other': 2163}
```

Num classes (including bg) = 3

Config has been written to /content/drive/My Drive/rcnn/Data\_model\_2/config.pickle, and can be loaded when testing to ensure correct results

Num train samples 795

Num val samples 164

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:47: The name tf.get\_default\_graph is deprecated. Please use tf.compat.v1.get\_default\_graph instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:351: The name tf.placeholder is deprecated. Please use tf.compat.v1.placeholder instead.

e tf.compat.v1.placeholder instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3176: The name tf.random\_uniform is deprecated. Please use tf.random.uniform instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3043: The name tf.nn.max\_pool is deprecated. Please use tf.nn.max\_pool2d instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3153: The name tf.random\_normal is deprecated. Please use tf.random.normal instead.

WARNING:tensorflow:From /content/keras-frcnn/keras\_frcnn/RoiPoolingConv.py:105: The name tf.image.resize\_images is deprecated. Please use tf.image.resize instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3045: The name tf.nn.avg\_pool is deprecated. Please use tf.nn.avg\_pool2d instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:1064: calling reduce\_prod\_v1 (from tensorflow.python.ops.math\_ops) with keep\_dims is deprecated and will be removed in a future version.

Instructions for updating:

keep\_dims is deprecated, use keepdims instead

loading weights from /content/drive/My Drive/rcnn/Data\_model/model\_frcnn.hdf5

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:141: The name tf.get\_default\_session is deprecated. Please use tf.compat.v1.get\_default\_session instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:146: The name tf.ConfigProto is deprecated. Please use tf.compat.v1.ConfigProto instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:151: The name tf.Session is deprecated. Please use tf.compat.v1.Session instead.

2019-11-26 01:49:27.615781: I tensorflow/core/platform/profile\_utils/cpu\_utils.cc:94] CPU Frequency: 2200000000 Hz

2019-11-26 01:49:27.616050: I tensorflow/compiler/xla/service/service.cc:168] XLA service

0x817c540 initialized for platform Host (this does not guarantee that XLA will be used). Devices:

2019-11-26 01:49:27.616085: I tensorflow/compiler/xla/service/service.cc:176] StreamExecutor device (0): Host, Default Version

2019-11-26 01:49:27.618335: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcuda.so.1

2019-11-26 01:49:27.769229: I tensorflow/stream\_executor/cuda/cuda\_gpu\_executor.cc:983] successful NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so returning NUMA node zero

2019-11-26 01:49:27.770110: I tensorflow/compiler/xla/service/service.cc:168] XLA service

0x817c700 initialized for platform CUDA (this does not guarantee that XLA will be used). Devices:

2019-11-26 01:49:27.770145: I tensorflow/compiler/xla/service/service.cc:176] StreamExecutor device (0): Tesla P100-PCIE-16GB, Compute Capability 6.0

2019-11-26 01:49:27.770388: I tensorflow/stream\_executor/cuda/cuda\_gpu\_executor.cc:983] successful NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so returning NUMA node zero

2019-11-26 01:49:27.770925: I tensorflow/core/common\_runtime/gpu/gpu\_device.cc:1618] Found device 0 with properties:

name: Tesla P100-PCIE-16GB major: 6 minor: 0 memoryClockRate(GHz): 1.3285

pciBusID: 0000:00:04.0

2019-11-26 01:49:27.771319: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcudart.so.10.1

2019-11-26 01:49:27.773084: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcublas.so.10

2019-11-26 01:49:27.775129: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcufft.so.10

2019-11-26 01:49:27.775557: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcurand.so.10

2019-11-26 01:49:27.777375: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcusolver.so.10

2019-11-26 01:49:27.778237: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcusparse.so.10

2019-11-26 01:49:27.781991: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcudnn.so.7

2019-11-26 01:49:27.782120: I tensorflow/stream\_executor/cuda/cuda\_gpu\_executor.cc:983] successful

```
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 01:49:27.782682: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 01:49:27.783163: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1746] Adding
visible gpu devices: 0
2019-11-26 01:49:27.783243: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudart.so.10.1
2019-11-26 01:49:27.784486: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1159] Device
interconnect StreamExecutor with strength 1 edge matrix:
2019-11-26 01:49:27.784513: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1165]      0
2019-11-26 01:49:27.784537: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1178] 0:  N
2019-11-26 01:49:27.784669: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 01:49:27.785198: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 01:49:27.785711: W tensorflow/core/common_runtime/gpu/gpu_bfc_allocator.cc:39]
Overriding allow_growth setting because the TF_FORCE_GPU_ALLOW_GROWTH environment variable is set.
Original config value was 0.
2019-11-26 01:49:27.785764: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1304] Created
TensorFlow device (/job:localhost/replica:0/task:0/device:GPU:0 with 15216 MB memory) -> physical
GPU (device: 0, name: Tesla P100-PCIE-16GB, pci bus id: 0000:00:04.0, compute capability: 6.0)
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:300: The name tf.global_variables is deprecated. Plea
se use tf.compat.v1.global_variables instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:308: The name tf.variables_initializer is deprecated.
Please use tf.compat.v1.variables_initializer instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/optimizers.py:675: The name t
f.train.Optimizer is deprecated. Please use tf.compat.v1.train.Optimizer instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:2642: The name tf.log is deprecated. Please use tf.ma
th.log instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/tensorflow_core/python/ops/nn_impl.py:183: where (from tensorflow.python.ops.array_ops) i
s deprecated and will be removed in a future version.
Instructions for updating:
Use tf.where in 2.0, which has the same broadcast rule as np.where
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:1046: calling reduce_sum_v1 (from
tensorflow.python.ops.math_ops) with keep_dims is deprecated and will be removed in a future
version.
Instructions for updating:
keep_dims is deprecated, use keepdims instead
Starting training
Epoch 1/1000
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:768: The name tf.assign_add is deprecated. Please use
tf.compat.v1.assign_add instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:521: calling Constant.__init__ (from
tensorflow.python.ops.init_ops) with dtype is deprecated and will be removed in a future version.
Instructions for updating:
Call initializer instance with the dtype argument instead of passing it to the constructor
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:764: The name tf.assign is deprecated. Please use tf.
compat.v1.assign instead.

2019-11-26 01:49:53.782728: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudnn.so.7
2019-11-26 01:49:54.981417: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcublas.so.10
10/10 [=====] - 63s - rpn_cls: 0.0693 - rpn_regr: 0.0769 - detector_cls:
0.8073 - detector_regr: 0.3187
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.1
Classifier accuracy for bounding boxes from RPN: 0.771875
Loss RPN classifier: 0.06925069633871317
Loss RPN regression: 0.07691423743963241
Loss Detector classifier: 0.8072995007038116
```

Loss Detector regression: 0.3186818853020668  
Elapsed time: 63.12841248512268  
Total loss decreased from inf to 1.272146319784224, saving weights

In [0]:

```
!python train_frcnn.py \
-o simple \
-p /content/drive/My\ Drive/rcnn/annotate_train_2class.txt \
--config_filename /content/drive/My\ Drive/rcnn/Data_model_2/config.pickle \
--output_weight_path /content/drive/My\ Drive/rcnn/Data_model_2/model_frcnn.hdf5 \
--hf True \
--vf True \
--rot True \
--is_it_resume = True \
--result_path /content/drive/My\ Drive/rcnn/Data_model/result_df.csv \
--input_weight_path /content/drive/My\ Drive/rcnn/Data_model_2/model_frcnn.hdf5 \
--num_epochs 1000
```

Using TensorFlow backend.

Parsing annotation files

959

Training images per class:

{'RBC': 62875, 'bg': 0, 'other': 2163}

Num classes (including bg) = 3

Config has been written to /content/drive/My Drive/rcnn/Data\_model\_2/config.pickle, and can be loaded when testing to ensure correct results

Num train samples 824

Num val samples 135

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:47: The name tf.get\_default\_graph is deprecated. Please use tf.compat.v1.get\_default\_graph instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:351: The name tf.placeholder is deprecated. Please use tf.compat.v1.placeholder instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3176: The name tf.random\_uniform is deprecated. Please use tf.random.uniform instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3043: The name tf.nn.max\_pool is deprecated. Please use tf.nn.max\_pool2d instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3153: The name tf.random\_normal is deprecated. Please use tf.random.normal instead.

WARNING:tensorflow:From /content/keras-frcnn/keras\_frcnn/RoiPoolingConv.py:105: The name tf.image.resize\_images is deprecated. Please use tf.image.resize instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:3045: The name tf.nn.avg\_pool is deprecated. Please use tf.nn.avg\_pool2d instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:1064: calling reduce\_prod\_v1 (from tensorflow.python.ops.math\_ops) with keep\_dims is deprecated and will be removed in a future version.

Instructions for updating:

keep\_dims is deprecated, use keepdims instead

Continue training based on previous trained model

Loading weights from /content/drive/My Drive/rcnn/Data\_model\_2/model\_frcnn.hdf5

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:141: The name tf.get\_default\_session is deprecated. Please use tf.compat.v1.get\_default\_session instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:146: The name tf.ConfigProto is deprecated. Please use tf.compat.v1.ConfigProto instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:151: The name tf.Session is deprecated. Please use tf.compat.v1.Session instead.



```

2019-11-26 15:46:17.408237: I tensorflow/core/platform/profile_utils/cpu_utils.cc:94] CPU
Frequency: 2200000000 Hz
2019-11-26 15:46:17.410526: I tensorflow/compiler/xla/service/service.cc:168] XLA service
0x8f5e540 initialized for platform Host (this does not guarantee that XLA will be used). Devices:
2019-11-26 15:46:17.410559: I tensorflow/compiler/xla/service/service.cc:176] StreamExecutor dev
ice (0): Host, Default Version
2019-11-26 15:46:17.417990: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcuda.so.1
2019-11-26 15:46:17.582028: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 15:46:17.582874: I tensorflow/compiler/xla/service/service.cc:168] XLA service
0x8f5e700 initialized for platform CUDA (this does not guarantee that XLA will be used). Devices:
2019-11-26 15:46:17.582921: I tensorflow/compiler/xla/service/service.cc:176] StreamExecutor dev
ice (0): Tesla K80, Compute Capability 3.7
2019-11-26 15:46:17.584272: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 15:46:17.584977: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1618] Found device
0 with properties:
name: Tesla K80 major: 3 minor: 7 memoryClockRate(GHz): 0.8235
pciBusID: 0000:00:04.0
2019-11-26 15:46:17.610595: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudart.so.10.1
2019-11-26 15:46:17.867107: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcublas.so.10
2019-11-26 15:46:18.011457: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcufft.so.10
2019-11-26 15:46:18.040866: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcurand.so.10
2019-11-26 15:46:18.316853: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcusolver.so.10
2019-11-26 15:46:18.352949: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcusparses.so.10
2019-11-26 15:46:18.845265: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudnn.so.7
2019-11-26 15:46:18.845471: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 15:46:18.846293: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 15:46:18.846985: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1746] Adding
visible gpu devices: 0
2019-11-26 15:46:18.852147: I tensorflow/stream_executor/platform/default/dso_loader.cc:44]
Successfully opened dynamic library libcudart.so.10.1
2019-11-26 15:46:18.853892: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1159] Device
interconnect StreamExecutor with strength 1 edge matrix:
2019-11-26 15:46:18.853951: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1165] 0
2019-11-26 15:46:18.853969: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1178] 0: N
2019-11-26 15:46:18.855266: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 15:46:18.856061: I tensorflow/stream_executor/cuda/cuda_gpu_executor.cc:983] successful
NUMA node read from SysFS had negative value (-1), but there must be at least one NUMA node, so re
turning NUMA node zero
2019-11-26 15:46:18.856766: W tensorflow/core/common_runtime/gpu/gpu_bfc_allocator.cc:39]
Overriding allow_growth setting because the TF_FORCE_GPU_ALLOW_GROWTH environment variable is set.
Original config value was 0.
2019-11-26 15:46:18.856821: I tensorflow/core/common_runtime/gpu/gpu_device.cc:1304] Created
TensorFlow device (/job:localhost/replica:0/task:0/device:GPU:0 with 10805 MB memory) -> physical
GPU (device: 0, name: Tesla K80, pci bus id: 0000:00:04.0, compute capability: 3.7)
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:300: The name tf.global_variables is deprecated. Plea
se use tf.compat.v1.global_variables instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:308: The name tf.variables_initializer is deprecated.
Please use tf.compat.v1.variables_initializer instead.

for 638 batches training already done
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/optimizers.py:675: The name t
f.train.Optimizer is deprecated. Please use tf.compat.v1.train.Optimizer instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-
packages/keras/backend/tensorflow_backend.py:2642: The name tf.log is deprecated. Please use tf.ma

```

th.log instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/tensorflow\_core/python/ops/nn\_impl.py:183: where (from tensorflow.python.ops.array\_ops) is deprecated and will be removed in a future version.  
Instructions for updating:

Use tf.where in 2.0, which has the same broadcast rule as np.where

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:1046: calling reduce\_sum\_v1 (from tensorflow.python.ops.math\_ops) with keep\_dims is deprecated and will be removed in a future version.

Instructions for updating:

keep\_dims is deprecated, use keepdims instead

Starting training

Epoch 639/1000

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:768: The name tf.assign\_add is deprecated. Please use tf.compat.v1.assign\_add instead.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:521: calling Constant.\_\_init\_\_ (from tensorflow.python.ops.init\_ops) with dtype is deprecated and will be removed in a future version.  
Instructions for updating:

Call initializer instance with the dtype argument instead of passing it to the constructor

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow\_backend.py:764: The name tf.assign is deprecated. Please use tf.compat.v1.assign instead.

2019-11-26 15:46:34.800018: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcudnn.so.7

2019-11-26 15:46:37.561162: I tensorflow/stream\_executor/platform/default/dso\_loader.cc:44] Successfully opened dynamic library libcublas.so.10

10/10 [=====] - 75s - rpn\_cls: 0.0590 - rpn\_regr: 0.0690 - detector\_cls: 0.2145 - detector\_regr: 0.1495

Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.9

Classifier accuracy for bounding boxes from RPN: 0.93125

Loss RPN classifier: 0.0590085431933403

Loss RPN regression: 0.06898028217256069

Loss Detector classifier: 0.2144749492406845

Loss Detector regression: 0.14951172694563866

Elapsed time: 75.71249151229858

Epoch 640/1000

Average number of overlapping bounding boxes from RPN = 55.9 for 10 previous iterations

10/10 [=====] - 52s - rpn\_cls: 0.0512 - rpn\_regr: 0.0468 - detector\_cls: 0.1998 - detector\_regr: 0.1142

Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.7

Classifier accuracy for bounding boxes from RPN: 0.91875

Loss RPN classifier: 0.05119566682260483

Loss RPN regression: 0.04681209363043308

Loss Detector classifier: 0.19977395609021187

Loss Detector regression: 0.1141920942813158

Elapsed time: 52.43154335021973

Epoch 641/1000

Average number of overlapping bounding boxes from RPN = 47.7 for 10 previous iterations

10/10 [=====] - 53s - rpn\_cls: 0.0406 - rpn\_regr: 0.0532 - detector\_cls: 0.1808 - detector\_regr: 0.1066

Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.9

Classifier accuracy for bounding boxes from RPN: 0.9375

Loss RPN classifier: 0.04064762368798256

Loss RPN regression: 0.0531753545626998

Loss Detector classifier: 0.1807691439986229

Loss Detector regression: 0.10661813952028751

Elapsed time: 53.84111452102661

Epoch 642/1000

Average number of overlapping bounding boxes from RPN = 51.9 for 10 previous iterations

10/10 [=====] - 46s - rpn\_cls: 0.0400 - rpn\_regr: 0.0559 - detector\_cls: 0.2493 - detector\_regr: 0.1348

Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.8

Classifier accuracy for bounding boxes from RPN: 0.909375

Loss RPN classifier: 0.039980470389127734

Loss RPN regression: 0.05589344250038266

Loss Detector classifier: 0.2493479423224926

Loss Detector regression: 0.13482510000467302

Elapsed time: 46.78916358947754

Epoch 643/1000

Average number of overlapping bounding boxes from RPN = 44.8 for 10 previous iterations

10/10 [=====] - 48s - rpn\_cls: 0.0748 - rpn\_regr: 0.0625 - detector\_cls: 0.2145 - detector\_regr: 0.1495

0.2401 - detector\_regr: 0.1213  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.2  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.07475192109122872  
Loss RPN regression: 0.06250725984573365  
Loss Detector classifier: 0.2400842897593975  
Loss Detector regression: 0.12133177518844604  
Elapsed time: 48.85868811607361  
Epoch 644/1000  
Average number of overlapping bounding boxes from RPN = 57.2 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0367 - rpn\_regr: 0.0433 - detector\_cls:  
0.2446 - detector\_regr: 0.0867  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.6  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.036732652597129344  
Loss RPN regression: 0.043272065743803975  
Loss Detector classifier: 0.24457948841154575  
Loss Detector regression: 0.08674516528844833  
Elapsed time: 50.907498836517334  
Epoch 645/1000  
Average number of overlapping bounding boxes from RPN = 48.6 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0297 - rpn\_regr: 0.0496 - detector\_cls:  
0.1242 - detector\_regr: 0.0933  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.8  
Classifier accuracy for bounding boxes from RPN: 0.953125  
Loss RPN classifier: 0.029715158604085447  
Loss RPN regression: 0.04963621012866497  
Loss Detector classifier: 0.12416816782206297  
Loss Detector regression: 0.09327775724232197  
Elapsed time: 54.285624742507935  
Total loss decreased from 0.3 to 0.2967972937971354, saving weights  
Epoch 646/1000  
Average number of overlapping bounding boxes from RPN = 45.8 for 10 previous iterations  
10/10 [=====] - 44s - rpn\_cls: 0.0464 - rpn\_regr: 0.0481 - detector\_cls:  
0.2535 - detector\_regr: 0.1243  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.3  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.04643002764787525  
Loss RPN regression: 0.04812058359384537  
Loss Detector classifier: 0.25353268533945084  
Loss Detector regression: 0.12429827898740768  
Elapsed time: 69.68431758880615  
Epoch 647/1000  
Average number of overlapping bounding boxes from RPN = 51.3 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0612 - rpn\_regr: 0.0664 - detector\_cls:  
0.2392 - detector\_regr: 0.1142  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 39.3  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.06124768918380141  
Loss RPN regression: 0.06642891205847264  
Loss Detector classifier: 0.23920159339904784  
Loss Detector regression: 0.11415575370192528  
Elapsed time: 52.74235272407532  
Epoch 648/1000  
Average number of overlapping bounding boxes from RPN = 39.3 for 10 previous iterations  
10/10 [=====] - 66s - rpn\_cls: 0.0555 - rpn\_regr: 0.0655 - detector\_cls:  
0.2095 - detector\_regr: 0.1099  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.9  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.05552452830597758  
Loss RPN regression: 0.06552432663738728  
Loss Detector classifier: 0.2094934344291687  
Loss Detector regression: 0.1099365096539259  
Elapsed time: 66.4827766418457  
Epoch 649/1000  
Average number of overlapping bounding boxes from RPN = 55.9 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0621 - rpn\_regr: 0.0588 - detector\_cls:  
0.1754 - detector\_regr: 0.1094  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.6  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.06209403201937676  
Loss RPN regression: 0.058789499662816526  
Loss Detector classifier: 0.17541761323809624  
Loss Detector regression: 0.10939537957310677  
Elapsed time: 47.36315703392029  
Epoch 650/1000  
Average number of overlapping bounding boxes from RPN = 45.6 for 10 previous iterations

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10/10 [=====] - 53s - rpn_cls: 0.0688 - rpn_regr: 0.0550 - detector_cls:
0.1973 - detector_regr: 0.1197
Mean number of bounding boxes from RPN overlapping ground truth boxes: 62.8
Classifier accuracy for bounding boxes from RPN: 0.909375
Loss RPN classifier: 0.06882168180309237
Loss RPN regression: 0.055014944076538085
Loss Detector classifier: 0.19729389101266862
Loss Detector regression: 0.11971673928201199
Elapsed time: 53.43024969100952
Epoch 651/1000
Average number of overlapping bounding boxes from RPN = 62.8 for 10 previous iterations
10/10 [=====] - 50s - rpn_cls: 0.0474 - rpn_regr: 0.0554 - detector_cls:
0.1952 - detector_regr: 0.1437
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.5
Classifier accuracy for bounding boxes from RPN: 0.93125
Loss RPN classifier: 0.0473860340192914
Loss RPN regression: 0.0553880512714386
Loss Detector classifier: 0.19521675482392312
Loss Detector regression: 0.1437135711312294
Elapsed time: 50.58834648132324
Epoch 652/1000
Average number of overlapping bounding boxes from RPN = 55.5 for 10 previous iterations
10/10 [=====] - 49s - rpn_cls: 0.0428 - rpn_regr: 0.0448 - detector_cls:
0.2065 - detector_regr: 0.1009
Mean number of bounding boxes from RPN overlapping ground truth boxes: 42.6
Classifier accuracy for bounding boxes from RPN: 0.909375
Loss RPN classifier: 0.04279338587075472
Loss RPN regression: 0.04484131261706352
Loss Detector classifier: 0.20651212334632874
Loss Detector regression: 0.1008868519216776
Elapsed time: 49.028931856155396
Epoch 653/1000
Average number of overlapping bounding boxes from RPN = 42.6 for 10 previous iterations
10/10 [=====] - 43s - rpn_cls: 0.0711 - rpn_regr: 0.0504 - detector_cls:
0.2020 - detector_regr: 0.1238
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.9
Classifier accuracy for bounding boxes from RPN: 0.9125
Loss RPN classifier: 0.07107494380325079
Loss RPN regression: 0.050401298142969606
Loss Detector classifier: 0.20201117917895317
Loss Detector regression: 0.12377372048795224
Elapsed time: 43.48554515838623
Epoch 654/1000
Average number of overlapping bounding boxes from RPN = 53.9 for 10 previous iterations
10/10 [=====] - 50s - rpn_cls: 0.0595 - rpn_regr: 0.0587 - detector_cls:
0.2091 - detector_regr: 0.1273
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.9
Classifier accuracy for bounding boxes from RPN: 0.91875
Loss RPN classifier: 0.0594542388105765
Loss RPN regression: 0.05869706925004721
Loss Detector classifier: 0.20911951065063478
Loss Detector regression: 0.12730808556079865
Elapsed time: 50.49088382720947
Epoch 655/1000
Average number of overlapping bounding boxes from RPN = 53.9 for 10 previous iterations
10/10 [=====] - 76s - rpn_cls: 0.0690 - rpn_regr: 0.0607 - detector_cls:
0.1521 - detector_regr: 0.1334
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.2
Classifier accuracy for bounding boxes from RPN: 0.953125
Loss RPN classifier: 0.06903036599978804
Loss RPN regression: 0.06066077630966902
Loss Detector classifier: 0.1520920604467392
Loss Detector regression: 0.13339840061962605
Elapsed time: 76.59145188331604
Epoch 656/1000
Average number of overlapping bounding boxes from RPN = 59.2 for 10 previous iterations
10/10 [=====] - 51s - rpn_cls: 0.0876 - rpn_regr: 0.0452 - detector_cls:
0.2312 - detector_regr: 0.1071
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.2
Classifier accuracy for bounding boxes from RPN: 0.915625
Loss RPN classifier: 0.08756183702498674
Loss RPN regression: 0.045159243047237396
Loss Detector classifier: 0.23121372759342193
Loss Detector regression: 0.10708675421774387
Elapsed time: 51.54957938194275
Epoch 657/1000
Average number of overlapping bounding boxes from RPN = 47.2 for 10 previous iterations
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10/10 [=====] - 64s - rpn\_cls: 0.0657 - rpn\_regr: 0.0670 - detector\_cls: 0.2102 - detector\_regr: 0.1334  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.3  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.06572106694802642  
Loss RPN regression: 0.06701905876398087  
Loss Detector classifier: 0.21018886491656302  
Loss Detector regression: 0.13343881219625472  
Elapsed time: 64.59465909004211  
Epoch 658/1000  
Average number of overlapping bounding boxes from RPN = 59.3 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0758 - rpn\_regr: 0.0696 - detector\_cls: 0.2083 - detector\_regr: 0.1216  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.0  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.07578743072226643  
Loss RPN regression: 0.06962883211672306  
Loss Detector classifier: 0.2083028480410576  
Loss Detector regression: 0.12155016586184501  
Elapsed time: 47.44895887374878  
Epoch 659/1000  
Average number of overlapping bounding boxes from RPN = 46.0 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0528 - rpn\_regr: 0.0571 - detector\_cls: 0.2281 - detector\_regr: 0.1086  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.2  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.052778211794793604  
Loss RPN regression: 0.05711888186633587  
Loss Detector classifier: 0.22805655747652054  
Loss Detector regression: 0.10864579118788242  
Elapsed time: 59.36393356323242  
Epoch 660/1000  
Average number of overlapping bounding boxes from RPN = 57.2 for 10 previous iterations  
10/10 [=====] - 66s - rpn\_cls: 0.0560 - rpn\_regr: 0.0522 - detector\_cls: 0.2436 - detector\_regr: 0.1265  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.8  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.05600433491636068  
Loss RPN regression: 0.05218547023832798  
Loss Detector classifier: 0.2435937039554119  
Loss Detector regression: 0.1264534592628479  
Elapsed time: 66.69293355941772  
Epoch 661/1000  
Average number of overlapping bounding boxes from RPN = 51.8 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0309 - rpn\_regr: 0.0443 - detector\_cls: 0.1547 - detector\_regr: 0.1122  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.7  
Classifier accuracy for bounding boxes from RPN: 0.959375  
Loss RPN classifier: 0.030903359549120067  
Loss RPN regression: 0.044257388450205326  
Loss Detector classifier: 0.15465038791298866  
Loss Detector regression: 0.11223613359034061  
Elapsed time: 45.71200180053711  
Epoch 662/1000  
Average number of overlapping bounding boxes from RPN = 47.7 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0515 - rpn\_regr: 0.0679 - detector\_cls: 0.2041 - detector\_regr: 0.1479  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.9  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.05148451353888959  
Loss RPN regression: 0.06792250238358974  
Loss Detector classifier: 0.20412103980779647  
Loss Detector regression: 0.1478625051677227  
Elapsed time: 50.595303773880005  
Epoch 663/1000  
Average number of overlapping bounding boxes from RPN = 49.9 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0429 - rpn\_regr: 0.0471 - detector\_cls: 0.1883 - detector\_regr: 0.1028  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.4  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.042897989298217  
Loss RPN regression: 0.04706843700259924  
Loss Detector classifier: 0.1883487068116665  
Loss Detector regression: 0.10280811749398708  
Elapsed time: 49.78872060775757  
Epoch 664/1000  
Average number of overlapping bounding boxes from RPN = 44.4 for 10 previous iterations

10/10 [=====] - 49s - rpn\_cls: 0.0516 - rpn\_regr: 0.0465 - detector\_cls: 0.2241 - detector\_regr: 0.0926  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.4  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.0515696725808084  
Loss RPN regression: 0.046508082561194895  
Loss Detector classifier: 0.22407477386295796  
Loss Detector regression: 0.09258748143911362  
Elapsed time: 49.1850950717926  
Epoch 665/1000  
Average number of overlapping bounding boxes from RPN = 54.4 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0632 - rpn\_regr: 0.0592 - detector\_cls: 0.2695 - detector\_regr: 0.1361  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.7  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.06318703200668097  
Loss RPN regression: 0.05923810601234436  
Loss Detector classifier: 0.2694627016782761  
Loss Detector regression: 0.13606801740825175  
Elapsed time: 54.91986680030823  
Epoch 666/1000  
Average number of overlapping bounding boxes from RPN = 57.7 for 10 previous iterations  
10/10 [=====] - 71s - rpn\_cls: 0.0507 - rpn\_regr: 0.0669 - detector\_cls: 0.2841 - detector\_regr: 0.1453  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.6  
Classifier accuracy for bounding boxes from RPN: 0.878125  
Loss RPN classifier: 0.05066157463006675  
Loss RPN regression: 0.0668539335951209  
Loss Detector classifier: 0.28406869918107985  
Loss Detector regression: 0.14526931345462799  
Elapsed time: 71.97181963920593  
Epoch 667/1000  
Average number of overlapping bounding boxes from RPN = 46.6 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0474 - rpn\_regr: 0.0557 - detector\_cls: 0.1877 - detector\_regr: 0.1378  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.8  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.047361532610375436  
Loss RPN regression: 0.05565587095916271  
Loss Detector classifier: 0.18772749453783036  
Loss Detector regression: 0.1377542346715927  
Elapsed time: 46.26276707649231  
Epoch 668/1000  
Average number of overlapping bounding boxes from RPN = 48.8 for 10 previous iterations  
10/10 [=====] - 77s - rpn\_cls: 0.0313 - rpn\_regr: 0.0421 - detector\_cls: 0.2170 - detector\_regr: 0.1121  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.0  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.031269254675135014  
Loss RPN regression: 0.04208724796772003  
Loss Detector classifier: 0.21702634692192077  
Loss Detector regression: 0.11211919486522674  
Elapsed time: 77.94978046417236  
Epoch 669/1000  
Average number of overlapping bounding boxes from RPN = 59.0 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0434 - rpn\_regr: 0.0535 - detector\_cls: 0.1856 - detector\_regr: 0.1196  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.0  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04342578044161201  
Loss RPN regression: 0.05347722955048084  
Loss Detector classifier: 0.18560592755675315  
Loss Detector regression: 0.11963489428162574  
Elapsed time: 51.157087326049805  
Epoch 670/1000  
Average number of overlapping bounding boxes from RPN = 54.0 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0563 - rpn\_regr: 0.0457 - detector\_cls: 0.1898 - detector\_regr: 0.0944  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.7  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.056262388825416565  
Loss RPN regression: 0.045686458703130484  
Loss Detector classifier: 0.1898364879190922  
Loss Detector regression: 0.09438346587121486  
Elapsed time: 46.2079062461853  
Epoch 671/1000  
Average number of overlapping bounding boxes from RPN = 47.7 for 10 previous iterations

10/10 [=====] - 55s - rpn\_cls: 0.0742 - rpn\_regr: 0.0408 - detector\_cls: 0.2530 - detector\_regr: 0.1158  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.7  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.07416916145011783  
Loss RPN regression: 0.040768014080822465  
Loss Detector classifier: 0.25296511352062223  
Loss Detector regression: 0.11575172916054725  
Elapsed time: 55.75312829017639  
Epoch 672/1000  
Average number of overlapping bounding boxes from RPN = 52.7 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0606 - rpn\_regr: 0.0552 - detector\_cls: 0.2059 - detector\_regr: 0.1349  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.0  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.06057680789381266  
Loss RPN regression: 0.05521942209452391  
Loss Detector classifier: 0.2059437043964863  
Loss Detector regression: 0.13492288067936897  
Elapsed time: 49.98382902145386  
Epoch 673/1000  
Average number of overlapping bounding boxes from RPN = 57.0 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0412 - rpn\_regr: 0.0596 - detector\_cls: 0.2292 - detector\_regr: 0.1391  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.1  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.041224641166627406  
Loss RPN regression: 0.05958160702139139  
Loss Detector classifier: 0.2292248338460922  
Loss Detector regression: 0.13908080607652665  
Elapsed time: 47.894521951675415  
Epoch 674/1000  
Average number of overlapping bounding boxes from RPN = 48.1 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0831 - rpn\_regr: 0.0598 - detector\_cls: 0.2521 - detector\_regr: 0.1329  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.2  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.08306622039526701  
Loss RPN regression: 0.059750885143876074  
Loss Detector classifier: 0.2521448813378811  
Loss Detector regression: 0.13292311504483223  
Elapsed time: 51.60185527801514  
Epoch 675/1000  
Average number of overlapping bounding boxes from RPN = 51.2 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0549 - rpn\_regr: 0.0380 - detector\_cls: 0.1765 - detector\_regr: 0.0904  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.8  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.05491346586495638  
Loss RPN regression: 0.03800294846296311  
Loss Detector classifier: 0.17650039345026017  
Loss Detector regression: 0.09038260355591773  
Elapsed time: 45.49483370780945  
Epoch 676/1000  
Average number of overlapping bounding boxes from RPN = 51.8 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0773 - rpn\_regr: 0.0621 - detector\_cls: 0.2100 - detector\_regr: 0.1224  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.7  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.07728251405060291  
Loss RPN regression: 0.062074339389801024  
Loss Detector classifier: 0.2100255586206913  
Loss Detector regression: 0.1223984494805336  
Elapsed time: 58.7004599571228  
Epoch 677/1000  
Average number of overlapping bounding boxes from RPN = 59.7 for 10 previous iterations  
10/10 [=====] - 39s - rpn\_cls: 0.0550 - rpn\_regr: 0.0538 - detector\_cls: 0.2488 - detector\_regr: 0.1236  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 43.5  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.054951688391156495  
Loss RPN regression: 0.053756493143737316  
Loss Detector classifier: 0.24879891201853752  
Loss Detector regression: 0.12361745089292527  
Elapsed time: 39.5863995552063  
Epoch 678/1000  
Average number of overlapping bounding boxes from RPN = 43.5 for 10 previous iterations

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10/10 [=====] - 59s - rpn_cls: 0.0561 - rpn_regr: 0.0647 - detector_cls:
0.2151 - detector_regr: 0.1320
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.9
Classifier accuracy for bounding boxes from RPN: 0.9125
Loss RPN classifier: 0.05605865186080337
Loss RPN regression: 0.06471434906125069
Loss Detector classifier: 0.2150598406791687
Loss Detector regression: 0.1319762844592333
Elapsed time: 59.722283124923706
Epoch 679/1000
Average number of overlapping bounding boxes from RPN = 49.9 for 10 previous iterations
10/10 [=====] - 49s - rpn_cls: 0.0533 - rpn_regr: 0.0541 - detector_cls:
0.2271 - detector_regr: 0.1425
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.0
Classifier accuracy for bounding boxes from RPN: 0.925
Loss RPN classifier: 0.05327541087754071
Loss RPN regression: 0.05411188676953316
Loss Detector classifier: 0.22709986418485642
Loss Detector regression: 0.14253904968500136
Elapsed time: 49.32029366493225
Epoch 680/1000
Average number of overlapping bounding boxes from RPN = 60.0 for 10 previous iterations
10/10 [=====] - 44s - rpn_cls: 0.0658 - rpn_regr: 0.0505 - detector_cls:
0.1786 - detector_regr: 0.1078
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.2
Classifier accuracy for bounding boxes from RPN: 0.934375
Loss RPN classifier: 0.06580806174315512
Loss RPN regression: 0.0504775432869792
Loss Detector classifier: 0.17861011549830436
Loss Detector regression: 0.10777953118085862
Elapsed time: 44.113654375076294
Epoch 681/1000
Average number of overlapping bounding boxes from RPN = 49.2 for 10 previous iterations
10/10 [=====] - 50s - rpn_cls: 0.0266 - rpn_regr: 0.0482 - detector_cls:
0.1812 - detector_regr: 0.1220
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.0
Classifier accuracy for bounding boxes from RPN: 0.91875
Loss RPN classifier: 0.02661114539951086
Loss RPN regression: 0.0482452591881156
Loss Detector classifier: 0.18118094950914382
Loss Detector regression: 0.12204863578081131
Elapsed time: 50.65207386016846
Epoch 682/1000
Average number of overlapping bounding boxes from RPN = 57.0 for 10 previous iterations
10/10 [=====] - 38s - rpn_cls: 0.0520 - rpn_regr: 0.0385 - detector_cls:
0.1164 - detector_regr: 0.0756
Mean number of bounding boxes from RPN overlapping ground truth boxes: 40.6
Classifier accuracy for bounding boxes from RPN: 0.959375
Loss RPN classifier: 0.0519912526011467
Loss RPN regression: 0.03853098005056381
Loss Detector classifier: 0.11640476956963539
Loss Detector regression: 0.07562575936317444
Elapsed time: 38.29890441894531
Total loss decreased from 0.2967972937971354 to 0.2825527615845203, saving weights
Epoch 683/1000
Average number of overlapping bounding boxes from RPN = 40.6 for 10 previous iterations
10/10 [=====] - 67s - rpn_cls: 0.0517 - rpn_regr: 0.0547 - detector_cls:
0.1788 - detector_regr: 0.1139
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.5
Classifier accuracy for bounding boxes from RPN: 0.925
Loss RPN classifier: 0.051672054710797964
Loss RPN regression: 0.054703539423644545
Loss Detector classifier: 0.17876306772232056
Loss Detector regression: 0.11387946158647537
Elapsed time: 70.34049272537231
Epoch 684/1000
Average number of overlapping bounding boxes from RPN = 54.5 for 10 previous iterations
10/10 [=====] - 73s - rpn_cls: 0.0641 - rpn_regr: 0.0527 - detector_cls:
0.2508 - detector_regr: 0.1377
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.9
Classifier accuracy for bounding boxes from RPN: 0.89375
Loss RPN classifier: 0.06414699563756585
Loss RPN regression: 0.05268515218049288
Loss Detector classifier: 0.25083102732896806
Loss Detector regression: 0.1376650147140026
Elapsed time: 73.54775857925415
Epoch 685/1000
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Average number of overlapping bounding boxes from RPN = 59.9 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0436 - rpn\_regr: 0.0449 - detector\_cls:  
0.1795 - detector\_regr: 0.1125  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.6  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.04356631617993116  
Loss RPN regression: 0.044851438514888285  
Loss Detector classifier: 0.1794600747525692  
Loss Detector regression: 0.11253987550735474  
Elapsed time: 47.13520097732544  
Epoch 686/1000  
Average number of overlapping bounding boxes from RPN = 53.6 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0519 - rpn\_regr: 0.0453 - detector\_cls:  
0.2393 - detector\_regr: 0.1118  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.1  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.051928464137017724  
Loss RPN regression: 0.045296143554151055  
Loss Detector classifier: 0.23930810391902924  
Loss Detector regression: 0.11175096035003662  
Elapsed time: 45.070717573165894  
Epoch 687/1000  
Average number of overlapping bounding boxes from RPN = 45.1 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0380 - rpn\_regr: 0.0465 - detector\_cls:  
0.1395 - detector\_regr: 0.1092  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.8  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.03797101397067308  
Loss RPN regression: 0.046500241942703725  
Loss Detector classifier: 0.13945010900497437  
Loss Detector regression: 0.10919012650847434  
Elapsed time: 54.66089582443237  
Epoch 688/1000  
Average number of overlapping bounding boxes from RPN = 53.8 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0628 - rpn\_regr: 0.0422 - detector\_cls:  
0.2205 - detector\_regr: 0.1414  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.0  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.06281771687790752  
Loss RPN regression: 0.04215437835082412  
Loss Detector classifier: 0.22047810181975364  
Loss Detector regression: 0.14138349741697312  
Elapsed time: 45.85800862312317  
Epoch 689/1000  
Average number of overlapping bounding boxes from RPN = 52.0 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0695 - rpn\_regr: 0.0484 - detector\_cls:  
0.1751 - detector\_regr: 0.1098  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 41.7  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.06946513955481351  
Loss RPN regression: 0.048421171866357325  
Loss Detector classifier: 0.17505379542708396  
Loss Detector regression: 0.1097768485546112  
Elapsed time: 43.07603478431702  
Epoch 690/1000  
Average number of overlapping bounding boxes from RPN = 41.7 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0621 - rpn\_regr: 0.0510 - detector\_cls:  
0.2533 - detector\_regr: 0.1140  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.3  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.06212879493832588  
Loss RPN regression: 0.050952343828976156  
Loss Detector classifier: 0.25331203565001487  
Loss Detector regression: 0.11401130557060242  
Elapsed time: 49.15837478637695  
Epoch 691/1000  
Average number of overlapping bounding boxes from RPN = 53.3 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0499 - rpn\_regr: 0.0615 - detector\_cls:  
0.2095 - detector\_regr: 0.1380  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.9  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.04990088138729334  
Loss RPN regression: 0.0614622950553894  
Loss Detector classifier: 0.2095460757613182  
Loss Detector regression: 0.13795286044478416  
Elapsed time: 54.41742181777954  
Epoch 692/1000

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Average number of overlapping bounding boxes from RPN = 60.9 for 10 previous iterations  
10/10 [=====] - 41s - rpn\_cls: 0.0343 - rpn\_regr: 0.0437 - detector\_cls:  
0.1795 - detector\_regr: 0.1080  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.7  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.034267912479117514  
Loss RPN regression: 0.04373351354151964  
Loss Detector classifier: 0.17948597446084022  
Loss Detector regression: 0.10796330943703651  
Elapsed time: 41.03362536430359  
Epoch 693/1000  
Average number of overlapping bounding boxes from RPN = 51.7 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0428 - rpn\_regr: 0.0536 - detector\_cls:  
0.2460 - detector\_regr: 0.0995  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.2  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.042786980886012314  
Loss RPN regression: 0.053642479702830315  
Loss Detector classifier: 0.24599529057741165  
Loss Detector regression: 0.09952486604452133  
Elapsed time: 46.500229597091675  
Epoch 694/1000  
Average number of overlapping bounding boxes from RPN = 60.2 for 10 previous iterations  
10/10 [=====] - 37s - rpn\_cls: 0.0385 - rpn\_regr: 0.0368 - detector\_cls:  
0.2008 - detector\_regr: 0.0803  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 42.1  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.03846449707634747  
Loss RPN regression: 0.0367724634706974  
Loss Detector classifier: 0.20079742446541787  
Loss Detector regression: 0.08029945343732833  
Elapsed time: 37.846985816955566  
Epoch 695/1000  
Average number of overlapping bounding boxes from RPN = 42.1 for 10 previous iterations  
10/10 [=====] - 63s - rpn\_cls: 0.0451 - rpn\_regr: 0.0558 - detector\_cls:  
0.1868 - detector\_regr: 0.1349  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.7  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.0451019624248147  
Loss RPN regression: 0.05583418942987919  
Loss Detector classifier: 0.18684375658631325  
Loss Detector regression: 0.13493469059467317  
Elapsed time: 63.92430305480957  
Epoch 696/1000  
Average number of overlapping bounding boxes from RPN = 57.7 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0520 - rpn\_regr: 0.0642 - detector\_cls:  
0.2291 - detector\_regr: 0.1194  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.7  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.05199835831299424  
Loss RPN regression: 0.06420668680220842  
Loss Detector classifier: 0.22914879992604256  
Loss Detector regression: 0.11937644965946674  
Elapsed time: 45.455262184143066  
Epoch 697/1000  
Average number of overlapping bounding boxes from RPN = 49.7 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0540 - rpn\_regr: 0.0566 - detector\_cls:  
0.2342 - detector\_regr: 0.0933  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.4  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.05398735022172332  
Loss RPN regression: 0.056630177423357964  
Loss Detector classifier: 0.23419583663344384  
Loss Detector regression: 0.09326990097761154  
Elapsed time: 50.42919635772705  
Epoch 698/1000  
Average number of overlapping bounding boxes from RPN = 47.4 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0469 - rpn\_regr: 0.0574 - detector\_cls:  
0.2412 - detector\_regr: 0.1230  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.0  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.04692312804982066  
Loss RPN regression: 0.05741751715540886  
Loss Detector classifier: 0.24118071049451828  
Loss Detector regression: 0.12302316650748253  
Elapsed time: 60.16600847244263  
Epoch 699/1000

Average number of overlapping bounding boxes from RPN = 54.0 for 10 previous iterations  
10/10 [=====] - 44s - rpn\_cls: 0.0468 - rpn\_regr: 0.0485 - detector\_cls:  
0.2065 - detector\_regr: 0.1194  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.6  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.04676567050628364  
Loss RPN regression: 0.04847640804946422  
Loss Detector classifier: 0.20650952830910682  
Loss Detector regression: 0.11939217373728753  
Elapsed time: 44.24833273887634  
Epoch 700/1000  
Average number of overlapping bounding boxes from RPN = 54.6 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0404 - rpn\_regr: 0.0523 - detector\_cls:  
0.2421 - detector\_regr: 0.1195  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.9  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.04044815548695624  
Loss RPN regression: 0.05226464383304119  
Loss Detector classifier: 0.2420843191444874  
Loss Detector regression: 0.11948810592293739  
Elapsed time: 53.4064679145813  
Epoch 701/1000  
Average number of overlapping bounding boxes from RPN = 48.9 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0406 - rpn\_regr: 0.0472 - detector\_cls:  
0.2582 - detector\_regr: 0.1295  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.2  
Classifier accuracy for bounding boxes from RPN: 0.884375  
Loss RPN classifier: 0.04055724791251123  
Loss RPN regression: 0.04719886798411608  
Loss Detector classifier: 0.25819399394094944  
Loss Detector regression: 0.12954116351902484  
Elapsed time: 58.44582653045654  
Epoch 702/1000  
Average number of overlapping bounding boxes from RPN = 44.2 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0415 - rpn\_regr: 0.0497 - detector\_cls:  
0.2307 - detector\_regr: 0.1081  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 63.1  
Classifier accuracy for bounding boxes from RPN: 0.8875  
Loss RPN classifier: 0.04145038481801748  
Loss RPN regression: 0.049672945588827136  
Loss Detector classifier: 0.23065231069922448  
Loss Detector regression: 0.10805097408592701  
Elapsed time: 48.84888696670532  
Epoch 703/1000  
Average number of overlapping bounding boxes from RPN = 63.1 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0644 - rpn\_regr: 0.0571 - detector\_cls:  
0.2151 - detector\_regr: 0.1152  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.5  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.06444006687961519  
Loss RPN regression: 0.057119757309556006  
Loss Detector classifier: 0.21513192653656005  
Loss Detector regression: 0.11522497460246087  
Elapsed time: 46.599257707595825  
Epoch 704/1000  
Average number of overlapping bounding boxes from RPN = 51.5 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0540 - rpn\_regr: 0.0496 - detector\_cls:  
0.1550 - detector\_regr: 0.1063  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.4  
Classifier accuracy for bounding boxes from RPN: 0.95  
Loss RPN classifier: 0.053964072419330475  
Loss RPN regression: 0.04961688034236431  
Loss Detector classifier: 0.15496176853775978  
Loss Detector regression: 0.10631025768816471  
Elapsed time: 53.73038458824158  
Epoch 705/1000  
Average number of overlapping bounding boxes from RPN = 51.4 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0490 - rpn\_regr: 0.0559 - detector\_cls:  
0.2388 - detector\_regr: 0.1143  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.4  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.04899682505056262  
Loss RPN regression: 0.05589842759072781  
Loss Detector classifier: 0.23877907507121562  
Loss Detector regression: 0.11429838612675666  
Elapsed time: 45.54107999801636  
Epoch 706/1000

Average number of overlapping bounding boxes from RPN = 51.4 for 10 previous iterations  
10/10 [=====] - 72s - rpn\_cls: 0.0748 - rpn\_regr: 0.0533 - detector\_cls:  
0.1919 - detector\_regr: 0.1171  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.8  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.07479929868131877  
Loss RPN regression: 0.0533473651856184  
Loss Detector classifier: 0.19191758781671525  
Loss Detector regression: 0.11714466959238053  
Elapsed time: 72.65153121948242  
Epoch 707/1000  
Average number of overlapping bounding boxes from RPN = 49.8 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0461 - rpn\_regr: 0.0451 - detector\_cls:  
0.1787 - detector\_regr: 0.0986  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.6  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.046051031863316896  
Loss RPN regression: 0.04508402720093727  
Loss Detector classifier: 0.17868141531944276  
Loss Detector regression: 0.09862431213259697  
Elapsed time: 52.403905391693115  
Epoch 708/1000  
Average number of overlapping bounding boxes from RPN = 51.6 for 10 previous iterations  
10/10 [=====] - 40s - rpn\_cls: 0.0456 - rpn\_regr: 0.0535 - detector\_cls:  
0.2148 - detector\_regr: 0.1164  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.4  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.04555812245234847  
Loss RPN regression: 0.053460132144391534  
Loss Detector classifier: 0.21475460305809974  
Loss Detector regression: 0.11637077704071999  
Elapsed time: 40.90721893310547  
Epoch 709/1000  
Average number of overlapping bounding boxes from RPN = 50.4 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0359 - rpn\_regr: 0.0618 - detector\_cls:  
0.2695 - detector\_regr: 0.1359  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.0  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.03590234126895666  
Loss RPN regression: 0.061845123395323755  
Loss Detector classifier: 0.2695491909980774  
Loss Detector regression: 0.13589320182800294  
Elapsed time: 42.31138491630554  
Epoch 710/1000  
Average number of overlapping bounding boxes from RPN = 47.0 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0557 - rpn\_regr: 0.0742 - detector\_cls:  
0.2335 - detector\_regr: 0.1026  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.1  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.055650381930172445  
Loss RPN regression: 0.07417175509035587  
Loss Detector classifier: 0.2335385039448738  
Loss Detector regression: 0.10257113799452781  
Elapsed time: 51.077192068099976  
Epoch 711/1000  
Average number of overlapping bounding boxes from RPN = 56.1 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0380 - rpn\_regr: 0.0496 - detector\_cls:  
0.1940 - detector\_regr: 0.1030  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.0  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.038026409782469274  
Loss RPN regression: 0.04960080198943615  
Loss Detector classifier: 0.19403668101876975  
Loss Detector regression: 0.1029788065701723  
Elapsed time: 54.537619829177856  
Epoch 712/1000  
Average number of overlapping bounding boxes from RPN = 53.0 for 10 previous iterations  
10/10 [=====] - 73s - rpn\_cls: 0.0486 - rpn\_regr: 0.0513 - detector\_cls:  
0.2181 - detector\_regr: 0.1267  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 63.1  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.04862960632890463  
Loss RPN regression: 0.05125025287270546  
Loss Detector classifier: 0.21809221282601357  
Loss Detector regression: 0.1267101489007473  
Elapsed time: 73.91569447517395  
Epoch 713/1000

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Epoch 713/1000
Average number of overlapping bounding boxes from RPN = 63.1 for 10 previous iterations
10/10 [=====] - 47s - rpn_cls: 0.0422 - rpn_regr: 0.0490 - detector_cls:
0.2452 - detector_regr: 0.1080
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.8
Classifier accuracy for bounding boxes from RPN: 0.9
Loss RPN classifier: 0.04219116186723113
Loss RPN regression: 0.049041159264743325
Loss Detector classifier: 0.24522272795438765
Loss Detector regression: 0.10803960151970386
Elapsed time: 47.18515372276306
Epoch 714/1000
Average number of overlapping bounding boxes from RPN = 51.8 for 10 previous iterations
10/10 [=====] - 60s - rpn_cls: 0.0536 - rpn_regr: 0.0500 - detector_cls:
0.1948 - detector_regr: 0.0972
Mean number of bounding boxes from RPN overlapping ground truth boxes: 63.1
Classifier accuracy for bounding boxes from RPN: 0.915625
Loss RPN classifier: 0.05358394952490926
Loss RPN regression: 0.049992940947413446
Loss Detector classifier: 0.19483115896582603
Loss Detector regression: 0.09719001427292824
Elapsed time: 60.65434265136719
Epoch 715/1000
Average number of overlapping bounding boxes from RPN = 63.1 for 10 previous iterations
10/10 [=====] - 68s - rpn_cls: 0.0625 - rpn_regr: 0.0543 - detector_cls:
0.2070 - detector_regr: 0.1334
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.3
Classifier accuracy for bounding boxes from RPN: 0.903125
Loss RPN classifier: 0.0625365094281733
Loss RPN regression: 0.054283310659229755
Loss Detector classifier: 0.2070428855717182
Loss Detector regression: 0.13335292786359787
Elapsed time: 69.0054063796997
Epoch 716/1000
Average number of overlapping bounding boxes from RPN = 54.3 for 10 previous iterations
10/10 [=====] - 53s - rpn_cls: 0.0605 - rpn_regr: 0.0640 - detector_cls:
0.2044 - detector_regr: 0.1535
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.0
Classifier accuracy for bounding boxes from RPN: 0.909375
Loss RPN classifier: 0.060466352244839074
Loss RPN regression: 0.06401534173637628
Loss Detector classifier: 0.20438691191375255
Loss Detector regression: 0.1534613087773323
Elapsed time: 53.54753041267395
Epoch 717/1000
Average number of overlapping bounding boxes from RPN = 54.0 for 10 previous iterations
10/10 [=====] - 54s - rpn_cls: 0.0540 - rpn_regr: 0.0526 - detector_cls:
0.1854 - detector_regr: 0.1291
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.0
Classifier accuracy for bounding boxes from RPN: 0.921875
Loss RPN classifier: 0.054047191701829436
Loss RPN regression: 0.05264121368527412
Loss Detector classifier: 0.18540628477931023
Loss Detector regression: 0.129129122197628
Elapsed time: 54.37830114364624
Epoch 718/1000
Average number of overlapping bounding boxes from RPN = 53.0 for 10 previous iterations
10/10 [=====] - 55s - rpn_cls: 0.0658 - rpn_regr: 0.0587 - detector_cls:
0.1344 - detector_regr: 0.1097
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.2
Classifier accuracy for bounding boxes from RPN: 0.9625
Loss RPN classifier: 0.06580221075564623
Loss RPN regression: 0.058739621005952355
Loss Detector classifier: 0.13444857969880103
Loss Detector regression: 0.10970948114991189
Elapsed time: 55.15483474731445
Epoch 719/1000
Average number of overlapping bounding boxes from RPN = 55.2 for 10 previous iterations
10/10 [=====] - 47s - rpn_cls: 0.0319 - rpn_regr: 0.0573 - detector_cls:
0.1969 - detector_regr: 0.1123
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.7
Classifier accuracy for bounding boxes from RPN: 0.91875
Loss RPN classifier: 0.03194192140363157
Loss RPN regression: 0.05725074131041765
Loss Detector classifier: 0.19690162241458892
Loss Detector regression: 0.1122673012316227
Elapsed time: 47.836583852767944
Epoch 720/1000
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Epoch 720/1000

Average number of overlapping bounding boxes from RPN = 57.7 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0335 - rpn\_regr: 0.0446 - detector\_cls:  
0.2187 - detector\_regr: 0.0930  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.8  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.0335351062938571  
Loss RPN regression: 0.04458975829184055  
Loss Detector classifier: 0.21871771588921546  
Loss Detector regression: 0.09296766445040702  
Elapsed time: 48.675854444503784

Epoch 721/1000

Average number of overlapping bounding boxes from RPN = 47.8 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0379 - rpn\_regr: 0.0503 - detector\_cls:  
0.1967 - detector\_regr: 0.1243  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.7  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.037914916733279826  
Loss RPN regression: 0.05027637593448162  
Loss Detector classifier: 0.19667706415057182  
Loss Detector regression: 0.12434394657611847  
Elapsed time: 54.9142541885376

Epoch 722/1000

Average number of overlapping bounding boxes from RPN = 49.7 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0550 - rpn\_regr: 0.0622 - detector\_cls:  
0.1730 - detector\_regr: 0.1128  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.4  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.054994428623467685  
Loss RPN regression: 0.06216703578829765  
Loss Detector classifier: 0.1730220139026642  
Loss Detector regression: 0.11275615021586419  
Elapsed time: 49.89659571647644

Epoch 723/1000

Average number of overlapping bounding boxes from RPN = 58.4 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0410 - rpn\_regr: 0.0439 - detector\_cls:  
0.1899 - detector\_regr: 0.1223  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.8  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.04104592949151993  
Loss RPN regression: 0.043906102702021596  
Loss Detector classifier: 0.18993000611662864  
Loss Detector regression: 0.12233667597174644  
Elapsed time: 45.95660948753357

Epoch 724/1000

Average number of overlapping bounding boxes from RPN = 48.8 for 10 previous iterations  
10/10 [=====] - 34s - rpn\_cls: 0.0371 - rpn\_regr: 0.0523 - detector\_cls:  
0.1628 - detector\_regr: 0.1094  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 35.2  
Classifier accuracy for bounding boxes from RPN: 0.95  
Loss RPN classifier: 0.0371416941517964  
Loss RPN regression: 0.052268723398447035  
Loss Detector classifier: 0.1628013603389263  
Loss Detector regression: 0.1094061441719532  
Elapsed time: 34.594468116760254

Epoch 725/1000

Average number of overlapping bounding boxes from RPN = 35.2 for 10 previous iterations  
10/10 [=====] - 39s - rpn\_cls: 0.0438 - rpn\_regr: 0.0522 - detector\_cls:  
0.1617 - detector\_regr: 0.0990  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.8  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04381146831437945  
Loss RPN regression: 0.052188362926244736  
Loss Detector classifier: 0.16167341396212578  
Loss Detector regression: 0.09903473295271396  
Elapsed time: 39.58289957046509

Epoch 726/1000

Average number of overlapping bounding boxes from RPN = 49.8 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0386 - rpn\_regr: 0.0480 - detector\_cls:  
0.1393 - detector\_regr: 0.1038  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.8  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.03855720688588917  
Loss RPN regression: 0.048007074184715746  
Loss Detector classifier: 0.1393280103802681  
Loss Detector regression: 0.10380081348121166  
Elapsed time: 52.726627588272095

Epoch 727/1000

Epoch 727/1000  
Average number of overlapping bounding boxes from RPN = 52.8 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0513 - rpn\_regr: 0.0458 - detector\_cls:  
0.2740 - detector\_regr: 0.1004  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.7  
Classifier accuracy for bounding boxes from RPN: 0.8875  
Loss RPN classifier: 0.05129273836500943  
Loss RPN regression: 0.04582966696470976  
Loss Detector classifier: 0.27395442873239517  
Loss Detector regression: 0.10036366134881973  
Elapsed time: 48.234352827072144  
Epoch 728/1000  
Average number of overlapping bounding boxes from RPN = 60.7 for 10 previous iterations  
10/10 [=====] - 64s - rpn\_cls: 0.0488 - rpn\_regr: 0.0483 - detector\_cls:  
0.2183 - detector\_regr: 0.1053  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.0  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.048770273383706805  
Loss RPN regression: 0.04830063283443451  
Loss Detector classifier: 0.21833811923861504  
Loss Detector regression: 0.10531822890043259  
Elapsed time: 64.31623387336731  
Epoch 729/1000  
Average number of overlapping bounding boxes from RPN = 59.0 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0509 - rpn\_regr: 0.0514 - detector\_cls:  
0.1571 - detector\_regr: 0.0973  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.7  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.05091848876327276  
Loss RPN regression: 0.05135675147175789  
Loss Detector classifier: 0.1570750754326582  
Loss Detector regression: 0.0973414270207286  
Elapsed time: 60.55554676055908  
Epoch 730/1000  
Average number of overlapping bounding boxes from RPN = 58.7 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0475 - rpn\_regr: 0.0639 - detector\_cls:  
0.2176 - detector\_regr: 0.1099  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.9  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04752162215299904  
Loss RPN regression: 0.06385448314249516  
Loss Detector classifier: 0.21763967610895635  
Loss Detector regression: 0.109851436316967  
Elapsed time: 49.30816459655762  
Epoch 731/1000  
Average number of overlapping bounding boxes from RPN = 59.9 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0642 - rpn\_regr: 0.0581 - detector\_cls:  
0.2732 - detector\_regr: 0.1290  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 62.8  
Classifier accuracy for bounding boxes from RPN: 0.871875  
Loss RPN classifier: 0.06423812779830769  
Loss RPN regression: 0.05809279289096594  
Loss Detector classifier: 0.27319501265883445  
Loss Detector regression: 0.1290407817810774  
Elapsed time: 59.076422691345215  
Epoch 732/1000  
Average number of overlapping bounding boxes from RPN = 62.8 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0519 - rpn\_regr: 0.0536 - detector\_cls:  
0.2008 - detector\_regr: 0.0953  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 43.7  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.05189427677541971  
Loss RPN regression: 0.053559070266783235  
Loss Detector classifier: 0.20077719166874886  
Loss Detector regression: 0.09531586356461048  
Elapsed time: 42.94982051849365  
Epoch 733/1000  
Average number of overlapping bounding boxes from RPN = 43.7 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0401 - rpn\_regr: 0.0458 - detector\_cls:  
0.2399 - detector\_regr: 0.1128  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.5  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.040075068827718496  
Loss RPN regression: 0.04578093700110912  
Loss Detector classifier: 0.23989671245217323  
Loss Detector regression: 0.11284250244498253  
Elapsed time: 52.71514272689819  
Epoch 734/1000

Epoch 734/1000  
Average number of overlapping bounding boxes from RPN = 47.5 for 10 previous iterations  
10/10 [=====] - 63s - rpn\_cls: 0.0645 - rpn\_regr: 0.0575 - detector\_cls:  
0.2361 - detector\_regr: 0.1450  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 63.0  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.06451468938030303  
Loss RPN regression: 0.05746260397136212  
Loss Detector classifier: 0.23613094314932823  
Loss Detector regression: 0.14496880620718003  
Elapsed time: 63.80489444732666  
Epoch 735/1000  
Average number of overlapping bounding boxes from RPN = 63.0 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0386 - rpn\_regr: 0.0420 - detector\_cls:  
0.1977 - detector\_regr: 0.1156  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.5  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.038648156356066464  
Loss RPN regression: 0.04204660356044769  
Loss Detector classifier: 0.19772187620401382  
Loss Detector regression: 0.11558006405830383  
Elapsed time: 43.199440479278564  
Epoch 736/1000  
Average number of overlapping bounding boxes from RPN = 47.5 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0361 - rpn\_regr: 0.0482 - detector\_cls:  
0.2171 - detector\_regr: 0.1119  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.3  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.03609198818448931  
Loss RPN regression: 0.04816807210445404  
Loss Detector classifier: 0.21714355796575546  
Loss Detector regression: 0.11186288967728615  
Elapsed time: 55.906238079071045  
Epoch 737/1000  
Average number of overlapping bounding boxes from RPN = 46.3 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0476 - rpn\_regr: 0.0637 - detector\_cls:  
0.2456 - detector\_regr: 0.1393  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.1  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.04756945807021111  
Loss RPN regression: 0.06371919251978397  
Loss Detector classifier: 0.2455979362130165  
Loss Detector regression: 0.1392805978655815  
Elapsed time: 49.4358549118042  
Epoch 738/1000  
Average number of overlapping bounding boxes from RPN = 58.1 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0605 - rpn\_regr: 0.0592 - detector\_cls:  
0.2594 - detector\_regr: 0.1157  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.8  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.060481413593515755  
Loss RPN regression: 0.059245625510811806  
Loss Detector classifier: 0.25935457870364187  
Loss Detector regression: 0.1156504925340414  
Elapsed time: 46.74052333831787  
Epoch 739/1000  
Average number of overlapping bounding boxes from RPN = 53.8 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0517 - rpn\_regr: 0.0616 - detector\_cls:  
0.1909 - detector\_regr: 0.1200  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.9  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.051692985184490683  
Loss RPN regression: 0.061558361165225506  
Loss Detector classifier: 0.1908658280968666  
Loss Detector regression: 0.12002498358488083  
Elapsed time: 60.00296378135681  
Epoch 740/1000  
Average number of overlapping bounding boxes from RPN = 59.9 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0781 - rpn\_regr: 0.0594 - detector\_cls:  
0.1954 - detector\_regr: 0.1169  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.5  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.07810733560472727  
Loss RPN regression: 0.05944235287606716  
Loss Detector classifier: 0.19541733264923095  
Loss Detector regression: 0.11687075830996037  
Elapsed time: 47.711498737335205  
Epoch 741/1000



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Epoch 741/1000
Average number of overlapping bounding boxes from RPN = 55.5 for 10 previous iterations
10/10 [=====] - 44s - rpn_cls: 0.0618 - rpn_regr: 0.0467 - detector_cls:
0.1980 - detector_regr: 0.1099
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.2
Classifier accuracy for bounding boxes from RPN: 0.93125
Loss RPN classifier: 0.061835718271322546
Loss RPN regression: 0.046738180331885815
Loss Detector classifier: 0.19802046939730644
Loss Detector regression: 0.1098863858729601
Elapsed time: 44.34076976776123
Epoch 742/1000
Average number of overlapping bounding boxes from RPN = 60.2 for 10 previous iterations
10/10 [=====] - 66s - rpn_cls: 0.0441 - rpn_regr: 0.0613 - detector_cls:
0.2579 - detector_regr: 0.1350
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.5
Classifier accuracy for bounding boxes from RPN: 0.909375
Loss RPN classifier: 0.044088691007345915
Loss RPN regression: 0.06129997596144676
Loss Detector classifier: 0.25793370306491853
Loss Detector regression: 0.1349631704390049
Elapsed time: 66.21413445472717
Epoch 743/1000
Average number of overlapping bounding boxes from RPN = 54.5 for 10 previous iterations
10/10 [=====] - 49s - rpn_cls: 0.0414 - rpn_regr: 0.0514 - detector_cls:
0.2039 - detector_regr: 0.1217
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.2
Classifier accuracy for bounding boxes from RPN: 0.925
Loss RPN classifier: 0.04136050851084292
Loss RPN regression: 0.05141801461577415
Loss Detector classifier: 0.20386666879057885
Loss Detector regression: 0.12173268683254719
Elapsed time: 49.83864784240723
Epoch 744/1000
Average number of overlapping bounding boxes from RPN = 52.2 for 10 previous iterations
10/10 [=====] - 49s - rpn_cls: 0.0409 - rpn_regr: 0.0633 - detector_cls:
0.1914 - detector_regr: 0.1004
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.0
Classifier accuracy for bounding boxes from RPN: 0.925
Loss RPN classifier: 0.040892049996182324
Loss RPN regression: 0.06325744390487671
Loss Detector classifier: 0.19139134027063848
Loss Detector regression: 0.1004395067691803
Elapsed time: 49.37933659553528
Epoch 745/1000
Average number of overlapping bounding boxes from RPN = 50.0 for 10 previous iterations
10/10 [=====] - 65s - rpn_cls: 0.0497 - rpn_regr: 0.0570 - detector_cls:
0.2050 - detector_regr: 0.1081
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.0
Classifier accuracy for bounding boxes from RPN: 0.921875
Loss RPN classifier: 0.04972466630861163
Loss RPN regression: 0.057020168751478195
Loss Detector classifier: 0.20499591771513223
Loss Detector regression: 0.10807252004742622
Elapsed time: 65.87989068031311
Epoch 746/1000
Average number of overlapping bounding boxes from RPN = 52.0 for 10 previous iterations
10/10 [=====] - 70s - rpn_cls: 0.0437 - rpn_regr: 0.0509 - detector_cls:
0.1971 - detector_regr: 0.1226
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.1
Classifier accuracy for bounding boxes from RPN: 0.9125
Loss RPN classifier: 0.043664106912910935
Loss RPN regression: 0.05087057650089264
Loss Detector classifier: 0.19712570421397685
Loss Detector regression: 0.12259508371353149
Elapsed time: 70.52069187164307
Epoch 747/1000
Average number of overlapping bounding boxes from RPN = 54.1 for 10 previous iterations
10/10 [=====] - 68s - rpn_cls: 0.0611 - rpn_regr: 0.0605 - detector_cls:
0.2388 - detector_regr: 0.1352
Mean number of bounding boxes from RPN overlapping ground truth boxes: 61.1
Classifier accuracy for bounding boxes from RPN: 0.9125
Loss RPN classifier: 0.06105992989614606
Loss RPN regression: 0.060522401705384254
Loss Detector classifier: 0.23881494849920273
Loss Detector regression: 0.13519015684723854
Elapsed time: 68.29356384277344
Epoch 748/1000
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Epoch 748/1000
Average number of overlapping bounding boxes from RPN = 61.1 for 10 previous iterations
10/10 [=====] - 61s - rpn_cls: 0.0423 - rpn_regr: 0.0555 - detector_cls:
0.1843 - detector_regr: 0.0977
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.4
Classifier accuracy for bounding boxes from RPN: 0.93125
Loss RPN classifier: 0.04226277060806751
Loss RPN regression: 0.055530980601906775
Loss Detector classifier: 0.18427384942770003
Loss Detector regression: 0.09768584966659546
Elapsed time: 61.095399379730225
Epoch 749/1000
Average number of overlapping bounding boxes from RPN = 49.4 for 10 previous iterations
10/10 [=====] - 44s - rpn_cls: 0.0418 - rpn_regr: 0.0444 - detector_cls:
0.2004 - detector_regr: 0.1163
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.9
Classifier accuracy for bounding boxes from RPN: 0.921875
Loss RPN classifier: 0.04180448660627008
Loss RPN regression: 0.04437257573008537
Loss Detector classifier: 0.20037125125527383
Loss Detector regression: 0.11630504578351974
Elapsed time: 44.617868185043335
Epoch 750/1000
Average number of overlapping bounding boxes from RPN = 48.9 for 10 previous iterations
10/10 [=====] - 43s - rpn_cls: 0.0581 - rpn_regr: 0.0454 - detector_cls:
0.1755 - detector_regr: 0.0910
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.5
Classifier accuracy for bounding boxes from RPN: 0.928125
Loss RPN classifier: 0.05812265397980809
Loss RPN regression: 0.04541137982159853
Loss Detector classifier: 0.17552416697144507
Loss Detector regression: 0.09099431615322828
Elapsed time: 43.69623875617981
Epoch 751/1000
Average number of overlapping bounding boxes from RPN = 45.5 for 10 previous iterations
10/10 [=====] - 52s - rpn_cls: 0.0537 - rpn_regr: 0.0432 - detector_cls:
0.2101 - detector_regr: 0.1058
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.3
Classifier accuracy for bounding boxes from RPN: 0.9125
Loss RPN classifier: 0.05372297689318657
Loss RPN regression: 0.04323082398623228
Loss Detector classifier: 0.2101144701242447
Loss Detector regression: 0.10579849854111671
Elapsed time: 52.37638282775879
Epoch 752/1000
Average number of overlapping bounding boxes from RPN = 51.3 for 10 previous iterations
10/10 [=====] - 49s - rpn_cls: 0.0481 - rpn_regr: 0.0548 - detector_cls:
0.1393 - detector_regr: 0.1204
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.1
Classifier accuracy for bounding boxes from RPN: 0.946875
Loss RPN classifier: 0.04808816080912948
Loss RPN regression: 0.05480201281607151
Loss Detector classifier: 0.13925859406590463
Loss Detector regression: 0.12036367803812027
Elapsed time: 49.45905613899231
Epoch 753/1000
Average number of overlapping bounding boxes from RPN = 53.1 for 10 previous iterations
10/10 [=====] - 73s - rpn_cls: 0.0700 - rpn_regr: 0.0502 - detector_cls:
0.1781 - detector_regr: 0.1128
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.3
Classifier accuracy for bounding boxes from RPN: 0.93125
Loss RPN classifier: 0.0700170156545937
Loss RPN regression: 0.05024274364113808
Loss Detector classifier: 0.17813806235790253
Loss Detector regression: 0.11281060129404068
Elapsed time: 73.15308022499084
Epoch 754/1000
Average number of overlapping bounding boxes from RPN = 57.3 for 10 previous iterations
10/10 [=====] - 46s - rpn_cls: 0.0540 - rpn_regr: 0.0526 - detector_cls:
0.1487 - detector_regr: 0.1086
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.8
Classifier accuracy for bounding boxes from RPN: 0.940625
Loss RPN classifier: 0.053976448532193896
Loss RPN regression: 0.052564813382923604
Loss Detector classifier: 0.14869698509573936
Loss Detector regression: 0.10856380742043256
Elapsed time: 46.065680503845215
Epoch 755/1000
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Epoch 755/1000  
Average number of overlapping bounding boxes from RPN = 54.8 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0436 - rpn\_regr: 0.0468 - detector\_cls:  
0.1725 - detector\_regr: 0.1088  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.4  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.04361002910882235  
Loss RPN regression: 0.046770930476486686  
Loss Detector classifier: 0.1725064005702734  
Loss Detector regression: 0.10884692873805761  
Elapsed time: 48.721410036087036  
Epoch 756/1000  
Average number of overlapping bounding boxes from RPN = 55.4 for 10 previous iterations  
10/10 [=====] - 39s - rpn\_cls: 0.0396 - rpn\_regr: 0.0408 - detector\_cls:  
0.1661 - detector\_regr: 0.1065  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 41.8  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.039646534528583285  
Loss RPN regression: 0.04082044996321201  
Loss Detector classifier: 0.16608647741377353  
Loss Detector regression: 0.10649815015494823  
Elapsed time: 39.326122760772705  
Epoch 757/1000  
Average number of overlapping bounding boxes from RPN = 41.8 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0327 - rpn\_regr: 0.0502 - detector\_cls:  
0.2269 - detector\_regr: 0.1115  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.3  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.032710822345688936  
Loss RPN regression: 0.05020572151988745  
Loss Detector classifier: 0.22685638889670373  
Loss Detector regression: 0.11151622086763383  
Elapsed time: 43.96577072143555  
Epoch 758/1000  
Average number of overlapping bounding boxes from RPN = 54.3 for 10 previous iterations  
10/10 [=====] - 84s - rpn\_cls: 0.0442 - rpn\_regr: 0.0554 - detector\_cls:  
0.1712 - detector\_regr: 0.1111  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.9  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.04422048225533217  
Loss RPN regression: 0.055352747067809106  
Loss Detector classifier: 0.1712169605307281  
Loss Detector regression: 0.11114945728331804  
Elapsed time: 84.5297749042511  
Epoch 759/1000  
Average number of overlapping bounding boxes from RPN = 52.9 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0391 - rpn\_regr: 0.0453 - detector\_cls:  
0.2153 - detector\_regr: 0.1055  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.3  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.03907153075560928  
Loss RPN regression: 0.04525636602193117  
Loss Detector classifier: 0.21531727090477942  
Loss Detector regression: 0.1054941862821579  
Elapsed time: 50.256476402282715  
Epoch 760/1000  
Average number of overlapping bounding boxes from RPN = 56.3 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0529 - rpn\_regr: 0.0517 - detector\_cls:  
0.2232 - detector\_regr: 0.1066  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.9  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.05291319070383906  
Loss RPN regression: 0.051651508919894694  
Loss Detector classifier: 0.2231676958501339  
Loss Detector regression: 0.106553116440773  
Elapsed time: 49.7573184967041  
Epoch 761/1000  
Average number of overlapping bounding boxes from RPN = 59.9 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0418 - rpn\_regr: 0.0487 - detector\_cls:  
0.1359 - detector\_regr: 0.0852  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.6  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.04178545065224171  
Loss RPN regression: 0.04873865395784378  
Loss Detector classifier: 0.13592039048671722  
Loss Detector regression: 0.08522759452462196  
Elapsed time: 45.588618516922

Epoch 762/1000  
Average number of overlapping bounding boxes from RPN = 45.6 for 10 previous iterations  
10/10 [=====] - 68s - rpn\_cls: 0.0515 - rpn\_regr: 0.0474 - detector\_cls:  
0.2266 - detector\_regr: 0.1111  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.5  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.05145938396453857  
Loss RPN regression: 0.04742094185203314  
Loss Detector classifier: 0.22662546038627623  
Loss Detector regression: 0.1110922235995531  
Elapsed time: 68.32590293884277  
Epoch 763/1000  
Average number of overlapping bounding boxes from RPN = 59.5 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0774 - rpn\_regr: 0.0540 - detector\_cls:  
0.2067 - detector\_regr: 0.0905  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.3  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.0774157359264791  
Loss RPN regression: 0.05400898773223162  
Loss Detector classifier: 0.206743598356843  
Loss Detector regression: 0.09051302783191204  
Elapsed time: 43.97794723510742  
Epoch 764/1000  
Average number of overlapping bounding boxes from RPN = 48.3 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0307 - rpn\_regr: 0.0454 - detector\_cls:  
0.2013 - detector\_regr: 0.0864  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.5  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.03071920732036233  
Loss RPN regression: 0.04541522413492203  
Loss Detector classifier: 0.20134086795151235  
Loss Detector regression: 0.08639438599348068  
Elapsed time: 43.89443039894104  
Epoch 765/1000  
Average number of overlapping bounding boxes from RPN = 53.5 for 10 previous iterations  
10/10 [=====] - 40s - rpn\_cls: 0.0411 - rpn\_regr: 0.0477 - detector\_cls:  
0.1914 - detector\_regr: 0.1040  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.5  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.04109888020902872  
Loss RPN regression: 0.047671548649668695  
Loss Detector classifier: 0.19136512726545335  
Loss Detector regression: 0.104005266726017  
Elapsed time: 40.05825757980347  
Epoch 766/1000  
Average number of overlapping bounding boxes from RPN = 47.5 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0479 - rpn\_regr: 0.0493 - detector\_cls:  
0.2049 - detector\_regr: 0.1154  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.3  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.04789602847304195  
Loss RPN regression: 0.0492979034781456  
Loss Detector classifier: 0.20489809662103653  
Loss Detector regression: 0.11536098867654801  
Elapsed time: 49.21137237548828  
Epoch 767/1000  
Average number of overlapping bounding boxes from RPN = 56.3 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0637 - rpn\_regr: 0.0649 - detector\_cls:  
0.2132 - detector\_regr: 0.0974  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.2  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.06374606471508741  
Loss RPN regression: 0.06485591549426317  
Loss Detector classifier: 0.21316266506910325  
Loss Detector regression: 0.09738163650035858  
Elapsed time: 53.799601316452026  
Epoch 768/1000  
Average number of overlapping bounding boxes from RPN = 52.2 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0546 - rpn\_regr: 0.0497 - detector\_cls:  
0.2316 - detector\_regr: 0.1092  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.4  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.054645274952054027  
Loss RPN regression: 0.04973412249237299  
Loss Detector classifier: 0.2315984360873699  
Loss Detector regression: 0.10918736532330513  
Elapsed time: 50.265337228775024

Epoch 769/1000  
Average number of overlapping bounding boxes from RPN = 60.4 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0585 - rpn\_regr: 0.0622 - detector\_cls:  
0.2102 - detector\_regr: 0.1226  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.6  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.05853629298508167  
Loss RPN regression: 0.062183980271220206  
Loss Detector classifier: 0.2102285586297512  
Loss Detector regression: 0.12258622795343399  
Elapsed time: 52.7553391456604  
Epoch 770/1000  
Average number of overlapping bounding boxes from RPN = 57.6 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0544 - rpn\_regr: 0.0432 - detector\_cls:  
0.2692 - detector\_regr: 0.1030  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.6  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.054435872053727505  
Loss RPN regression: 0.04323847834020853  
Loss Detector classifier: 0.2691783607006073  
Loss Detector regression: 0.10296449176967144  
Elapsed time: 53.88821482658386  
Epoch 771/1000  
Average number of overlapping bounding boxes from RPN = 57.6 for 10 previous iterations  
10/10 [=====] - 71s - rpn\_cls: 0.0506 - rpn\_regr: 0.0547 - detector\_cls:  
0.1930 - detector\_regr: 0.0999  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.4  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.050618632882833484  
Loss RPN regression: 0.0546590507030487  
Loss Detector classifier: 0.19304344356060027  
Loss Detector regression: 0.09993702732026577  
Elapsed time: 71.46231508255005  
Epoch 772/1000  
Average number of overlapping bounding boxes from RPN = 53.4 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0390 - rpn\_regr: 0.0515 - detector\_cls:  
0.2209 - detector\_regr: 0.1115  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.6  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.038957381760701536  
Loss RPN regression: 0.05150373186916113  
Loss Detector classifier: 0.22089551761746407  
Loss Detector regression: 0.11150898970663548  
Elapsed time: 52.520660638809204  
Epoch 773/1000  
Average number of overlapping bounding boxes from RPN = 46.6 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0359 - rpn\_regr: 0.0402 - detector\_cls:  
0.1361 - detector\_regr: 0.0946  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.5  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.035937176831066606  
Loss RPN regression: 0.04020379111170769  
Loss Detector classifier: 0.13611776381731033  
Loss Detector regression: 0.09464585892856121  
Elapsed time: 45.929404497146606  
Epoch 774/1000  
Average number of overlapping bounding boxes from RPN = 57.5 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0261 - rpn\_regr: 0.0459 - detector\_cls:  
0.2307 - detector\_regr: 0.1126  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.5  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.026068120345007627  
Loss RPN regression: 0.04589072689414024  
Loss Detector classifier: 0.2306663490831852  
Loss Detector regression: 0.1126277856528759  
Elapsed time: 55.509565591812134  
Epoch 775/1000  
Average number of overlapping bounding boxes from RPN = 52.5 for 10 previous iterations  
10/10 [=====] - 65s - rpn\_cls: 0.0523 - rpn\_regr: 0.0499 - detector\_cls:  
0.2003 - detector\_regr: 0.1006  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.1  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.05227220114320517  
Loss RPN regression: 0.04987745136022568  
Loss Detector classifier: 0.2003139302134514  
Loss Detector regression: 0.10062063485383987  
Elapsed time: 65.20057082176208

Epoch 776/1000  
Average number of overlapping bounding boxes from RPN = 52.1 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0410 - rpn\_regr: 0.0531 - detector\_cls:  
0.2367 - detector\_regr: 0.1012  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.7  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.040987166669219734  
Loss RPN regression: 0.05313460938632488  
Loss Detector classifier: 0.23671759590506553  
Loss Detector regression: 0.1012432686984539  
Elapsed time: 45.810784339904785  
Epoch 777/1000  
Average number of overlapping bounding boxes from RPN = 49.7 for 10 previous iterations  
10/10 [=====] - 62s - rpn\_cls: 0.0790 - rpn\_regr: 0.0521 - detector\_cls:  
0.2173 - detector\_regr: 0.1011  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.1  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.0789780345512554  
Loss RPN regression: 0.052081891708076  
Loss Detector classifier: 0.21725355461239815  
Loss Detector regression: 0.10113029070198536  
Elapsed time: 62.232691287994385  
Epoch 778/1000  
Average number of overlapping bounding boxes from RPN = 52.1 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0501 - rpn\_regr: 0.0557 - detector\_cls:  
0.2159 - detector\_regr: 0.1445  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.9  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.05008469619788229  
Loss RPN regression: 0.05565375946462155  
Loss Detector classifier: 0.21591142416000367  
Loss Detector regression: 0.14451264813542367  
Elapsed time: 51.13071274757385  
Epoch 779/1000  
Average number of overlapping bounding boxes from RPN = 56.9 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0557 - rpn\_regr: 0.0539 - detector\_cls:  
0.1882 - detector\_regr: 0.1125  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.5  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.05571891414001584  
Loss RPN regression: 0.053891432285308835  
Loss Detector classifier: 0.1881603442132473  
Loss Detector regression: 0.11251618489623069  
Elapsed time: 54.7675461769104  
Epoch 780/1000  
Average number of overlapping bounding boxes from RPN = 50.5 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0440 - rpn\_regr: 0.0531 - detector\_cls:  
0.1830 - detector\_regr: 0.1209  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.6  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04402867609169334  
Loss RPN regression: 0.053099128790199755  
Loss Detector classifier: 0.18296875804662704  
Loss Detector regression: 0.12086640745401382  
Elapsed time: 51.1646249294281  
Epoch 781/1000  
Average number of overlapping bounding boxes from RPN = 56.6 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0636 - rpn\_regr: 0.0514 - detector\_cls:  
0.1931 - detector\_regr: 0.0891  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.4  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.06362089049071074  
Loss RPN regression: 0.05143136568367481  
Loss Detector classifier: 0.19307997524738313  
Loss Detector regression: 0.08910340294241906  
Elapsed time: 56.15362858772278  
Epoch 782/1000  
Average number of overlapping bounding boxes from RPN = 55.4 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0591 - rpn\_regr: 0.0461 - detector\_cls:  
0.1714 - detector\_regr: 0.0887  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.3  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.0591238034889102  
Loss RPN regression: 0.046071058697998525  
Loss Detector classifier: 0.17139262072741984  
Loss Detector regression: 0.0887359332293272  
Elapsed time: 54.176894664764404

Epoch 783/1000  
Average number of overlapping bounding boxes from RPN = 53.3 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0662 - rpn\_regr: 0.0612 - detector\_cls: 0.2484 - detector\_regr: 0.1346  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.5  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.06624652203172446  
Loss RPN regression: 0.06116560194641352  
Loss Detector classifier: 0.24843704774975778  
Loss Detector regression: 0.13457524552941322  
Elapsed time: 58.656492710113525  
Epoch 784/1000  
Average number of overlapping bounding boxes from RPN = 60.5 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0469 - rpn\_regr: 0.0521 - detector\_cls: 0.1665 - detector\_regr: 0.0901  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 39.1  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.04685406470671296  
Loss RPN regression: 0.052143729850649835  
Loss Detector classifier: 0.1665064737200737  
Loss Detector regression: 0.09005403108894824  
Elapsed time: 60.03270101547241  
Epoch 785/1000  
Average number of overlapping bounding boxes from RPN = 39.1 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0728 - rpn\_regr: 0.0613 - detector\_cls: 0.2133 - detector\_regr: 0.1187  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.1  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.07277731546200812  
Loss RPN regression: 0.061316164769232274  
Loss Detector classifier: 0.21334069296717645  
Loss Detector regression: 0.11871127188205718  
Elapsed time: 43.340675592422485  
Epoch 786/1000  
Average number of overlapping bounding boxes from RPN = 56.1 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0336 - rpn\_regr: 0.0530 - detector\_cls: 0.3051 - detector\_regr: 0.1058  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.6  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.033624934917315843  
Loss RPN regression: 0.052958807721734044  
Loss Detector classifier: 0.30505126491189005  
Loss Detector regression: 0.10576750002801419  
Elapsed time: 55.00413990020752  
Epoch 787/1000  
Average number of overlapping bounding boxes from RPN = 50.6 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0586 - rpn\_regr: 0.0568 - detector\_cls: 0.2371 - detector\_regr: 0.1326  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.6  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.058605401404201986  
Loss RPN regression: 0.056837739795446394  
Loss Detector classifier: 0.23712202534079552  
Loss Detector regression: 0.13256665952503682  
Elapsed time: 47.868882179260254  
Epoch 788/1000  
Average number of overlapping bounding boxes from RPN = 54.6 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0508 - rpn\_regr: 0.0574 - detector\_cls: 0.2129 - detector\_regr: 0.1012  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.2  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.05079879146069288  
Loss RPN regression: 0.057403364963829515  
Loss Detector classifier: 0.21285368017852307  
Loss Detector regression: 0.10119129046797752  
Elapsed time: 45.35894703865051  
Epoch 789/1000  
Average number of overlapping bounding boxes from RPN = 49.2 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0542 - rpn\_regr: 0.0591 - detector\_cls: 0.2108 - detector\_regr: 0.1286  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 62.3  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.05420766472816467  
Loss RPN regression: 0.05906931143254042  
Loss Detector classifier: 0.21080624386668206  
Loss Detector regression: 0.12856698110699655  
Elapsed time: 48.02517747879028

Epoch 790/1000  
Average number of overlapping bounding boxes from RPN = 62.3 for 10 previous iterations  
10/10 [=====] - 67s - rpn\_cls: 0.0489 - rpn\_regr: 0.0671 - detector\_cls: 0.2651 - detector\_regr: 0.1136  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.1  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.04888934001792222  
Loss RPN regression: 0.06712424010038376  
Loss Detector classifier: 0.26511816009879113  
Loss Detector regression: 0.11364962495863437  
Elapsed time: 67.66612577438354  
Epoch 791/1000  
Average number of overlapping bounding boxes from RPN = 60.1 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0457 - rpn\_regr: 0.0509 - detector\_cls: 0.1935 - detector\_regr: 0.1231  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.7  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.045686361170373856  
Loss RPN regression: 0.05094683412462473  
Loss Detector classifier: 0.19347054325044155  
Loss Detector regression: 0.1230540007352829  
Elapsed time: 48.14524698257446  
Epoch 792/1000  
Average number of overlapping bounding boxes from RPN = 50.7 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0581 - rpn\_regr: 0.0412 - detector\_cls: 0.1400 - detector\_regr: 0.0947  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.2  
Classifier accuracy for bounding boxes from RPN: 0.946875  
Loss RPN classifier: 0.0580846989993006  
Loss RPN regression: 0.04121816465631127  
Loss Detector classifier: 0.1399865746498108  
Loss Detector regression: 0.09466760158538819  
Elapsed time: 45.5757896900177  
Epoch 793/1000  
Average number of overlapping bounding boxes from RPN = 49.2 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0500 - rpn\_regr: 0.0493 - detector\_cls: 0.2348 - detector\_regr: 0.1059  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.7  
Classifier accuracy for bounding boxes from RPN: 0.8875  
Loss RPN classifier: 0.05001766975037754  
Loss RPN regression: 0.04933752752840519  
Loss Detector classifier: 0.23479948192834854  
Loss Detector regression: 0.10586613155901432  
Elapsed time: 56.63302826881409  
Epoch 794/1000  
Average number of overlapping bounding boxes from RPN = 59.7 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0452 - rpn\_regr: 0.0480 - detector\_cls: 0.2616 - detector\_regr: 0.1291  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.5  
Classifier accuracy for bounding boxes from RPN: 0.875  
Loss RPN classifier: 0.04519466538913548  
Loss RPN regression: 0.04798820894211531  
Loss Detector classifier: 0.26156625896692276  
Loss Detector regression: 0.1291192803531885  
Elapsed time: 42.61839270591736  
Epoch 795/1000  
Average number of overlapping bounding boxes from RPN = 48.5 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0358 - rpn\_regr: 0.0422 - detector\_cls: 0.1835 - detector\_regr: 0.0825  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.3  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.03577973044011742  
Loss RPN regression: 0.042184746265411376  
Loss Detector classifier: 0.18350448086857796  
Loss Detector regression: 0.08252418264746667  
Elapsed time: 52.63460564613342  
Epoch 796/1000  
Average number of overlapping bounding boxes from RPN = 50.3 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0447 - rpn\_regr: 0.0467 - detector\_cls: 0.1806 - detector\_regr: 0.1072  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.9  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.04468658501282334  
Loss RPN regression: 0.04667289666831494  
Loss Detector classifier: 0.18063053600490092  
Loss Detector regression: 0.10719381794333457  
Elapsed time: 47.48011898994446



Epoch 797/1000

Average number of overlapping bounding boxes from RPN = 55.9 for 10 previous iterations

10/10 [=====] - 49s - rpn\_cls: 0.0648 - rpn\_regr: 0.0573 - detector\_cls: 0.2331 - detector\_regr: 0.0935

Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.9

Classifier accuracy for bounding boxes from RPN: 0.896875

Loss RPN classifier: 0.06477512773126363

Loss RPN regression: 0.05725912358611822

Loss Detector classifier: 0.23308538794517517

Loss Detector regression: 0.09346652328968048

Elapsed time: 49.59183716773987

Epoch 798/1000

Average number of overlapping bounding boxes from RPN = 52.9 for 10 previous iterations

10/10 [=====] - 52s - rpn\_cls: 0.0501 - rpn\_regr: 0.0511 - detector\_cls: 0.1833 - detector\_regr: 0.1122

Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.1

Classifier accuracy for bounding boxes from RPN: 0.9375

Loss RPN classifier: 0.050094248703680934

Loss RPN regression: 0.051115385442972186

Loss Detector classifier: 0.1832513079047203

Loss Detector regression: 0.11219737380743026

Elapsed time: 52.72256875038147

Epoch 799/1000

Average number of overlapping bounding boxes from RPN = 50.1 for 10 previous iterations

10/10 [=====] - 50s - rpn\_cls: 0.0519 - rpn\_regr: 0.0515 - detector\_cls: 0.2264 - detector\_regr: 0.1115

Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.0

Classifier accuracy for bounding boxes from RPN: 0.91875

Loss RPN classifier: 0.051931190537288785

Loss RPN regression: 0.05147347077727318

Loss Detector classifier: 0.22644418179988862

Loss Detector regression: 0.11148336343467236

Elapsed time: 50.18979597091675

Epoch 800/1000

Average number of overlapping bounding boxes from RPN = 56.0 for 10 previous iterations

10/10 [=====] - 38s - rpn\_cls: 0.0422 - rpn\_regr: 0.0509 - detector\_cls: 0.1877 - detector\_regr: 0.0919

Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.8

Classifier accuracy for bounding boxes from RPN: 0.9375

Loss RPN classifier: 0.04215715494938195

Loss RPN regression: 0.05092378184199333

Loss Detector classifier: 0.1877496436238289

Loss Detector regression: 0.09187662601470947

Elapsed time: 38.791563987731934

Epoch 801/1000

Average number of overlapping bounding boxes from RPN = 46.8 for 10 previous iterations

10/10 [=====] - 46s - rpn\_cls: 0.0699 - rpn\_regr: 0.0459 - detector\_cls: 0.2160 - detector\_regr: 0.1200

Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.8

Classifier accuracy for bounding boxes from RPN: 0.921875

Loss RPN classifier: 0.06991935316473245

Loss RPN regression: 0.045874124579131606

Loss Detector classifier: 0.21598368529230355

Loss Detector regression: 0.11996229495853186

Elapsed time: 46.529985427856445

Epoch 802/1000

Average number of overlapping bounding boxes from RPN = 50.8 for 10 previous iterations

10/10 [=====] - 38s - rpn\_cls: 0.0299 - rpn\_regr: 0.0435 - detector\_cls: 0.1837 - detector\_regr: 0.1042

Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.0

Classifier accuracy for bounding boxes from RPN: 0.9375

Loss RPN classifier: 0.02988404226489365

Loss RPN regression: 0.0435357004404068

Loss Detector classifier: 0.18373627476394178

Loss Detector regression: 0.10423098914325238

Elapsed time: 38.80238199234009

Epoch 803/1000

Average number of overlapping bounding boxes from RPN = 47.0 for 10 previous iterations

10/10 [=====] - 42s - rpn\_cls: 0.0287 - rpn\_regr: 0.0481 - detector\_cls: 0.2233 - detector\_regr: 0.1116

Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.7

Classifier accuracy for bounding boxes from RPN: 0.915625

Loss RPN classifier: 0.028714026394300162

Loss RPN regression: 0.04810254909098148

Loss Detector classifier: 0.22326276004314421

Loss Detector regression: 0.11155347973108291

Elapsed time: 42.126174449920654

Epoch 804/1000

Average number of overlapping bounding boxes from RPN = 55.7 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0441 - rpn\_regr: 0.0406 - detector\_cls:  
0.1828 - detector\_regr: 0.0744  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.7  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.044137851195409895  
Loss RPN regression: 0.04055193196982145  
Loss Detector classifier: 0.18275497816503047  
Loss Detector regression: 0.07443411014974118  
Elapsed time: 50.68190264701843

Epoch 805/1000

Average number of overlapping bounding boxes from RPN = 44.7 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0584 - rpn\_regr: 0.0500 - detector\_cls:  
0.2397 - detector\_regr: 0.1091  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.6  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.05840580500662327  
Loss RPN regression: 0.04995542410761118  
Loss Detector classifier: 0.23973342776298523  
Loss Detector regression: 0.10907220095396042  
Elapsed time: 46.504802942276

Epoch 806/1000

Average number of overlapping bounding boxes from RPN = 46.6 for 10 previous iterations  
10/10 [=====] - 41s - rpn\_cls: 0.0386 - rpn\_regr: 0.0493 - detector\_cls:  
0.2111 - detector\_regr: 0.0863  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 42.1  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.03855435124132782  
Loss RPN regression: 0.04932466205209494  
Loss Detector classifier: 0.21114612743258476  
Loss Detector regression: 0.08625830672681331  
Elapsed time: 41.31912136077881

Epoch 807/1000

Average number of overlapping bounding boxes from RPN = 42.1 for 10 previous iterations  
10/10 [=====] - 61s - rpn\_cls: 0.0550 - rpn\_regr: 0.0481 - detector\_cls:  
0.2554 - detector\_regr: 0.1134  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.2  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.05504931453615427  
Loss RPN regression: 0.04813305251300335  
Loss Detector classifier: 0.25542051866650584  
Loss Detector regression: 0.11343700997531414  
Elapsed time: 61.94990801811218

Epoch 808/1000

Average number of overlapping bounding boxes from RPN = 58.2 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0516 - rpn\_regr: 0.0598 - detector\_cls:  
0.2512 - detector\_regr: 0.1242  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.5  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.05155217908322811  
Loss RPN regression: 0.05979786142706871  
Loss Detector classifier: 0.25120813995599744  
Loss Detector regression: 0.12422925308346748  
Elapsed time: 51.69658899307251

Epoch 809/1000

Average number of overlapping bounding boxes from RPN = 58.5 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0479 - rpn\_regr: 0.0505 - detector\_cls:  
0.1807 - detector\_regr: 0.1351  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.4  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.04789253575727344  
Loss RPN regression: 0.05052500534802675  
Loss Detector classifier: 0.18065562024712561  
Loss Detector regression: 0.13508067578077315  
Elapsed time: 49.240896224975586

Epoch 810/1000

Average number of overlapping bounding boxes from RPN = 59.4 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0413 - rpn\_regr: 0.0702 - detector\_cls:  
0.3331 - detector\_regr: 0.1175  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.2  
Classifier accuracy for bounding boxes from RPN: 0.865625  
Loss RPN classifier: 0.04132608165964484  
Loss RPN regression: 0.07020482793450356  
Loss Detector classifier: 0.3330708064138889  
Loss Detector regression: 0.11748842373490334  
Elapsed time: 49.153271436691284

Epoch 811/1000  
Average number of overlapping bounding boxes from RPN = 48.2 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0457 - rpn\_regr: 0.0433 - detector\_cls:  
0.1686 - detector\_regr: 0.1224  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.9  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.04566490887664258  
Loss RPN regression: 0.04329764246940613  
Loss Detector classifier: 0.16855115965008735  
Loss Detector regression: 0.1223938599228859  
Elapsed time: 45.57781147956848  
Epoch 812/1000  
Average number of overlapping bounding boxes from RPN = 50.9 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0575 - rpn\_regr: 0.0637 - detector\_cls:  
0.2258 - detector\_regr: 0.1200  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.9  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.057476567849516866  
Loss RPN regression: 0.06374442335218192  
Loss Detector classifier: 0.22584391832351686  
Loss Detector regression: 0.1200281672179699  
Elapsed time: 51.09095120429993  
Epoch 813/1000  
Average number of overlapping bounding boxes from RPN = 49.9 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0443 - rpn\_regr: 0.0390 - detector\_cls:  
0.1602 - detector\_regr: 0.0921  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.4  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.044297073339112106  
Loss RPN regression: 0.03900972008705139  
Loss Detector classifier: 0.16023389175534247  
Loss Detector regression: 0.09205542840063571  
Elapsed time: 49.00447201728821  
Epoch 814/1000  
Average number of overlapping bounding boxes from RPN = 44.4 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0423 - rpn\_regr: 0.0405 - detector\_cls:  
0.2111 - detector\_regr: 0.0920  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.2  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.042259031580761074  
Loss RPN regression: 0.04052928201854229  
Loss Detector classifier: 0.21107659563422204  
Loss Detector regression: 0.09204081706702709  
Elapsed time: 56.646053314208984  
Epoch 815/1000  
Average number of overlapping bounding boxes from RPN = 57.2 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0635 - rpn\_regr: 0.0500 - detector\_cls:  
0.1927 - detector\_regr: 0.1042  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.2  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.06346989814192057  
Loss RPN regression: 0.049981382489204404  
Loss Detector classifier: 0.1926931358873844  
Loss Detector regression: 0.1042453732341528  
Elapsed time: 51.10065054893494  
Epoch 816/1000  
Average number of overlapping bounding boxes from RPN = 56.2 for 10 previous iterations  
10/10 [=====] - 41s - rpn\_cls: 0.0414 - rpn\_regr: 0.0525 - detector\_cls:  
0.2694 - detector\_regr: 0.1125  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.7  
Classifier accuracy for bounding boxes from RPN: 0.8875  
Loss RPN classifier: 0.04138242276385427  
Loss RPN regression: 0.05249751731753349  
Loss Detector classifier: 0.26940892934799193  
Loss Detector regression: 0.11249605976045132  
Elapsed time: 41.18094611167908  
Epoch 817/1000  
Average number of overlapping bounding boxes from RPN = 51.7 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0466 - rpn\_regr: 0.0421 - detector\_cls:  
0.1925 - detector\_regr: 0.1009  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.2  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.046573044441174716  
Loss RPN regression: 0.04206788074225187  
Loss Detector classifier: 0.19252693355083467  
Loss Detector regression: 0.10093848612159491  
Elapsed time: 59.82335638999939

Epoch 818/1000  
Average number of overlapping bounding boxes from RPN = 57.2 for 10 previous iterations  
10/10 [=====] - 79s - rpn\_cls: 0.0343 - rpn\_regr: 0.0441 - detector\_cls:  
0.1973 - detector\_regr: 0.0884  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.2  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.034293615538626906  
Loss RPN regression: 0.044066640362143514  
Loss Detector classifier: 0.19727506283670665  
Loss Detector regression: 0.08843360170722007  
Elapsed time: 79.49616575241089  
Epoch 819/1000  
Average number of overlapping bounding boxes from RPN = 53.2 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0389 - rpn\_regr: 0.0519 - detector\_cls:  
0.2227 - detector\_regr: 0.1251  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.5  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.03893846194259822  
Loss RPN regression: 0.051881159842014316  
Loss Detector classifier: 0.22268926054239274  
Loss Detector regression: 0.12509708162397146  
Elapsed time: 52.72405290603638  
Epoch 820/1000  
Average number of overlapping bounding boxes from RPN = 58.5 for 10 previous iterations  
10/10 [=====] - 79s - rpn\_cls: 0.0543 - rpn\_regr: 0.0561 - detector\_cls:  
0.2429 - detector\_regr: 0.1343  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 65.1  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.054274935834109785  
Loss RPN regression: 0.05607277862727642  
Loss Detector classifier: 0.24293114095926285  
Loss Detector regression: 0.13430075906217098  
Elapsed time: 80.00255155563354  
Epoch 821/1000  
Average number of overlapping bounding boxes from RPN = 65.1 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0578 - rpn\_regr: 0.0562 - detector\_cls:  
0.1853 - detector\_regr: 0.1151  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.2  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.057804798963479696  
Loss RPN regression: 0.056209768354892733  
Loss Detector classifier: 0.18533324524760247  
Loss Detector regression: 0.11513441689312458  
Elapsed time: 59.27885413169861  
Epoch 822/1000  
Average number of overlapping bounding boxes from RPN = 52.2 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0536 - rpn\_regr: 0.0525 - detector\_cls:  
0.1891 - detector\_regr: 0.0973  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.4  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.05360422639641911  
Loss RPN regression: 0.05245324671268463  
Loss Detector classifier: 0.1890503816306591  
Loss Detector regression: 0.09732425510883332  
Elapsed time: 47.9576370716095  
Epoch 823/1000  
Average number of overlapping bounding boxes from RPN = 55.4 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0373 - rpn\_regr: 0.0611 - detector\_cls:  
0.2256 - detector\_regr: 0.1082  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.4  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.03725610300898552  
Loss RPN regression: 0.061137448996305466  
Loss Detector classifier: 0.22555591948330403  
Loss Detector regression: 0.1081519540399313  
Elapsed time: 56.80705523490906  
Epoch 824/1000  
Average number of overlapping bounding boxes from RPN = 54.4 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0534 - rpn\_regr: 0.0559 - detector\_cls:  
0.1787 - detector\_regr: 0.1278  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.7  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.053361985739320515  
Loss RPN regression: 0.055925271846354006  
Loss Detector classifier: 0.17871836125850676  
Loss Detector regression: 0.12783191129565238  
Elapsed time: 52.326520681381226

Epoch 825/1000  
Average number of overlapping bounding boxes from RPN = 52.7 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0569 - rpn\_regr: 0.0548 - detector\_cls:  
0.1818 - detector\_regr: 0.1033  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.0  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.05694057857617736  
Loss RPN regression: 0.054802028462290764  
Loss Detector classifier: 0.1818456918001175  
Loss Detector regression: 0.10328711830079555  
Elapsed time: 47.66138553619385  
Epoch 826/1000  
Average number of overlapping bounding boxes from RPN = 54.0 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0435 - rpn\_regr: 0.0449 - detector\_cls:  
0.1580 - detector\_regr: 0.1144  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.2  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04348998186178506  
Loss RPN regression: 0.044894551299512385  
Loss Detector classifier: 0.15799999684095384  
Loss Detector regression: 0.11443951427936554  
Elapsed time: 60.47726273536682  
Epoch 827/1000  
Average number of overlapping bounding boxes from RPN = 47.2 for 10 previous iterations  
10/10 [=====] - 62s - rpn\_cls: 0.0460 - rpn\_regr: 0.0563 - detector\_cls:  
0.2507 - detector\_regr: 0.1417  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.6  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.04602541751228273  
Loss RPN regression: 0.05626456364989281  
Loss Detector classifier: 0.2507490158081055  
Loss Detector regression: 0.14166400842368604  
Elapsed time: 62.4042809009552  
Epoch 828/1000  
Average number of overlapping bounding boxes from RPN = 50.6 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0798 - rpn\_regr: 0.0439 - detector\_cls:  
0.1681 - detector\_regr: 0.1075  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.8  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.07983420500531793  
Loss RPN regression: 0.04386472152546048  
Loss Detector classifier: 0.16812703311443328  
Loss Detector regression: 0.10753969997167587  
Elapsed time: 48.777353286743164  
Epoch 829/1000  
Average number of overlapping bounding boxes from RPN = 56.8 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0660 - rpn\_regr: 0.0474 - detector\_cls:  
0.2758 - detector\_regr: 0.0997  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.3  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.06597217041999101  
Loss RPN regression: 0.04742152951657772  
Loss Detector classifier: 0.27581167221069336  
Loss Detector regression: 0.09967251420021057  
Elapsed time: 56.80654430389404  
Epoch 830/1000  
Average number of overlapping bounding boxes from RPN = 47.3 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0463 - rpn\_regr: 0.0504 - detector\_cls:  
0.2099 - detector\_regr: 0.1163  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.1  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.04628108153119683  
Loss RPN regression: 0.05041766557842493  
Loss Detector classifier: 0.20992954075336456  
Loss Detector regression: 0.11634355150163174  
Elapsed time: 60.677258014678955  
Epoch 831/1000  
Average number of overlapping bounding boxes from RPN = 55.1 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0374 - rpn\_regr: 0.0561 - detector\_cls:  
0.1503 - detector\_regr: 0.1021  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.5  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.037432439438998696  
Loss RPN regression: 0.056078674644231795  
Loss Detector classifier: 0.1503363374620676  
Loss Detector regression: 0.10208173356950283  
Elapsed time: 54.318474531173706

Epoch 832/1000  
Average number of overlapping bounding boxes from RPN = 47.5 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0580 - rpn\_regr: 0.0506 - detector\_cls:  
0.2150 - detector\_regr: 0.1058  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 61.4  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.05795109272003174  
Loss RPN regression: 0.0505822894629091  
Loss Detector classifier: 0.21497860699892044  
Loss Detector regression: 0.10578327290713788  
Elapsed time: 53.376882553100586  
Epoch 833/1000  
Average number of overlapping bounding boxes from RPN = 61.4 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0613 - rpn\_regr: 0.0503 - detector\_cls:  
0.2927 - detector\_regr: 0.1182  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 61.8  
Classifier accuracy for bounding boxes from RPN: 0.871875  
Loss RPN classifier: 0.06129494230262935  
Loss RPN regression: 0.050260181166231634  
Loss Detector classifier: 0.29272560179233553  
Loss Detector regression: 0.11822551153600216  
Elapsed time: 55.77530264854431  
Epoch 834/1000  
Average number of overlapping bounding boxes from RPN = 61.8 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0510 - rpn\_regr: 0.0616 - detector\_cls:  
0.2573 - detector\_regr: 0.1272  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.4  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.051026825699955224  
Loss RPN regression: 0.06160518266260624  
Loss Detector classifier: 0.2572918325662613  
Loss Detector regression: 0.1271514855325222  
Elapsed time: 55.41529655456543  
Epoch 835/1000  
Average number of overlapping bounding boxes from RPN = 59.4 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0606 - rpn\_regr: 0.0410 - detector\_cls:  
0.1686 - detector\_regr: 0.0813  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.3  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.06063420083373785  
Loss RPN regression: 0.040951084904372693  
Loss Detector classifier: 0.16855517104268075  
Loss Detector regression: 0.08125492706894874  
Elapsed time: 54.41540026664734  
Epoch 836/1000  
Average number of overlapping bounding boxes from RPN = 50.3 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0561 - rpn\_regr: 0.0454 - detector\_cls:  
0.2067 - detector\_regr: 0.0845  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.9  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.05605931421741843  
Loss RPN regression: 0.04535742476582527  
Loss Detector classifier: 0.2067243166267872  
Loss Detector regression: 0.08447666317224503  
Elapsed time: 54.04715657234192  
Epoch 837/1000  
Average number of overlapping bounding boxes from RPN = 49.9 for 10 previous iterations  
10/10 [=====] - 69s - rpn\_cls: 0.0523 - rpn\_regr: 0.0440 - detector\_cls:  
0.2039 - detector\_regr: 0.1060  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.0  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.05230909599922597  
Loss RPN regression: 0.04397134128957987  
Loss Detector classifier: 0.2039398394525051  
Loss Detector regression: 0.10599663630127906  
Elapsed time: 69.78123736381531  
Epoch 838/1000  
Average number of overlapping bounding boxes from RPN = 49.0 for 10 previous iterations  
10/10 [=====] - 41s - rpn\_cls: 0.0564 - rpn\_regr: 0.0396 - detector\_cls:  
0.1960 - detector\_regr: 0.1240  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.6  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.05639252569526434  
Loss RPN regression: 0.039636333286762235  
Loss Detector classifier: 0.19600150138139724  
Loss Detector regression: 0.1239928886294365  
Elapsed time: 41.348552942276

Elapsed time: 49.95143103599548  
Epoch 839/1000  
Average number of overlapping bounding boxes from RPN = 50.6 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0530 - rpn\_regr: 0.0503 - detector\_cls:  
0.2250 - detector\_regr: 0.1277  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.9  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.052998882718384266  
Loss RPN regression: 0.05029400587081909  
Loss Detector classifier: 0.22504963744431733  
Loss Detector regression: 0.1276647701859474  
Elapsed time: 49.95143103599548  
Epoch 840/1000  
Average number of overlapping bounding boxes from RPN = 54.9 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0303 - rpn\_regr: 0.0421 - detector\_cls:  
0.1946 - detector\_regr: 0.1032  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.3  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.030318254372105002  
Loss RPN regression: 0.04214208070188761  
Loss Detector classifier: 0.19458502233028413  
Loss Detector regression: 0.10316028725355864  
Elapsed time: 58.3415310382843  
Epoch 841/1000  
Average number of overlapping bounding boxes from RPN = 54.3 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0522 - rpn\_regr: 0.0577 - detector\_cls:  
0.2170 - detector\_regr: 0.1239  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.8  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.05215046056546271  
Loss RPN regression: 0.05771941561251879  
Loss Detector classifier: 0.21698700413107871  
Loss Detector regression: 0.12391159832477569  
Elapsed time: 60.7349693775177  
Epoch 842/1000  
Average number of overlapping bounding boxes from RPN = 52.8 for 10 previous iterations  
10/10 [=====] - 63s - rpn\_cls: 0.0401 - rpn\_regr: 0.0510 - detector\_cls:  
0.2013 - detector\_regr: 0.0961  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.1  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.040085679036565125  
Loss RPN regression: 0.050999103114008904  
Loss Detector classifier: 0.20130960159003736  
Loss Detector regression: 0.09614032171666623  
Elapsed time: 63.86605095863342  
Epoch 843/1000  
Average number of overlapping bounding boxes from RPN = 49.1 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0386 - rpn\_regr: 0.0584 - detector\_cls:  
0.1873 - detector\_regr: 0.1173  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.9  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.038606695085763934  
Loss RPN regression: 0.058414180763065815  
Loss Detector classifier: 0.18734322786331176  
Loss Detector regression: 0.11726284846663475  
Elapsed time: 45.795018911361694  
Epoch 844/1000  
Average number of overlapping bounding boxes from RPN = 50.9 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0466 - rpn\_regr: 0.0515 - detector\_cls:  
0.2091 - detector\_regr: 0.1253  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 62.7  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.04663708442822099  
Loss RPN regression: 0.05153336934745312  
Loss Detector classifier: 0.20906191617250441  
Loss Detector regression: 0.12532846257090569  
Elapsed time: 59.37802028656006  
Epoch 845/1000  
Average number of overlapping bounding boxes from RPN = 62.7 for 10 previous iterations  
10/10 [=====] - 64s - rpn\_cls: 0.0413 - rpn\_regr: 0.0443 - detector\_cls:  
0.2393 - detector\_regr: 0.1363  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.0  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.041329861246049406  
Loss RPN regression: 0.04430883228778839  
Loss Detector classifier: 0.23932484462857245  
Loss Detector regression: 0.13629281409084798  
Elapsed time: 64.39574074745178

Elapsed time: 54.5557407745170  
Epoch 846/1000  
Average number of overlapping bounding boxes from RPN = 59.0 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0627 - rpn\_regr: 0.0511 - detector\_cls:  
0.2713 - detector\_regr: 0.1248  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.9  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.06271421238780021  
Loss RPN regression: 0.051104530692100525  
Loss Detector classifier: 0.271284868568182  
Loss Detector regression: 0.1248246468603611  
Elapsed time: 52.50395750999451  
Epoch 847/1000  
Average number of overlapping bounding boxes from RPN = 48.9 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0670 - rpn\_regr: 0.0523 - detector\_cls:  
0.2141 - detector\_regr: 0.1042  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.9  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.0670435399748385  
Loss RPN regression: 0.052322125248610976  
Loss Detector classifier: 0.21410858035087585  
Loss Detector regression: 0.1042183443903923  
Elapsed time: 47.92431426048279  
Epoch 848/1000  
Average number of overlapping bounding boxes from RPN = 54.9 for 10 previous iterations  
10/10 [=====] - 65s - rpn\_cls: 0.0616 - rpn\_regr: 0.0502 - detector\_cls:  
0.1639 - detector\_regr: 0.1119  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.2  
Classifier accuracy for bounding boxes from RPN: 0.946875  
Loss RPN classifier: 0.061625882796943185  
Loss RPN regression: 0.05016908943653107  
Loss Detector classifier: 0.16387229450047017  
Loss Detector regression: 0.11186525970697403  
Elapsed time: 65.46934723854065  
Epoch 849/1000  
Average number of overlapping bounding boxes from RPN = 55.2 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0699 - rpn\_regr: 0.0584 - detector\_cls:  
0.2123 - detector\_regr: 0.1216  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.4  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.06987687349319457  
Loss RPN regression: 0.05837400779128075  
Loss Detector classifier: 0.21231130734086037  
Loss Detector regression: 0.12158064655959606  
Elapsed time: 51.513512134552  
Epoch 850/1000  
Average number of overlapping bounding boxes from RPN = 51.4 for 10 previous iterations  
10/10 [=====] - 61s - rpn\_cls: 0.0517 - rpn\_regr: 0.0486 - detector\_cls:  
0.2385 - detector\_regr: 0.1389  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.6  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.05173109769821167  
Loss RPN regression: 0.04857308603823185  
Loss Detector classifier: 0.2384714663028717  
Loss Detector regression: 0.138896381855011  
Elapsed time: 61.42672514915466  
Epoch 851/1000  
Average number of overlapping bounding boxes from RPN = 54.6 for 10 previous iterations  
10/10 [=====] - 61s - rpn\_cls: 0.0438 - rpn\_regr: 0.0565 - detector\_cls:  
0.2677 - detector\_regr: 0.1282  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.2  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.043839090317487714  
Loss RPN regression: 0.05650409311056137  
Loss Detector classifier: 0.26774443686008453  
Loss Detector regression: 0.12824881300330163  
Elapsed time: 61.64684987068176  
Epoch 852/1000  
Average number of overlapping bounding boxes from RPN = 57.2 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0356 - rpn\_regr: 0.0501 - detector\_cls:  
0.2206 - detector\_regr: 0.1217  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.6  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.035627797991037366  
Loss RPN regression: 0.05010996758937836  
Loss Detector classifier: 0.22059070095419883  
Loss Detector regression: 0.12174808531999588  
Elapsed time: 54.932687282562256



Elapsed time: 34.932007202302230

Epoch 853/1000

Average number of overlapping bounding boxes from RPN = 53.6 for 10 previous iterations

10/10 [=====] - 48s - rpn\_cls: 0.0238 - rpn\_regr: 0.0387 - detector\_cls: 0.1791 - detector\_regr: 0.0973

Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.3

Classifier accuracy for bounding boxes from RPN: 0.9375

Loss RPN classifier: 0.02376588786719367

Loss RPN regression: 0.038683999143540856

Loss Detector classifier: 0.17909908592700957

Loss Detector regression: 0.09730663038790226

Elapsed time: 48.444045543670654

Epoch 854/1000

Average number of overlapping bounding boxes from RPN = 44.3 for 10 previous iterations

10/10 [=====] - 56s - rpn\_cls: 0.0514 - rpn\_regr: 0.0639 - detector\_cls: 0.2496 - detector\_regr: 0.1262

Mean number of bounding boxes from RPN overlapping ground truth boxes: 43.2

Classifier accuracy for bounding boxes from RPN: 0.915625

Loss RPN classifier: 0.05141728236339986

Loss RPN regression: 0.06388141214847565

Loss Detector classifier: 0.24958804808557034

Loss Detector regression: 0.12620621025562287

Elapsed time: 56.372368812561035

Epoch 855/1000

Average number of overlapping bounding boxes from RPN = 43.2 for 10 previous iterations

10/10 [=====] - 38s - rpn\_cls: 0.0475 - rpn\_regr: 0.0599 - detector\_cls: 0.2130 - detector\_regr: 0.1039

Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.6

Classifier accuracy for bounding boxes from RPN: 0.9125

Loss RPN classifier: 0.047530479775741694

Loss RPN regression: 0.05987544097006321

Loss Detector classifier: 0.21302858740091324

Loss Detector regression: 0.1038836095482111

Elapsed time: 38.30721068382263

Epoch 856/1000

Average number of overlapping bounding boxes from RPN = 47.6 for 10 previous iterations

10/10 [=====] - 56s - rpn\_cls: 0.0447 - rpn\_regr: 0.0447 - detector\_cls: 0.1914 - detector\_regr: 0.0928

Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.7

Classifier accuracy for bounding boxes from RPN: 0.934375

Loss RPN classifier: 0.044723208784125744

Loss RPN regression: 0.04472044780850411

Loss Detector classifier: 0.19143413677811622

Loss Detector regression: 0.09281177222728729

Elapsed time: 56.21176218986511

Epoch 857/1000

Average number of overlapping bounding boxes from RPN = 52.7 for 10 previous iterations

10/10 [=====] - 41s - rpn\_cls: 0.0446 - rpn\_regr: 0.0489 - detector\_cls: 0.1780 - detector\_regr: 0.0940

Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.6

Classifier accuracy for bounding boxes from RPN: 0.93125

Loss RPN classifier: 0.044581898185424504

Loss RPN regression: 0.04887208314612508

Loss Detector classifier: 0.17804857194423676

Loss Detector regression: 0.09402729198336601

Elapsed time: 41.588653564453125

Epoch 858/1000

Average number of overlapping bounding boxes from RPN = 44.6 for 10 previous iterations

10/10 [=====] - 56s - rpn\_cls: 0.0449 - rpn\_regr: 0.0524 - detector\_cls: 0.2061 - detector\_regr: 0.0969

Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.7

Classifier accuracy for bounding boxes from RPN: 0.903125

Loss RPN classifier: 0.04492581989616155

Loss RPN regression: 0.05236852709203958

Loss Detector classifier: 0.20606746152043343

Loss Detector regression: 0.09688512422144413

Elapsed time: 56.25615167617798

Epoch 859/1000

Average number of overlapping bounding boxes from RPN = 50.7 for 10 previous iterations

10/10 [=====] - 52s - rpn\_cls: 0.0302 - rpn\_regr: 0.0514 - detector\_cls: 0.2099 - detector\_regr: 0.1105

Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.0

Classifier accuracy for bounding boxes from RPN: 0.925

Loss RPN classifier: 0.030199391883797944

Loss RPN regression: 0.0514437222853303

Loss Detector classifier: 0.20988552197813987

Loss Detector regression: 0.11051557660102844

Elapsed time: 52.51020860671007

Elapsed time: 52.510200000/1997  
Epoch 860/1000  
Average number of overlapping bounding boxes from RPN = 52.0 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0720 - rpn\_regr: 0.0469 - detector\_cls:  
0.1978 - detector\_regr: 0.1111  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.0  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.07203329093754292  
Loss RPN regression: 0.04693576078861952  
Loss Detector classifier: 0.19782408326864243  
Loss Detector regression: 0.11111589446663857  
Elapsed time: 48.18702220916748  
Epoch 861/1000  
Average number of overlapping bounding boxes from RPN = 58.0 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0492 - rpn\_regr: 0.0555 - detector\_cls:  
0.2199 - detector\_regr: 0.1043  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.4  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.049163583759218456  
Loss RPN regression: 0.05546171236783266  
Loss Detector classifier: 0.21988682001829146  
Loss Detector regression: 0.10426579564809799  
Elapsed time: 48.779306173324585  
Epoch 862/1000  
Average number of overlapping bounding boxes from RPN = 54.4 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0466 - rpn\_regr: 0.0479 - detector\_cls:  
0.1874 - detector\_regr: 0.1081  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.4  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04660509303212166  
Loss RPN regression: 0.04793465789407492  
Loss Detector classifier: 0.1874382123351097  
Loss Detector regression: 0.10814101509749889  
Elapsed time: 55.52869367599487  
Epoch 863/1000  
Average number of overlapping bounding boxes from RPN = 60.4 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0428 - rpn\_regr: 0.0509 - detector\_cls:  
0.2008 - detector\_regr: 0.1129  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 65.4  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.04280723514966667  
Loss RPN regression: 0.050860271975398066  
Loss Detector classifier: 0.20077251717448236  
Loss Detector regression: 0.11289018355309963  
Elapsed time: 55.04469180107117  
Epoch 864/1000  
Average number of overlapping bounding boxes from RPN = 65.4 for 10 previous iterations  
10/10 [=====] - 41s - rpn\_cls: 0.0658 - rpn\_regr: 0.0479 - detector\_cls:  
0.1746 - detector\_regr: 0.1050  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.0  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.06578877922147512  
Loss RPN regression: 0.04786672368645668  
Loss Detector classifier: 0.17463535703718663  
Loss Detector regression: 0.10497442819178104  
Elapsed time: 41.535380601882935  
Epoch 865/1000  
Average number of overlapping bounding boxes from RPN = 46.0 for 10 previous iterations  
10/10 [=====] - 69s - rpn\_cls: 0.0317 - rpn\_regr: 0.0442 - detector\_cls:  
0.1608 - detector\_regr: 0.0833  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 43.7  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.031672950554639104  
Loss RPN regression: 0.044230046682059765  
Loss Detector classifier: 0.16077451631426812  
Loss Detector regression: 0.08334179855883121  
Elapsed time: 69.63361859321594  
Epoch 866/1000  
Average number of overlapping bounding boxes from RPN = 43.7 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0509 - rpn\_regr: 0.0528 - detector\_cls:  
0.2307 - detector\_regr: 0.1179  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.1  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.05085847610607743  
Loss RPN regression: 0.052803286164999005  
Loss Detector classifier: 0.23074026629328728  
Loss Detector regression: 0.1178753949701786  
Elapsed time: 52.617500000/1997

Elapsed time: 52.01752829551697  
Epoch 867/1000  
Average number of overlapping bounding boxes from RPN = 56.1 for 10 previous iterations  
10/10 [=====] - 40s - rpn\_cls: 0.0416 - rpn\_regr: 0.0488 - detector\_cls:  
0.2205 - detector\_regr: 0.1168  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.4  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.04158813827671111  
Loss RPN regression: 0.04883005041629076  
Loss Detector classifier: 0.22048910111188888  
Loss Detector regression: 0.11681904941797257  
Elapsed time: 40.832801818847656  
Epoch 868/1000  
Average number of overlapping bounding boxes from RPN = 50.4 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0572 - rpn\_regr: 0.0487 - detector\_cls:  
0.2341 - detector\_regr: 0.1214  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.0  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.057201203610748055  
Loss RPN regression: 0.04869164172559977  
Loss Detector classifier: 0.2341320902109146  
Loss Detector regression: 0.12138818353414535  
Elapsed time: 46.952924966812134  
Epoch 869/1000  
Average number of overlapping bounding boxes from RPN = 52.0 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0503 - rpn\_regr: 0.0653 - detector\_cls:  
0.2633 - detector\_regr: 0.1154  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.6  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.050314531289041044  
Loss RPN regression: 0.06531987152993679  
Loss Detector classifier: 0.26328383237123487  
Loss Detector regression: 0.1153502281755209  
Elapsed time: 51.17962384223938  
Epoch 870/1000  
Average number of overlapping bounding boxes from RPN = 51.6 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0372 - rpn\_regr: 0.0521 - detector\_cls:  
0.2087 - detector\_regr: 0.1259  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.3  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.03724171258509159  
Loss RPN regression: 0.05209615044295788  
Loss Detector classifier: 0.20866496711969376  
Loss Detector regression: 0.1259275831282139  
Elapsed time: 42.912036418914795  
Epoch 871/1000  
Average number of overlapping bounding boxes from RPN = 57.3 for 10 previous iterations  
10/10 [=====] - 61s - rpn\_cls: 0.0373 - rpn\_regr: 0.0425 - detector\_cls:  
0.2157 - detector\_regr: 0.1228  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.2  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.03730887526180595  
Loss RPN regression: 0.042515961639583114  
Loss Detector classifier: 0.21570612192153932  
Loss Detector regression: 0.1228397473692894  
Elapsed time: 61.090065002441406  
Epoch 872/1000  
Average number of overlapping bounding boxes from RPN = 55.2 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0426 - rpn\_regr: 0.0494 - detector\_cls:  
0.2082 - detector\_regr: 0.1123  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 64.9  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.0426056157797575  
Loss RPN regression: 0.04939144030213356  
Loss Detector classifier: 0.20823810398578643  
Loss Detector regression: 0.11232517696917058  
Elapsed time: 50.51283001899719  
Epoch 873/1000  
Average number of overlapping bounding boxes from RPN = 64.9 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0653 - rpn\_regr: 0.0592 - detector\_cls:  
0.2089 - detector\_regr: 0.1286  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.2  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.06529892683029175  
Loss RPN regression: 0.05922919698059559  
Loss Detector classifier: 0.20892677903175355  
Loss Detector regression: 0.1286381021142006  
Epoch 874/1000  
Average number of overlapping bounding boxes from RPN = 50.0 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0426 - rpn\_regr: 0.0494 - detector\_cls:  
0.2082 - detector\_regr: 0.1123  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 64.9  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.0426056157797575  
Loss RPN regression: 0.04939144030213356  
Loss Detector classifier: 0.20823810398578643  
Loss Detector regression: 0.11232517696917058  
Elapsed time: 50.51283001899719

Elapsed time: 58.8609711285156  
Epoch 874/1000  
Average number of overlapping bounding boxes from RPN = 46.2 for 10 previous iterations  
10/10 [=====] - 65s - rpn\_cls: 0.0483 - rpn\_regr: 0.0555 - detector\_cls:  
0.2184 - detector\_regr: 0.0986  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.9  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.04827817697077989  
Loss RPN regression: 0.05547816678881645  
Loss Detector classifier: 0.21837625056505203  
Loss Detector regression: 0.09863748922944068  
Elapsed time: 65.2443335056305  
Epoch 875/1000  
Average number of overlapping bounding boxes from RPN = 57.9 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0484 - rpn\_regr: 0.0444 - detector\_cls:  
0.2211 - detector\_regr: 0.1006  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 42.1  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.04839900494553149  
Loss RPN regression: 0.04435933418571949  
Loss Detector classifier: 0.2210821747779846  
Loss Detector regression: 0.10063287429511547  
Elapsed time: 43.15395140647888  
Epoch 876/1000  
Average number of overlapping bounding boxes from RPN = 42.1 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0390 - rpn\_regr: 0.0540 - detector\_cls:  
0.1631 - detector\_regr: 0.1060  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.4  
Classifier accuracy for bounding boxes from RPN: 0.946875  
Loss RPN classifier: 0.0390163098461926  
Loss RPN regression: 0.053978082910180095  
Loss Detector classifier: 0.16306452937424182  
Loss Detector regression: 0.10598689280450344  
Elapsed time: 45.50022912025452  
Epoch 877/1000  
Average number of overlapping bounding boxes from RPN = 52.4 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0519 - rpn\_regr: 0.0571 - detector\_cls:  
0.2448 - detector\_regr: 0.1180  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.5  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.05188558865338564  
Loss RPN regression: 0.05709620285779238  
Loss Detector classifier: 0.24483248889446257  
Loss Detector regression: 0.11800356023013592  
Elapsed time: 52.40679907798767  
Epoch 878/1000  
Average number of overlapping bounding boxes from RPN = 58.5 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0382 - rpn\_regr: 0.0455 - detector\_cls:  
0.2096 - detector\_regr: 0.1241  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.5  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.03816606281325221  
Loss RPN regression: 0.04548567663878202  
Loss Detector classifier: 0.20958343595266343  
Loss Detector regression: 0.12411722280085087  
Elapsed time: 42.32863998413086  
Epoch 879/1000  
Average number of overlapping bounding boxes from RPN = 52.5 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0390 - rpn\_regr: 0.0488 - detector\_cls:  
0.2279 - detector\_regr: 0.1108  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.6  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.039016814436763525  
Loss RPN regression: 0.04882796220481396  
Loss Detector classifier: 0.22793762236833573  
Loss Detector regression: 0.11076011285185813  
Elapsed time: 51.6818733215332  
Epoch 880/1000  
Average number of overlapping bounding boxes from RPN = 58.6 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0444 - rpn\_regr: 0.0479 - detector\_cls:  
0.2181 - detector\_regr: 0.1289  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.6  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.04442369854077697  
Loss RPN regression: 0.04788979217410087  
Loss Detector classifier: 0.21812800765037538  
Loss Detector regression: 0.1289449743926525

Elapsed time: 48.10702180862427  
Epoch 881/1000  
Average number of overlapping bounding boxes from RPN = 50.6 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0519 - rpn\_regr: 0.0471 - detector\_cls:  
0.2416 - detector\_regr: 0.1095  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.8  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.05191454757004976  
Loss RPN regression: 0.047076514922082424  
Loss Detector classifier: 0.24158710539340972  
Loss Detector regression: 0.1094980288296938  
Elapsed time: 58.3845272064209  
Epoch 882/1000  
Average number of overlapping bounding boxes from RPN = 56.8 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0508 - rpn\_regr: 0.0480 - detector\_cls:  
0.2210 - detector\_regr: 0.0948  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.2  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.0508344650734216  
Loss RPN regression: 0.0479692691937089  
Loss Detector classifier: 0.2210301138460636  
Loss Detector regression: 0.09477936699986458  
Elapsed time: 45.76307249069214  
Epoch 883/1000  
Average number of overlapping bounding boxes from RPN = 50.2 for 10 previous iterations  
10/10 [=====] - 67s - rpn\_cls: 0.0367 - rpn\_regr: 0.0521 - detector\_cls:  
0.1381 - detector\_regr: 0.0987  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.9  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.036708541307598354  
Loss RPN regression: 0.05207634940743446  
Loss Detector classifier: 0.13814039900898933  
Loss Detector regression: 0.09870329014956951  
Elapsed time: 67.21500515937805  
Epoch 884/1000  
Average number of overlapping bounding boxes from RPN = 54.9 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0569 - rpn\_regr: 0.0461 - detector\_cls:  
0.1638 - detector\_regr: 0.0976  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.3  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.056851804023608565  
Loss RPN regression: 0.046113797649741176  
Loss Detector classifier: 0.163750084862113  
Loss Detector regression: 0.0976031593978405  
Elapsed time: 53.11220693588257  
Epoch 885/1000  
Average number of overlapping bounding boxes from RPN = 46.3 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0379 - rpn\_regr: 0.0387 - detector\_cls:  
0.1660 - detector\_regr: 0.0836  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.9  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.037937844078987835  
Loss RPN regression: 0.038705034926533696  
Loss Detector classifier: 0.16600431352853776  
Loss Detector regression: 0.08356232717633247  
Elapsed time: 42.678706884384155  
Epoch 886/1000  
Average number of overlapping bounding boxes from RPN = 53.9 for 10 previous iterations  
10/10 [=====] - 57s - rpn\_cls: 0.0386 - rpn\_regr: 0.0606 - detector\_cls:  
0.1975 - detector\_regr: 0.1192  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.7  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.03860161737538874  
Loss RPN regression: 0.06064281705766916  
Loss Detector classifier: 0.19751621633768082  
Loss Detector regression: 0.11919242329895496  
Elapsed time: 57.593037843704224  
Epoch 887/1000  
Average number of overlapping bounding boxes from RPN = 51.7 for 10 previous iterations  
10/10 [=====] - 69s - rpn\_cls: 0.0641 - rpn\_regr: 0.0478 - detector\_cls:  
0.1990 - detector\_regr: 0.1083  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 64.2  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.06413183314725757  
Loss RPN regression: 0.0478293526917696  
Loss Detector classifier: 0.1989906206727028  
Loss Detector regression: 0.10827768817543984

Elapsed time: 69.93905115127563  
Epoch 888/1000  
Average number of overlapping bounding boxes from RPN = 64.2 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0492 - rpn\_regr: 0.0408 - detector\_cls:  
0.2195 - detector\_regr: 0.0974  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.2  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.04920798373641446  
Loss RPN regression: 0.04076638892292976  
Loss Detector classifier: 0.2194595977663994  
Loss Detector regression: 0.09739542454481125  
Elapsed time: 56.789055824279785  
Epoch 889/1000  
Average number of overlapping bounding boxes from RPN = 53.2 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0656 - rpn\_regr: 0.0584 - detector\_cls:  
0.2826 - detector\_regr: 0.1347  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.1  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.06556450969073921  
Loss RPN regression: 0.058351768925786016  
Loss Detector classifier: 0.2826251298189163  
Loss Detector regression: 0.13472885340452195  
Elapsed time: 53.29320287704468  
Epoch 890/1000  
Average number of overlapping bounding boxes from RPN = 55.1 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0350 - rpn\_regr: 0.0442 - detector\_cls:  
0.1542 - detector\_regr: 0.1157  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.9  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.03501227768138051  
Loss RPN regression: 0.044202938489615914  
Loss Detector classifier: 0.15423672497272492  
Loss Detector regression: 0.11572443470358848  
Elapsed time: 43.45302391052246  
Epoch 891/1000  
Average number of overlapping bounding boxes from RPN = 50.9 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0597 - rpn\_regr: 0.0530 - detector\_cls:  
0.2715 - detector\_regr: 0.1471  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.0  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.059711783099919556  
Loss RPN regression: 0.0529775507748127  
Loss Detector classifier: 0.2714952573180199  
Loss Detector regression: 0.14711032658815384  
Elapsed time: 58.41800808906555  
Epoch 892/1000  
Average number of overlapping bounding boxes from RPN = 56.0 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0612 - rpn\_regr: 0.0550 - detector\_cls:  
0.2201 - detector\_regr: 0.1140  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.2  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.061225424706935885  
Loss RPN regression: 0.054951397329568864  
Loss Detector classifier: 0.22011649310588838  
Loss Detector regression: 0.11400173902511597  
Elapsed time: 52.28911900520325  
Epoch 893/1000  
Average number of overlapping bounding boxes from RPN = 56.2 for 10 previous iterations  
10/10 [=====] - 73s - rpn\_cls: 0.0622 - rpn\_regr: 0.0565 - detector\_cls:  
0.1893 - detector\_regr: 0.1290  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.0  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.06215957636013627  
Loss RPN regression: 0.05648645460605621  
Loss Detector classifier: 0.18928161449730396  
Loss Detector regression: 0.12903414890170098  
Elapsed time: 73.3966498374939  
Epoch 894/1000  
Average number of overlapping bounding boxes from RPN = 59.0 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0453 - rpn\_regr: 0.0443 - detector\_cls:  
0.2306 - detector\_regr: 0.1068  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 37.5  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.045253163855522874  
Loss RPN regression: 0.0443457268178463  
Loss Detector classifier: 0.23058354817330837  
Loss Detector regression: 0.10682866349816322

Elapsed time: 42.90639138221741  
Epoch 895/1000  
Average number of overlapping bounding boxes from RPN = 37.5 for 10 previous iterations  
10/10 [=====] - 39s - rpn\_cls: 0.0423 - rpn\_regr: 0.0447 - detector\_cls:  
0.1393 - detector\_regr: 0.0978  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.5  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.042303902469575404  
Loss RPN regression: 0.044704041071236135  
Loss Detector classifier: 0.1393462408334017  
Loss Detector regression: 0.09776823185384273  
Elapsed time: 39.401569843292236  
Epoch 896/1000  
Average number of overlapping bounding boxes from RPN = 47.5 for 10 previous iterations  
10/10 [=====] - 63s - rpn\_cls: 0.0518 - rpn\_regr: 0.0523 - detector\_cls:  
0.2359 - detector\_regr: 0.1215  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.0  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.05182986548170447  
Loss RPN regression: 0.052327700145542624  
Loss Detector classifier: 0.2359260380268097  
Loss Detector regression: 0.12153852954506875  
Elapsed time: 63.16161632537842  
Epoch 897/1000  
Average number of overlapping bounding boxes from RPN = 54.0 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0340 - rpn\_regr: 0.0390 - detector\_cls:  
0.1744 - detector\_regr: 0.0743  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.6  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.03402379078324884  
Loss RPN regression: 0.03903058096766472  
Loss Detector classifier: 0.17444476932287217  
Loss Detector regression: 0.07426722310483455  
Elapsed time: 56.70299482345581  
Epoch 898/1000  
Average number of overlapping bounding boxes from RPN = 53.6 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0468 - rpn\_regr: 0.0494 - detector\_cls:  
0.1215 - detector\_regr: 0.0920  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.4  
Classifier accuracy for bounding boxes from RPN: 0.96875  
Loss RPN classifier: 0.046762735256925224  
Loss RPN regression: 0.04939223118126392  
Loss Detector classifier: 0.12153530344367028  
Loss Detector regression: 0.09202592205256224  
Elapsed time: 47.551119565963745  
Epoch 899/1000  
Average number of overlapping bounding boxes from RPN = 56.4 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0595 - rpn\_regr: 0.0564 - detector\_cls:  
0.2157 - detector\_regr: 0.1036  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.9  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.05951859443448484  
Loss RPN regression: 0.0563699521124363  
Loss Detector classifier: 0.215675051510334  
Loss Detector regression: 0.10362935997545719  
Elapsed time: 43.756083965301514  
Epoch 900/1000  
Average number of overlapping bounding boxes from RPN = 51.9 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0402 - rpn\_regr: 0.0673 - detector\_cls:  
0.2486 - detector\_regr: 0.1208  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.2  
Classifier accuracy for bounding boxes from RPN: 0.89375  
Loss RPN classifier: 0.04022505301982164  
Loss RPN regression: 0.06729377619922161  
Loss Detector classifier: 0.24856856018304824  
Loss Detector regression: 0.12080382592976094  
Elapsed time: 50.89739751815796  
Epoch 901/1000  
Average number of overlapping bounding boxes from RPN = 52.2 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0352 - rpn\_regr: 0.0517 - detector\_cls:  
0.1980 - detector\_regr: 0.1091  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.8  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.035229103593155744  
Loss RPN regression: 0.05173604134470224  
Loss Detector classifier: 0.19797925278544426  
Loss Detector regression: 0.109102251380682

Elapsed time: 51.56587767601013  
Epoch 902/1000  
Average number of overlapping bounding boxes from RPN = 49.8 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0520 - rpn\_regr: 0.0485 - detector\_cls:  
0.2272 - detector\_regr: 0.1063  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.6  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.052039551362395284  
Loss RPN regression: 0.04850945305079222  
Loss Detector classifier: 0.22718870900571347  
Loss Detector regression: 0.10634834766387939  
Elapsed time: 47.262394428253174  
Epoch 903/1000  
Average number of overlapping bounding boxes from RPN = 55.6 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0650 - rpn\_regr: 0.0531 - detector\_cls:  
0.2029 - detector\_regr: 0.1079  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.5  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.06497273499844596  
Loss RPN regression: 0.05306966193020344  
Loss Detector classifier: 0.20290397182106973  
Loss Detector regression: 0.10787679292261601  
Elapsed time: 58.79066872596741  
Epoch 904/1000  
Average number of overlapping bounding boxes from RPN = 57.5 for 10 previous iterations  
10/10 [=====] - 62s - rpn\_cls: 0.0483 - rpn\_regr: 0.0428 - detector\_cls:  
0.1773 - detector\_regr: 0.1024  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.4  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.048330134712159634  
Loss RPN regression: 0.04277288019657135  
Loss Detector classifier: 0.177322818338871  
Loss Detector regression: 0.10237603522837162  
Elapsed time: 62.49124264717102  
Epoch 905/1000  
Average number of overlapping bounding boxes from RPN = 56.4 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0672 - rpn\_regr: 0.0503 - detector\_cls:  
0.1919 - detector\_regr: 0.1376  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.9  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.06722939119208604  
Loss RPN regression: 0.05034764688462019  
Loss Detector classifier: 0.19193097874522208  
Loss Detector regression: 0.1375881128013134  
Elapsed time: 47.38091230392456  
Epoch 906/1000  
Average number of overlapping bounding boxes from RPN = 56.9 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0483 - rpn\_regr: 0.0514 - detector\_cls:  
0.2514 - detector\_regr: 0.1168  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.6  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.048259520437568426  
Loss RPN regression: 0.05141471326351166  
Loss Detector classifier: 0.2513651214540005  
Loss Detector regression: 0.11675637923181056  
Elapsed time: 49.649131774902344  
Epoch 907/1000  
Average number of overlapping bounding boxes from RPN = 50.6 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0441 - rpn\_regr: 0.0586 - detector\_cls:  
0.2755 - detector\_regr: 0.1493  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 61.5  
Classifier accuracy for bounding boxes from RPN: 0.884375  
Loss RPN classifier: 0.04406157217454165  
Loss RPN regression: 0.058601094596087935  
Loss Detector classifier: 0.2755053423345089  
Loss Detector regression: 0.1492567092180252  
Elapsed time: 55.12934923171997  
Epoch 908/1000  
Average number of overlapping bounding boxes from RPN = 61.5 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0358 - rpn\_regr: 0.0442 - detector\_cls:  
0.1658 - detector\_regr: 0.0815  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.0  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.03576347006019205  
Loss RPN regression: 0.0442379517480731  
Loss Detector classifier: 0.16580515056848527  
Loss Detector regression: 0.08148209489881993



Elapsed time: 42.628228187561035  
Epoch 909/1000  
Average number of overlapping bounding boxes from RPN = 52.0 for 10 previous iterations  
10/10 [=====] - 61s - rpn\_cls: 0.0579 - rpn\_regr: 0.0490 - detector\_cls:  
0.2025 - detector\_regr: 0.1223  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.3  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.057885115244425835  
Loss RPN regression: 0.04899873342365026  
Loss Detector classifier: 0.20246866568922997  
Loss Detector regression: 0.122262067720294  
Elapsed time: 61.145405530929565  
Epoch 910/1000  
Average number of overlapping bounding boxes from RPN = 45.3 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0454 - rpn\_regr: 0.0504 - detector\_cls:  
0.1538 - detector\_regr: 0.0964  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.0  
Classifier accuracy for bounding boxes from RPN: 0.95  
Loss RPN classifier: 0.04543477352708578  
Loss RPN regression: 0.05043815262615681  
Loss Detector classifier: 0.15376126132905482  
Loss Detector regression: 0.09639501348137855  
Elapsed time: 45.447829723358154  
Epoch 911/1000  
Average number of overlapping bounding boxes from RPN = 57.0 for 10 previous iterations  
10/10 [=====] - 57s - rpn\_cls: 0.0565 - rpn\_regr: 0.0565 - detector\_cls:  
0.2685 - detector\_regr: 0.1301  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.3  
Classifier accuracy for bounding boxes from RPN: 0.890625  
Loss RPN classifier: 0.05647638998925686  
Loss RPN regression: 0.05645422078669071  
Loss Detector classifier: 0.2684702709317207  
Loss Detector regression: 0.13006461076438428  
Elapsed time: 57.12996578216553  
Epoch 912/1000  
Average number of overlapping bounding boxes from RPN = 55.3 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0653 - rpn\_regr: 0.0526 - detector\_cls:  
0.2455 - detector\_regr: 0.1064  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.8  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.06531382836401463  
Loss RPN regression: 0.052612202055752275  
Loss Detector classifier: 0.24551046043634414  
Loss Detector regression: 0.10636599622666836  
Elapsed time: 53.727604389190674  
Epoch 913/1000  
Average number of overlapping bounding boxes from RPN = 54.8 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0518 - rpn\_regr: 0.0417 - detector\_cls:  
0.1608 - detector\_regr: 0.1129  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.4  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.05180028062313795  
Loss RPN regression: 0.04173977375030517  
Loss Detector classifier: 0.16078810915350913  
Loss Detector regression: 0.11294768899679183  
Elapsed time: 46.829174518585205  
Epoch 914/1000  
Average number of overlapping bounding boxes from RPN = 50.4 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0282 - rpn\_regr: 0.0458 - detector\_cls:  
0.2439 - detector\_regr: 0.0951  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.6  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.02821453628130257  
Loss RPN regression: 0.04580927528440952  
Loss Detector classifier: 0.24393284618854522  
Loss Detector regression: 0.09506973251700401  
Elapsed time: 55.00700879096985  
Epoch 915/1000  
Average number of overlapping bounding boxes from RPN = 51.6 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0503 - rpn\_regr: 0.0611 - detector\_cls:  
0.2238 - detector\_regr: 0.1354  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.1  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.0502556110965088  
Loss RPN regression: 0.06114570870995521  
Loss Detector classifier: 0.22381720021367074  
Loss Detector regression: 0.1354075100272894

Elapsed time: 59.366756200790405  
Epoch 916/1000  
Average number of overlapping bounding boxes from RPN = 54.1 for 10 previous iterations  
10/10 [=====] - 80s - rpn\_cls: 0.0662 - rpn\_regr: 0.0541 - detector\_cls:  
0.2083 - detector\_regr: 0.1230  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.1  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.06624625772237777  
Loss RPN regression: 0.05406927168369293  
Loss Detector classifier: 0.20833624005317689  
Loss Detector regression: 0.12303818874061108  
Elapsed time: 80.65140104293823  
Epoch 917/1000  
Average number of overlapping bounding boxes from RPN = 56.1 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0590 - rpn\_regr: 0.0465 - detector\_cls:  
0.2337 - detector\_regr: 0.1339  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.7  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.05900156619027257  
Loss RPN regression: 0.046466753259301184  
Loss Detector classifier: 0.233687175065279  
Loss Detector regression: 0.1339070864021778  
Elapsed time: 56.887348890304565  
Epoch 918/1000  
Average number of overlapping bounding boxes from RPN = 50.7 for 10 previous iterations  
10/10 [=====] - 63s - rpn\_cls: 0.0712 - rpn\_regr: 0.0491 - detector\_cls:  
0.2217 - detector\_regr: 0.1071  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.5  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.07116190791130066  
Loss RPN regression: 0.04910021107643843  
Loss Detector classifier: 0.22171987667679788  
Loss Detector regression: 0.10708446502685547  
Elapsed time: 63.43649339675903  
Epoch 919/1000  
Average number of overlapping bounding boxes from RPN = 58.5 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0701 - rpn\_regr: 0.0538 - detector\_cls:  
0.2654 - detector\_regr: 0.1250  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.6  
Classifier accuracy for bounding boxes from RPN: 0.878125  
Loss RPN classifier: 0.07012348524294794  
Loss RPN regression: 0.05383739396929741  
Loss Detector classifier: 0.2653695188462734  
Loss Detector regression: 0.12495416328310967  
Elapsed time: 60.602372884750366  
Epoch 920/1000  
Average number of overlapping bounding boxes from RPN = 59.6 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0488 - rpn\_regr: 0.0459 - detector\_cls:  
0.1807 - detector\_regr: 0.1247  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.1  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.048808754328638314  
Loss RPN regression: 0.04590585418045521  
Loss Detector classifier: 0.18071128576993942  
Loss Detector regression: 0.12474040500819683  
Elapsed time: 49.18293333053589  
Epoch 921/1000  
Average number of overlapping bounding boxes from RPN = 49.1 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0575 - rpn\_regr: 0.0437 - detector\_cls:  
0.2205 - detector\_regr: 0.1028  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.2  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.05752727426588535  
Loss RPN regression: 0.04373564012348652  
Loss Detector classifier: 0.22048208266496658  
Loss Detector regression: 0.10278464294970036  
Elapsed time: 59.11797475814819  
Epoch 922/1000  
Average number of overlapping bounding boxes from RPN = 59.2 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0569 - rpn\_regr: 0.0516 - detector\_cls:  
0.2075 - detector\_regr: 0.1346  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.7  
Classifier accuracy for bounding boxes from RPN: 0.91875  
Loss RPN classifier: 0.05691849257564172  
Loss RPN regression: 0.05160982701927423  
Loss Detector classifier: 0.2075177151709795  
Loss Detector regression: 0.13460638597607613

Elapsed time: 56.24067974090576  
Epoch 923/1000  
Average number of overlapping bounding boxes from RPN = 47.7 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0653 - rpn\_regr: 0.0472 - detector\_cls: 0.2396 - detector\_regr: 0.1084  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.0  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.06529002891620621  
Loss RPN regression: 0.047176146693527696  
Loss Detector classifier: 0.23963000290095807  
Loss Detector regression: 0.10844044778496027  
Elapsed time: 50.06467819213867  
Epoch 924/1000  
Average number of overlapping bounding boxes from RPN = 59.0 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0231 - rpn\_regr: 0.0369 - detector\_cls: 0.1362 - detector\_regr: 0.1012  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 39.5  
Classifier accuracy for bounding boxes from RPN: 0.953125  
Loss RPN classifier: 0.023076644726097585  
Loss RPN regression: 0.03693111632019282  
Loss Detector classifier: 0.13623478598892688  
Loss Detector regression: 0.10124544315040111  
Elapsed time: 42.29126024246216  
Epoch 925/1000  
Average number of overlapping bounding boxes from RPN = 39.5 for 10 previous iterations  
10/10 [=====] - 64s - rpn\_cls: 0.0376 - rpn\_regr: 0.0358 - detector\_cls: 0.1974 - detector\_regr: 0.0885  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 43.0  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.03755380974616855  
Loss RPN regression: 0.03577392306178808  
Loss Detector classifier: 0.19736776128411293  
Loss Detector regression: 0.08847409412264824  
Elapsed time: 64.14943051338196  
Epoch 926/1000  
Average number of overlapping bounding boxes from RPN = 43.0 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0485 - rpn\_regr: 0.0477 - detector\_cls: 0.2417 - detector\_regr: 0.0930  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.6  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.048544248659163715  
Loss RPN regression: 0.04769082814455032  
Loss Detector classifier: 0.24171126261353493  
Loss Detector regression: 0.09302222616970539  
Elapsed time: 49.0962975025177  
Epoch 927/1000  
Average number of overlapping bounding boxes from RPN = 49.6 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0665 - rpn\_regr: 0.0512 - detector\_cls: 0.1837 - detector\_regr: 0.1141  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.4  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.06650264956988394  
Loss RPN regression: 0.05124787669628859  
Loss Detector classifier: 0.18371870443224908  
Loss Detector regression: 0.11406919434666633  
Elapsed time: 47.508784770965576  
Epoch 928/1000  
Average number of overlapping bounding boxes from RPN = 56.4 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0452 - rpn\_regr: 0.0549 - detector\_cls: 0.1814 - detector\_regr: 0.1144  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.4  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.04518056896049529  
Loss RPN regression: 0.054855779744684696  
Loss Detector classifier: 0.18135784827172757  
Loss Detector regression: 0.11435509026050568  
Elapsed time: 42.24149227142334  
Epoch 929/1000  
Average number of overlapping bounding boxes from RPN = 48.4 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0430 - rpn\_regr: 0.0550 - detector\_cls: 0.1463 - detector\_regr: 0.1043  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.3  
Classifier accuracy for bounding boxes from RPN: 0.95  
Loss RPN classifier: 0.04296039203181863  
Loss RPN regression: 0.054953303374350074  
Loss Detector classifier: 0.14629476889967918  
Loss Detector regression: 0.10432409942150116

Elapsed time: 55.55634808540344  
Epoch 930/1000  
Average number of overlapping bounding boxes from RPN = 58.3 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0509 - rpn\_regr: 0.0595 - detector\_cls:  
0.2188 - detector\_regr: 0.1163  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.3  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.05093498816713691  
Loss RPN regression: 0.059472573921084404  
Loss Detector classifier: 0.21882705613970757  
Loss Detector regression: 0.1163265448063612  
Elapsed time: 52.618154525756836  
Epoch 931/1000  
Average number of overlapping bounding boxes from RPN = 56.3 for 10 previous iterations  
10/10 [=====] - 44s - rpn\_cls: 0.0369 - rpn\_regr: 0.0470 - detector\_cls:  
0.2436 - detector\_regr: 0.1024  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.1  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.036876450106501577  
Loss RPN regression: 0.0469620019197464  
Loss Detector classifier: 0.24362433552742005  
Loss Detector regression: 0.10240502208471298  
Elapsed time: 44.433738708496094  
Epoch 932/1000  
Average number of overlapping bounding boxes from RPN = 50.1 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0490 - rpn\_regr: 0.0459 - detector\_cls:  
0.1948 - detector\_regr: 0.1029  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.6  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.04901292659342289  
Loss RPN regression: 0.04591491054743528  
Loss Detector classifier: 0.19476353451609613  
Loss Detector regression: 0.1028628632426262  
Elapsed time: 56.449076414108276  
Epoch 933/1000  
Average number of overlapping bounding boxes from RPN = 51.6 for 10 previous iterations  
10/10 [=====] - 39s - rpn\_cls: 0.0349 - rpn\_regr: 0.0419 - detector\_cls:  
0.2303 - detector\_regr: 0.1055  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.5  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.034913674998097124  
Loss RPN regression: 0.04190717414021492  
Loss Detector classifier: 0.23030934780836104  
Loss Detector regression: 0.10553637258708477  
Elapsed time: 39.890769481658936  
Epoch 934/1000  
Average number of overlapping bounding boxes from RPN = 48.5 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0537 - rpn\_regr: 0.0529 - detector\_cls:  
0.1665 - detector\_regr: 0.0980  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.1  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.05374140162020922  
Loss RPN regression: 0.05289228418841958  
Loss Detector classifier: 0.166514628008008  
Loss Detector regression: 0.09804697781801223  
Elapsed time: 48.625986099243164  
Epoch 935/1000  
Average number of overlapping bounding boxes from RPN = 54.1 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0489 - rpn\_regr: 0.0356 - detector\_cls:  
0.2014 - detector\_regr: 0.0980  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.2  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.048925901344045994  
Loss RPN regression: 0.03563094809651375  
Loss Detector classifier: 0.2014228280633688  
Loss Detector regression: 0.09803641140460968  
Elapsed time: 48.71918773651123  
Epoch 936/1000  
Average number of overlapping bounding boxes from RPN = 46.2 for 10 previous iterations  
10/10 [=====] - 52s - rpn\_cls: 0.0589 - rpn\_regr: 0.0513 - detector\_cls:  
0.1994 - detector\_regr: 0.0991  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.1  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.058875248208642005  
Loss RPN regression: 0.05133102126419544  
Loss Detector classifier: 0.19944024458527565  
Loss Detector regression: 0.09910158328711986

Elapsed time: 52.10378837585449  
Epoch 937/1000  
Average number of overlapping bounding boxes from RPN = 59.1 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0398 - rpn\_regr: 0.0384 - detector\_cls:  
0.1842 - detector\_regr: 0.0991  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.0  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.039775447361171244  
Loss RPN regression: 0.03842451311647892  
Loss Detector classifier: 0.1841624915599823  
Loss Detector regression: 0.09910938218235969  
Elapsed time: 59.092219829559326  
Epoch 938/1000  
Average number of overlapping bounding boxes from RPN = 55.0 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0232 - rpn\_regr: 0.0505 - detector\_cls:  
0.2268 - detector\_regr: 0.0876  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.7  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.023202592693269252  
Loss RPN regression: 0.050484496913850305  
Loss Detector classifier: 0.22682213559746742  
Loss Detector regression: 0.08756621070206165  
Elapsed time: 53.86168885231018  
Epoch 939/1000  
Average number of overlapping bounding boxes from RPN = 54.7 for 10 previous iterations  
10/10 [=====] - 44s - rpn\_cls: 0.0602 - rpn\_regr: 0.0429 - detector\_cls:  
0.2405 - detector\_regr: 0.0989  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.5  
Classifier accuracy for bounding boxes from RPN: 0.8875  
Loss RPN classifier: 0.06018038764595986  
Loss RPN regression: 0.04294869266450405  
Loss Detector classifier: 0.24049085676670073  
Loss Detector regression: 0.09887603111565113  
Elapsed time: 44.52135872840881  
Epoch 940/1000  
Average number of overlapping bounding boxes from RPN = 50.5 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0433 - rpn\_regr: 0.0560 - detector\_cls:  
0.1702 - detector\_regr: 0.1001  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 51.4  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04334785519167781  
Loss RPN regression: 0.05596712082624435  
Loss Detector classifier: 0.17016418129205704  
Loss Detector regression: 0.10014770440757274  
Elapsed time: 58.51582217216492  
Epoch 941/1000  
Average number of overlapping bounding boxes from RPN = 51.4 for 10 previous iterations  
10/10 [=====] - 44s - rpn\_cls: 0.0461 - rpn\_regr: 0.0513 - detector\_cls:  
0.1431 - detector\_regr: 0.0932  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.6  
Classifier accuracy for bounding boxes from RPN: 0.953125  
Loss RPN classifier: 0.046099683619104326  
Loss RPN regression: 0.05129450904205442  
Loss Detector classifier: 0.14310366827994586  
Loss Detector regression: 0.09323574155569077  
Elapsed time: 44.34395980834961  
Epoch 942/1000  
Average number of overlapping bounding boxes from RPN = 54.6 for 10 previous iterations  
10/10 [=====] - 57s - rpn\_cls: 0.0664 - rpn\_regr: 0.0676 - detector\_cls:  
0.3178 - detector\_regr: 0.1279  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.6  
Classifier accuracy for bounding boxes from RPN: 0.884375  
Loss RPN classifier: 0.06641522743739188  
Loss RPN regression: 0.06757433414459228  
Loss Detector classifier: 0.3178271144628525  
Loss Detector regression: 0.12791866436600685  
Elapsed time: 57.50858426094055  
Epoch 943/1000  
Average number of overlapping bounding boxes from RPN = 55.6 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0658 - rpn\_regr: 0.0635 - detector\_cls:  
0.2370 - detector\_regr: 0.1118  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.1  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.06576643232256174  
Loss RPN regression: 0.06354226097464562  
Loss Detector classifier: 0.23703587502241136  
Loss Detector regression: 0.11183022148907185

Elapsed time: 59.10327911376953  
Epoch 944/1000  
Average number of overlapping bounding boxes from RPN = 54.1 for 10 previous iterations  
10/10 [=====] - 63s - rpn\_cls: 0.0497 - rpn\_regr: 0.0572 - detector\_cls: 0.1845 - detector\_regr: 0.1224  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 53.5  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.04974745512008667  
Loss RPN regression: 0.05722368992865086  
Loss Detector classifier: 0.18448506891727448  
Loss Detector regression: 0.12242665924131871  
Elapsed time: 63.60227394104004  
Epoch 945/1000  
Average number of overlapping bounding boxes from RPN = 53.5 for 10 previous iterations  
10/10 [=====] - 38s - rpn\_cls: 0.0266 - rpn\_regr: 0.0437 - detector\_cls: 0.2282 - detector\_regr: 0.0939  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.9  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.026577043021097778  
Loss RPN regression: 0.04368610382080078  
Loss Detector classifier: 0.22819873988628386  
Loss Detector regression: 0.09394171498715878  
Elapsed time: 38.70194602012634  
Epoch 946/1000  
Average number of overlapping bounding boxes from RPN = 46.9 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0393 - rpn\_regr: 0.0543 - detector\_cls: 0.2551 - detector\_regr: 0.0938  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.5  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.0392605418805033  
Loss RPN regression: 0.0543491804972291  
Loss Detector classifier: 0.2551244989037514  
Loss Detector regression: 0.09377557188272476  
Elapsed time: 47.58283257484436  
Epoch 947/1000  
Average number of overlapping bounding boxes from RPN = 52.5 for 10 previous iterations  
10/10 [=====] - 46s - rpn\_cls: 0.0477 - rpn\_regr: 0.0493 - detector\_cls: 0.2189 - detector\_regr: 0.0876  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.0  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.047651509568095204  
Loss RPN regression: 0.04934711549431085  
Loss Detector classifier: 0.2188610166311264  
Loss Detector regression: 0.08763065375387669  
Elapsed time: 46.99471092224121  
Epoch 948/1000  
Average number of overlapping bounding boxes from RPN = 54.0 for 10 previous iterations  
10/10 [=====] - 61s - rpn\_cls: 0.0707 - rpn\_regr: 0.0513 - detector\_cls: 0.1991 - detector\_regr: 0.1439  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 69.1  
Classifier accuracy for bounding boxes from RPN: 0.946875  
Loss RPN classifier: 0.07073191944509745  
Loss RPN regression: 0.0512941163033247  
Loss Detector classifier: 0.19914325289428234  
Loss Detector regression: 0.14394736737012864  
Elapsed time: 61.83835530281067  
Epoch 949/1000  
Average number of overlapping bounding boxes from RPN = 69.1 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0521 - rpn\_regr: 0.0568 - detector\_cls: 0.1858 - detector\_regr: 0.1151  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.6  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.052143702656030654  
Loss RPN regression: 0.05683065764605999  
Loss Detector classifier: 0.18575234115123748  
Loss Detector regression: 0.11506358496844768  
Elapsed time: 50.95508694648743  
Epoch 950/1000  
Average number of overlapping bounding boxes from RPN = 45.6 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0450 - rpn\_regr: 0.0521 - detector\_cls: 0.2254 - detector\_regr: 0.1261  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.5  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.04495756558608264  
Loss RPN regression: 0.052067391388118264  
Loss Detector classifier: 0.2254285892471671  
Loss Detector regression: 0.12607088424265384

Elapsed time: 53.566970109939575  
Epoch 951/1000  
Average number of overlapping bounding boxes from RPN = 49.5 for 10 previous iterations  
10/10 [=====] - 70s - rpn\_cls: 0.0357 - rpn\_regr: 0.0541 - detector\_cls:  
0.2013 - detector\_regr: 0.1067  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 60.7  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.03571159178391099  
Loss RPN regression: 0.054135614261031154  
Loss Detector classifier: 0.20133024752140044  
Loss Detector regression: 0.10674611404538155  
Elapsed time: 70.49467515945435  
Epoch 952/1000  
Average number of overlapping bounding boxes from RPN = 60.7 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0591 - rpn\_regr: 0.0651 - detector\_cls:  
0.2197 - detector\_regr: 0.1137  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.8  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.059056208748370406  
Loss RPN regression: 0.0651362169533968  
Loss Detector classifier: 0.2196650005877018  
Loss Detector regression: 0.1136528380215168  
Elapsed time: 50.73330736160278  
Epoch 953/1000  
Average number of overlapping bounding boxes from RPN = 48.8 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0433 - rpn\_regr: 0.0441 - detector\_cls:  
0.1604 - detector\_regr: 0.1185  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.7  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.04330504983663559  
Loss RPN regression: 0.044115610606968406  
Loss Detector classifier: 0.16039720997214318  
Loss Detector regression: 0.11849391758441925  
Elapsed time: 53.9616436958313  
Epoch 954/1000  
Average number of overlapping bounding boxes from RPN = 59.7 for 10 previous iterations  
10/10 [=====] - 63s - rpn\_cls: 0.0473 - rpn\_regr: 0.0571 - detector\_cls:  
0.2044 - detector\_regr: 0.1224  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.2  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.04731716057285666  
Loss RPN regression: 0.05707700066268444  
Loss Detector classifier: 0.20444089621305467  
Loss Detector regression: 0.12242919802665711  
Elapsed time: 63.49724340438843  
Epoch 955/1000  
Average number of overlapping bounding boxes from RPN = 58.2 for 10 previous iterations  
10/10 [=====] - 50s - rpn\_cls: 0.0482 - rpn\_regr: 0.0545 - detector\_cls:  
0.2315 - detector\_regr: 0.1151  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.9  
Classifier accuracy for bounding boxes from RPN: 0.915625  
Loss RPN classifier: 0.04816007507033646  
Loss RPN regression: 0.05447003841400146  
Loss Detector classifier: 0.23149485066533088  
Loss Detector regression: 0.11507215164601803  
Elapsed time: 50.61172866821289  
Epoch 956/1000  
Average number of overlapping bounding boxes from RPN = 56.9 for 10 previous iterations  
10/10 [=====] - 42s - rpn\_cls: 0.0501 - rpn\_regr: 0.0464 - detector\_cls:  
0.2216 - detector\_regr: 0.1079  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.3  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.05010184990242124  
Loss RPN regression: 0.04642724581062794  
Loss Detector classifier: 0.22160591036081315  
Loss Detector regression: 0.10793197490274906  
Elapsed time: 42.34747314453125  
Epoch 957/1000  
Average number of overlapping bounding boxes from RPN = 52.3 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0461 - rpn\_regr: 0.0497 - detector\_cls:  
0.1458 - detector\_regr: 0.1189  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.3  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.04612837897147983  
Loss RPN regression: 0.04970745164901018  
Loss Detector classifier: 0.14575243555009365  
Loss Detector regression: 0.11888228580355645

2000 Detector regression: 0.11002200000000000  
Elapsed time: 49.93918800354004  
Epoch 958/1000  
Average number of overlapping bounding boxes from RPN = 58.3 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0588 - rpn\_regr: 0.0456 - detector\_cls:  
0.1961 - detector\_regr: 0.1146  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.7  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.05876975967548788  
Loss RPN regression: 0.04557815678417683  
Loss Detector classifier: 0.19610153511166573  
Loss Detector regression: 0.11456145439296961  
Elapsed time: 56.63097429275513  
Epoch 959/1000  
Average number of overlapping bounding boxes from RPN = 52.7 for 10 previous iterations  
10/10 [=====] - 37s - rpn\_cls: 0.0348 - rpn\_regr: 0.0411 - detector\_cls:  
0.1902 - detector\_regr: 0.0932  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.2  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.034822803363204  
Loss RPN regression: 0.041050012968480584  
Loss Detector classifier: 0.1901996687054634  
Loss Detector regression: 0.093174934014678  
Elapsed time: 37.44358468055725  
Epoch 960/1000  
Average number of overlapping bounding boxes from RPN = 46.2 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0459 - rpn\_regr: 0.0522 - detector\_cls:  
0.1689 - detector\_regr: 0.1152  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.9  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.045899809524416926  
Loss RPN regression: 0.052193168364465234  
Loss Detector classifier: 0.16891624107956887  
Loss Detector regression: 0.11519326008856297  
Elapsed time: 56.01097917556763  
Epoch 961/1000  
Average number of overlapping bounding boxes from RPN = 47.9 for 10 previous iterations  
10/10 [=====] - 41s - rpn\_cls: 0.0395 - rpn\_regr: 0.0440 - detector\_cls:  
0.1274 - detector\_regr: 0.0887  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 47.4  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.039480452053248884  
Loss RPN regression: 0.043982863798737525  
Loss Detector classifier: 0.12742442339658738  
Loss Detector regression: 0.08874521721154452  
Elapsed time: 41.273963928222656  
Epoch 962/1000  
Average number of overlapping bounding boxes from RPN = 47.4 for 10 previous iterations  
10/10 [=====] - 59s - rpn\_cls: 0.0397 - rpn\_regr: 0.0541 - detector\_cls:  
0.2592 - detector\_regr: 0.1174  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.3  
Classifier accuracy for bounding boxes from RPN: 0.875  
Loss RPN classifier: 0.03973412928171456  
Loss RPN regression: 0.05409220308065414  
Loss Detector classifier: 0.25916956141591074  
Loss Detector regression: 0.11740358732640743  
Elapsed time: 59.19913649559021  
Epoch 963/1000  
Average number of overlapping bounding boxes from RPN = 55.3 for 10 previous iterations  
10/10 [=====] - 45s - rpn\_cls: 0.0235 - rpn\_regr: 0.0395 - detector\_cls:  
0.1438 - detector\_regr: 0.0939  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.2  
Classifier accuracy for bounding boxes from RPN: 0.94375  
Loss RPN classifier: 0.02346309325657785  
Loss RPN regression: 0.039461112767457965  
Loss Detector classifier: 0.14379482716321945  
Loss Detector regression: 0.09388560131192207  
Elapsed time: 45.345008850097656  
Epoch 964/1000  
Average number of overlapping bounding boxes from RPN = 55.2 for 10 previous iterations  
10/10 [=====] - 60s - rpn\_cls: 0.0691 - rpn\_regr: 0.0502 - detector\_cls:  
0.2370 - detector\_regr: 0.1350  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 55.2  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.06911303587257862  
Loss RPN regression: 0.05021040886640549  
Loss Detector classifier: 0.23696521520614625  
Loss Detector regression: 0.13501907438039779



Loss Detector regression: 0.1090100740000775  
Elapsed time: 60.496472120285034  
Epoch 965/1000  
Average number of overlapping bounding boxes from RPN = 55.2 for 10 previous iterations  
10/10 [=====] - 66s - rpn\_cls: 0.0416 - rpn\_regr: 0.0405 - detector\_cls:  
0.1749 - detector\_regr: 0.0862  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.2  
Classifier accuracy for bounding boxes from RPN: 0.9375  
Loss RPN classifier: 0.04159588175825775  
Loss RPN regression: 0.04049846464768052  
Loss Detector classifier: 0.17485742270946503  
Loss Detector regression: 0.08624408692121506  
Elapsed time: 66.22908401489258  
Epoch 966/1000  
Average number of overlapping bounding boxes from RPN = 44.2 for 10 previous iterations  
10/10 [=====] - 54s - rpn\_cls: 0.0327 - rpn\_regr: 0.0537 - detector\_cls:  
0.1993 - detector\_regr: 0.1030  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.9  
Classifier accuracy for bounding boxes from RPN: 0.896875  
Loss RPN classifier: 0.032738365978002545  
Loss RPN regression: 0.05371503811329603  
Loss Detector classifier: 0.19932858794927596  
Loss Detector regression: 0.10301463678479195  
Elapsed time: 54.41686391830444  
Epoch 967/1000  
Average number of overlapping bounding boxes from RPN = 57.9 for 10 previous iterations  
10/10 [=====] - 58s - rpn\_cls: 0.0419 - rpn\_regr: 0.0454 - detector\_cls:  
0.2458 - detector\_regr: 0.0871  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.3  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.041904175910167395  
Loss RPN regression: 0.04535827785730362  
Loss Detector classifier: 0.24584734588861465  
Loss Detector regression: 0.08706113472580909  
Elapsed time: 58.5530641078949  
Epoch 968/1000  
Average number of overlapping bounding boxes from RPN = 57.3 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0542 - rpn\_regr: 0.0544 - detector\_cls:  
0.2083 - detector\_regr: 0.1135  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.1  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.05416292014997452  
Loss RPN regression: 0.05439168009907007  
Loss Detector classifier: 0.20826386660337448  
Loss Detector regression: 0.11347552314400673  
Elapsed time: 47.53901124000549  
Epoch 969/1000  
Average number of overlapping bounding boxes from RPN = 56.1 for 10 previous iterations  
10/10 [=====] - 61s - rpn\_cls: 0.0644 - rpn\_regr: 0.0524 - detector\_cls:  
0.1847 - detector\_regr: 0.0973  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 57.0  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.06438863854855299  
Loss RPN regression: 0.052393633499741556  
Loss Detector classifier: 0.18471189290285112  
Loss Detector regression: 0.09728851914405823  
Elapsed time: 61.844327449798584  
Epoch 970/1000  
Average number of overlapping bounding boxes from RPN = 57.0 for 10 previous iterations  
10/10 [=====] - 56s - rpn\_cls: 0.0366 - rpn\_regr: 0.0511 - detector\_cls:  
0.2160 - detector\_regr: 0.0904  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.8  
Classifier accuracy for bounding boxes from RPN: 0.9  
Loss RPN classifier: 0.03656275609973818  
Loss RPN regression: 0.05113272648304701  
Loss Detector classifier: 0.21602922156453133  
Loss Detector regression: 0.09042370989918709  
Elapsed time: 56.53941488265991  
Epoch 971/1000  
Average number of overlapping bounding boxes from RPN = 56.8 for 10 previous iterations  
10/10 [=====] - 35s - rpn\_cls: 0.0660 - rpn\_regr: 0.0425 - detector\_cls:  
0.2334 - detector\_regr: 0.0937  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 41.7  
Classifier accuracy for bounding boxes from RPN: 0.925  
Loss RPN classifier: 0.06595945917069912  
Loss RPN regression: 0.04253611657768488  
Loss Detector classifier: 0.2334146596491337  
Loss Detector regression: 0.09372868612408639

Loss Detector regression: 0.0957200001240000  
Elapsed time: 35.25314164161682  
Epoch 972/1000  
Average number of overlapping bounding boxes from RPN = 41.7 for 10 previous iterations  
10/10 [=====] - 47s - rpn\_cls: 0.0382 - rpn\_regr: 0.0527 - detector\_cls:  
0.1755 - detector\_regr: 0.0966  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.0  
Classifier accuracy for bounding boxes from RPN: 0.921875  
Loss RPN classifier: 0.038201134721748534  
Loss RPN regression: 0.05274536367505789  
Loss Detector classifier: 0.17545235976576806  
Loss Detector regression: 0.09656571187078952  
Elapsed time: 47.73412895202637  
Epoch 973/1000  
Average number of overlapping bounding boxes from RPN = 52.0 for 10 previous iterations  
10/10 [=====] - 66s - rpn\_cls: 0.0769 - rpn\_regr: 0.0549 - detector\_cls:  
0.2227 - detector\_regr: 0.1183  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.3  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.07693698005750775  
Loss RPN regression: 0.05492878686636686  
Loss Detector classifier: 0.22265117168426513  
Loss Detector regression: 0.11825310289859772  
Elapsed time: 66.14825463294983  
Epoch 974/1000  
Average number of overlapping bounding boxes from RPN = 58.3 for 10 previous iterations  
10/10 [=====] - 51s - rpn\_cls: 0.0550 - rpn\_regr: 0.0610 - detector\_cls:  
0.1734 - detector\_regr: 0.0941  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 46.7  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.055024283658713105  
Loss RPN regression: 0.06103799007833004  
Loss Detector classifier: 0.17335151750594377  
Loss Detector regression: 0.09407770819962025  
Elapsed time: 51.66423726081848  
Epoch 975/1000  
Average number of overlapping bounding boxes from RPN = 46.7 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0430 - rpn\_regr: 0.0533 - detector\_cls:  
0.2042 - detector\_regr: 0.0958  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.3  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.0429719096980989  
Loss RPN regression: 0.05332555510103702  
Loss Detector classifier: 0.20424849838018416  
Loss Detector regression: 0.09580663368105888  
Elapsed time: 53.54972243309021  
Epoch 976/1000  
Average number of overlapping bounding boxes from RPN = 50.3 for 10 previous iterations  
10/10 [=====] - 53s - rpn\_cls: 0.0456 - rpn\_regr: 0.0507 - detector\_cls:  
0.1997 - detector\_regr: 0.1054  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.2  
Classifier accuracy for bounding boxes from RPN: 0.934375  
Loss RPN classifier: 0.04559204913675785  
Loss RPN regression: 0.050695335119962694  
Loss Detector classifier: 0.19967353641986846  
Loss Detector regression: 0.10540583319962024  
Elapsed time: 53.987348556518555  
Epoch 977/1000  
Average number of overlapping bounding boxes from RPN = 56.2 for 10 previous iterations  
10/10 [=====] - 65s - rpn\_cls: 0.0466 - rpn\_regr: 0.0555 - detector\_cls:  
0.1855 - detector\_regr: 0.1086  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 48.2  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.046551628573797646  
Loss RPN regression: 0.055482224375009534  
Loss Detector classifier: 0.18551692068576814  
Loss Detector regression: 0.10855575129389763  
Elapsed time: 65.26565718650818  
Epoch 978/1000  
Average number of overlapping bounding boxes from RPN = 48.2 for 10 previous iterations  
10/10 [=====] - 44s - rpn\_cls: 0.0404 - rpn\_regr: 0.0550 - detector\_cls:  
0.2093 - detector\_regr: 0.1078  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.4  
Classifier accuracy for bounding boxes from RPN: 0.90625  
Loss RPN classifier: 0.040388129535131156  
Loss RPN regression: 0.0549761600792408  
Loss Detector classifier: 0.2093358188867569  
Loss Detector regression: 0.10778868718825417

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Loss Detector regression: 0.10770000/1993341/
Elapsed time: 44.3707971572876
Epoch 979/1000
Average number of overlapping bounding boxes from RPN = 52.4 for 10 previous iterations
10/10 [=====] - 67s - rpn_cls: 0.0515 - rpn_regr: 0.0567 - detector_cls:
0.2312 - detector_regr: 0.1061
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.2
Classifier accuracy for bounding boxes from RPN: 0.90625
Loss RPN classifier: 0.051509909448213875
Loss RPN regression: 0.056657735258340836
Loss Detector classifier: 0.23124585598707198
Loss Detector regression: 0.10608509108424187
Elapsed time: 67.30225372314453
Epoch 980/1000
Average number of overlapping bounding boxes from RPN = 54.2 for 10 previous iterations
10/10 [=====] - 35s - rpn_cls: 0.0217 - rpn_regr: 0.0485 - detector_cls:
0.2071 - detector_regr: 0.0951
Mean number of bounding boxes from RPN overlapping ground truth boxes: 41.3
Classifier accuracy for bounding boxes from RPN: 0.915625
Loss RPN classifier: 0.021728880377486347
Loss RPN regression: 0.048506920039653775
Loss Detector classifier: 0.20709459856152534
Loss Detector regression: 0.09514230452477931
Elapsed time: 36.00099039077759
Epoch 981/1000
Average number of overlapping bounding boxes from RPN = 41.3 for 10 previous iterations
10/10 [=====] - 44s - rpn_cls: 0.0338 - rpn_regr: 0.0460 - detector_cls:
0.2036 - detector_regr: 0.0910
Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.5
Classifier accuracy for bounding boxes from RPN: 0.925
Loss RPN classifier: 0.033848296757787465
Loss RPN regression: 0.04598817601799965
Loss Detector classifier: 0.2035665163770318
Loss Detector regression: 0.09096242487430573
Elapsed time: 44.07872200012207
Epoch 982/1000
Average number of overlapping bounding boxes from RPN = 44.5 for 10 previous iterations
10/10 [=====] - 54s - rpn_cls: 0.0345 - rpn_regr: 0.0494 - detector_cls:
0.1804 - detector_regr: 0.1081
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.0
Classifier accuracy for bounding boxes from RPN: 0.940625
Loss RPN classifier: 0.03452204465866089
Loss RPN regression: 0.04936263095587492
Loss Detector classifier: 0.1804039768874645
Loss Detector regression: 0.10813012644648552
Elapsed time: 54.745914459228516
Epoch 983/1000
Average number of overlapping bounding boxes from RPN = 52.0 for 10 previous iterations
10/10 [=====] - 54s - rpn_cls: 0.0436 - rpn_regr: 0.0370 - detector_cls:
0.1628 - detector_regr: 0.1086
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.9
Classifier accuracy for bounding boxes from RPN: 0.928125
Loss RPN classifier: 0.043564140400849286
Loss RPN regression: 0.037019874714314935
Loss Detector classifier: 0.16282969564199448
Loss Detector regression: 0.10855792500078679
Elapsed time: 54.700061082839966
Epoch 984/1000
Average number of overlapping bounding boxes from RPN = 50.9 for 10 previous iterations
10/10 [=====] - 53s - rpn_cls: 0.0469 - rpn_regr: 0.0478 - detector_cls:
0.1777 - detector_regr: 0.0921
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.9
Classifier accuracy for bounding boxes from RPN: 0.93125
Loss RPN classifier: 0.04686749000102282
Loss RPN regression: 0.04783417209982872
Loss Detector classifier: 0.17773275896906854
Loss Detector regression: 0.09214231017977
Elapsed time: 53.14701557159424
Epoch 985/1000
Average number of overlapping bounding boxes from RPN = 56.9 for 10 previous iterations
10/10 [=====] - 52s - rpn_cls: 0.0418 - rpn_regr: 0.0485 - detector_cls:
0.1756 - detector_regr: 0.1121
Mean number of bounding boxes from RPN overlapping ground truth boxes: 63.2
Classifier accuracy for bounding boxes from RPN: 0.91875
Loss RPN classifier: 0.041788256447762254
Loss RPN regression: 0.048464000783860685
Loss Detector classifier: 0.1756324551999569
Loss Detector regression: 0.11214100074004706
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Loss Detector regression: 0.112141826/4884/96
Elapsed time: 52.51393246650696
Epoch 986/1000
Average number of overlapping bounding boxes from RPN = 63.2 for 10 previous iterations
10/10 [=====] - 46s - rpn_cls: 0.0437 - rpn_regr: 0.0491 - detector_cls:
0.2488 - detector_regr: 0.1121
Mean number of bounding boxes from RPN overlapping ground truth boxes: 49.8
Classifier accuracy for bounding boxes from RPN: 0.9
Loss RPN classifier: 0.04368202536134049
Loss RPN regression: 0.049067741446197036
Loss Detector classifier: 0.24880463033914565
Loss Detector regression: 0.11214249767363071
Elapsed time: 46.43088674545288
Epoch 987/1000
Average number of overlapping bounding boxes from RPN = 49.8 for 10 previous iterations
10/10 [=====] - 47s - rpn_cls: 0.0467 - rpn_regr: 0.0445 - detector_cls:
0.2161 - detector_regr: 0.1196
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.1
Classifier accuracy for bounding boxes from RPN: 0.890625
Loss RPN classifier: 0.046674983901903035
Loss RPN regression: 0.044549408741295336
Loss Detector classifier: 0.21610925905406475
Loss Detector regression: 0.11960041597485542
Elapsed time: 47.60991168022156
Epoch 988/1000
Average number of overlapping bounding boxes from RPN = 54.1 for 10 previous iterations
10/10 [=====] - 39s - rpn_cls: 0.0470 - rpn_regr: 0.0439 - detector_cls:
0.2323 - detector_regr: 0.1210
Mean number of bounding boxes from RPN overlapping ground truth boxes: 44.0
Classifier accuracy for bounding boxes from RPN: 0.90625
Loss RPN classifier: 0.0470165983075276
Loss RPN regression: 0.04393783323466778
Loss Detector classifier: 0.23230544179677964
Loss Detector regression: 0.12101002112030983
Elapsed time: 39.771645307540894
Epoch 989/1000
Average number of overlapping bounding boxes from RPN = 44.0 for 10 previous iterations
10/10 [=====] - 41s - rpn_cls: 0.0487 - rpn_regr: 0.0430 - detector_cls:
0.1956 - detector_regr: 0.1169
Mean number of bounding boxes from RPN overlapping ground truth boxes: 42.8
Classifier accuracy for bounding boxes from RPN: 0.925
Loss RPN classifier: 0.048665457288734615
Loss RPN regression: 0.04296261351555586
Loss Detector classifier: 0.19561925195157528
Loss Detector regression: 0.11692717224359513
Elapsed time: 41.40014982223511
Epoch 990/1000
Average number of overlapping bounding boxes from RPN = 42.8 for 10 previous iterations
10/10 [=====] - 62s - rpn_cls: 0.0350 - rpn_regr: 0.0453 - detector_cls:
0.2126 - detector_regr: 0.1107
Mean number of bounding boxes from RPN overlapping ground truth boxes: 63.7
Classifier accuracy for bounding boxes from RPN: 0.90625
Loss RPN classifier: 0.03497157561359927
Loss RPN regression: 0.04529017247259617
Loss Detector classifier: 0.21259222626686097
Loss Detector regression: 0.11065382659435272
Elapsed time: 62.38906168937683
Epoch 991/1000
Average number of overlapping bounding boxes from RPN = 63.7 for 10 previous iterations
10/10 [=====] - 50s - rpn_cls: 0.0650 - rpn_regr: 0.0557 - detector_cls:
0.2356 - detector_regr: 0.1148
Mean number of bounding boxes from RPN overlapping ground truth boxes: 56.4
Classifier accuracy for bounding boxes from RPN: 0.903125
Loss RPN classifier: 0.06500213220715523
Loss RPN regression: 0.05566327907145023
Loss Detector classifier: 0.2356478214263916
Loss Detector regression: 0.1148453775793314
Elapsed time: 50.50853967666626
Epoch 992/1000
Average number of overlapping bounding boxes from RPN = 56.4 for 10 previous iterations
10/10 [=====] - 66s - rpn_cls: 0.0427 - rpn_regr: 0.0579 - detector_cls:
0.2317 - detector_regr: 0.0976
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.8
Classifier accuracy for bounding boxes from RPN: 0.921875
Loss RPN classifier: 0.042746824631467464
Loss RPN regression: 0.05794479437172413
Loss Detector classifier: 0.23167319260537625
Loss Detector regression: 0.09761540316003160
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Loss Detector regression: 0.09761548116803169  
Elapsed time: 66.25400447845459  
Epoch 993/1000  
Average number of overlapping bounding boxes from RPN = 54.8 for 10 previous iterations  
10/10 [=====] - 41s - rpn\_cls: 0.0561 - rpn\_regr: 0.0453 - detector\_cls:  
0.1883 - detector\_regr: 0.1436  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 45.5  
Classifier accuracy for bounding boxes from RPN: 0.93125  
Loss RPN classifier: 0.05611265618354082  
Loss RPN regression: 0.045288090221583845  
Loss Detector classifier: 0.18832313343882562  
Loss Detector regression: 0.14360512532293795  
Elapsed time: 41.87990355491638  
Epoch 994/1000  
Average number of overlapping bounding boxes from RPN = 45.5 for 10 previous iterations  
10/10 [=====] - 49s - rpn\_cls: 0.0469 - rpn\_regr: 0.0550 - detector\_cls:  
0.1430 - detector\_regr: 0.1201  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 50.3  
Classifier accuracy for bounding boxes from RPN: 0.946875  
Loss RPN classifier: 0.04692221935838461  
Loss RPN regression: 0.05497282948344946  
Loss Detector classifier: 0.142950402200222  
Loss Detector regression: 0.12010392248630523  
Elapsed time: 49.50592660903931  
Epoch 995/1000  
Average number of overlapping bounding boxes from RPN = 50.3 for 10 previous iterations  
10/10 [=====] - 55s - rpn\_cls: 0.0694 - rpn\_regr: 0.0457 - detector\_cls:  
0.2215 - detector\_regr: 0.1211  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 58.4  
Classifier accuracy for bounding boxes from RPN: 0.903125  
Loss RPN classifier: 0.06942664887756109  
Loss RPN regression: 0.04569203406572342  
Loss Detector classifier: 0.22153238393366337  
Loss Detector regression: 0.12108215615153313  
Elapsed time: 55.9059898853302  
Epoch 996/1000  
Average number of overlapping bounding boxes from RPN = 58.4 for 10 previous iterations  
10/10 [=====] - 57s - rpn\_cls: 0.0414 - rpn\_regr: 0.0500 - detector\_cls:  
0.1913 - detector\_regr: 0.0952  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.3  
Classifier accuracy for bounding boxes from RPN: 0.9125  
Loss RPN classifier: 0.04136336343362927  
Loss RPN regression: 0.05000711102038622  
Loss Detector classifier: 0.19134059213101864  
Loss Detector regression: 0.09518673121929169  
Elapsed time: 57.03368043899536  
Epoch 997/1000  
Average number of overlapping bounding boxes from RPN = 59.3 for 10 previous iterations  
10/10 [=====] - 57s - rpn\_cls: 0.0301 - rpn\_regr: 0.0438 - detector\_cls:  
0.1667 - detector\_regr: 0.0997  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.2  
Classifier accuracy for bounding boxes from RPN: 0.940625  
Loss RPN classifier: 0.03014126340858638  
Loss RPN regression: 0.04376998152583837  
Loss Detector classifier: 0.16666697412729264  
Loss Detector regression: 0.09971616007387638  
Elapsed time: 57.49515199661255  
Epoch 998/1000  
Average number of overlapping bounding boxes from RPN = 54.2 for 10 previous iterations  
10/10 [=====] - 48s - rpn\_cls: 0.0456 - rpn\_regr: 0.0457 - detector\_cls:  
0.1549 - detector\_regr: 0.1187  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 52.9  
Classifier accuracy for bounding boxes from RPN: 0.95  
Loss RPN classifier: 0.04558711946010589  
Loss RPN regression: 0.045733909122645855  
Loss Detector classifier: 0.15492367818951608  
Loss Detector regression: 0.11873894557356834  
Elapsed time: 48.968019008636475  
Epoch 999/1000  
Average number of overlapping bounding boxes from RPN = 52.9 for 10 previous iterations  
10/10 [=====] - 75s - rpn\_cls: 0.0618 - rpn\_regr: 0.0499 - detector\_cls:  
0.2303 - detector\_regr: 0.1143  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 59.5  
Classifier accuracy for bounding boxes from RPN: 0.909375  
Loss RPN classifier: 0.061797683499753474  
Loss RPN regression: 0.04988872967660427  
Loss Detector classifier: 0.2302665412425995  
-

Loss Detector regression: 0.11425206065177917  
Elapsed time: 75.80846977233887  
Epoch 1000/1000  
Average number of overlapping bounding boxes from RPN = 59.5 for 10 previous iterations  
10/10 [=====] - 43s - rpn\_cls: 0.0248 - rpn\_regr: 0.0377 - detector\_cls: 0.2007 - detector\_regr: 0.0916  
Mean number of bounding boxes from RPN overlapping ground truth boxes: 54.2  
Classifier accuracy for bounding boxes from RPN: 0.928125  
Loss RPN classifier: 0.024761165771633387  
Loss RPN regression: 0.03770830575376749  
Loss Detector classifier: 0.20074789077043534  
Loss Detector regression: 0.09157584868371486  
Elapsed time: 43.701765060424805  
Training complete, exiting.

In [0]:

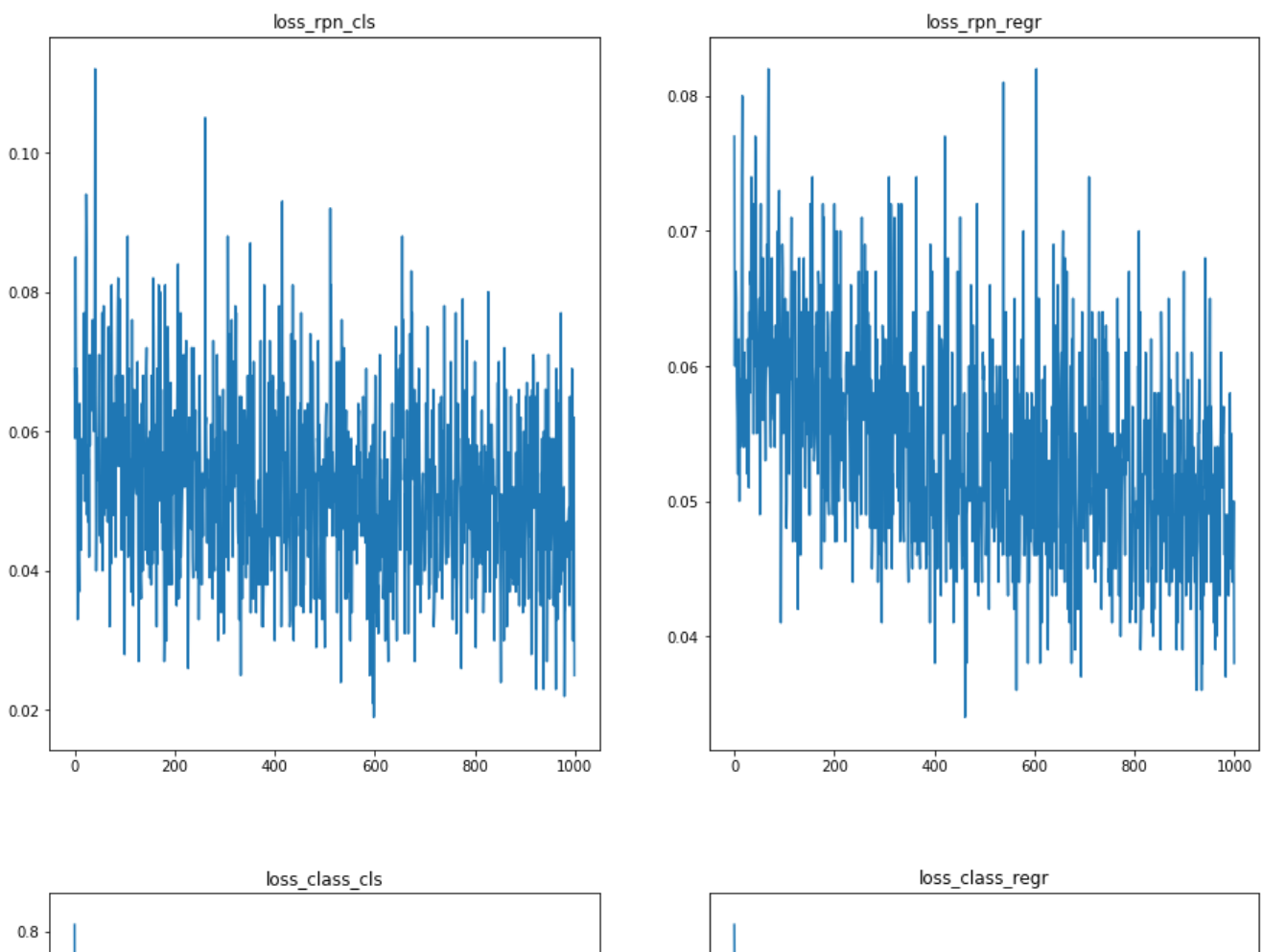
```
result = pd.read_csv("/content/drive/My Drive/rcnn/Data_model/result_df.csv")
```

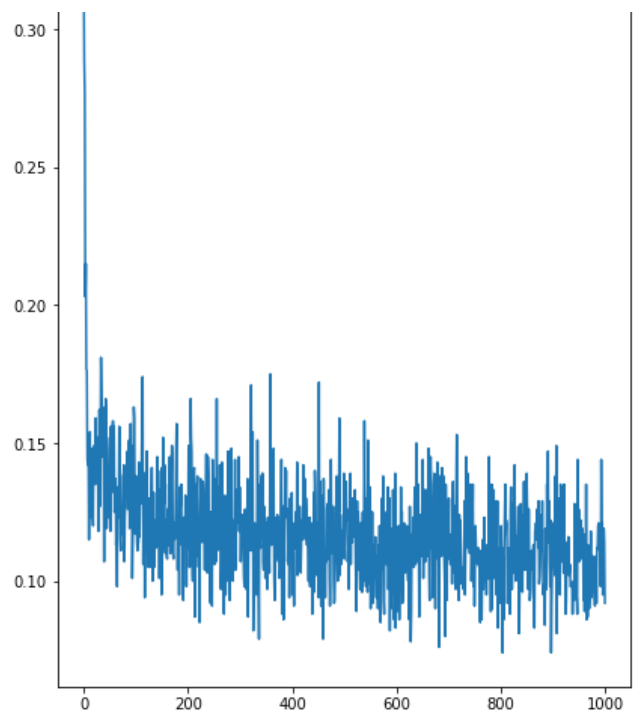
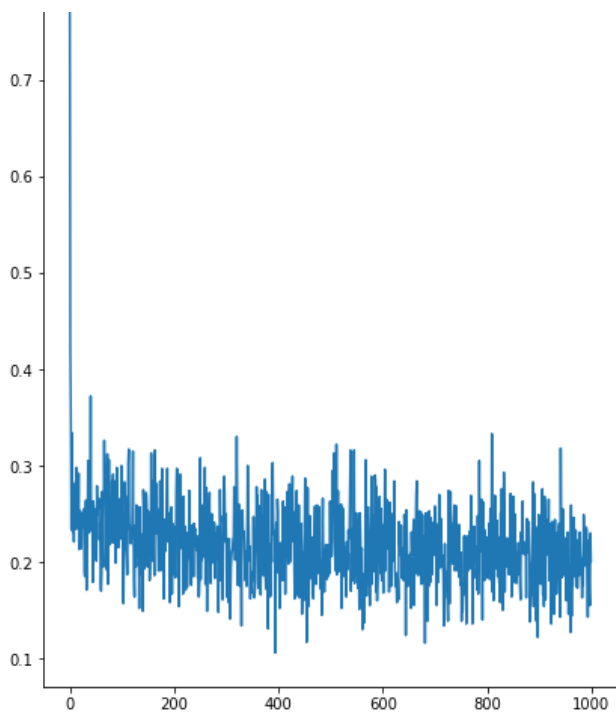
In [0]:

```
plt.figure(figsize=(15,20))
plt.subplot(2,2,1)
plt.plot(range(0, 1000), result['loss_rpn_cls'])
plt.title('loss_rpn_cls')
plt.subplot(2,2,2)
plt.plot(range(0, 1000), result['loss_rpn_regr'])
plt.title('loss_rpn_regr')

plt.subplot(2,2,3)
plt.plot(range(0, 1000), result['loss_class_cls'])
plt.title('loss_class_cls')
plt.subplot(2,2,4)
plt.plot(range(0, 1000), result['loss_class_regr'])
plt.title('loss_class_regr')

plt.show()
```





## 2nd level classifier training

In [0]:

```
##### for training I am using densenet structure
```

In [0]:

```
X_train = np.load("/content/drive/My Drive/rcnn/train_image_array/x_train_images_arrays.npz", allow_pickle = True)
X_test = np.load("/content/drive/My Drive/rcnn/test_image_array/x_images_arrays_test.npz", allow_pickle = True)
```

In [0]:

```
y_train = np.load("y_target.npz", allow_pickle = True)
y_test = np.load("y_target_test.npz", allow_pickle = True)
```

In [0]:

```
print("Train dataset shape",X_train["arr_0"].shape)
print("Test dataset shape",X_test["arr_0"].shape)
```

Train dataset shape (2163, 32, 32, 3)

Test dataset shape (527, 32, 32, 3)

In [0]:

```
# this part will prevent tensorflow to allocate all the available GPU Memory
# backend
import tensorflow as tf
# from tensorflow import keras

# from keras import backend as k

# Don't pre-allocate memory; allocate as-needed
# import tensorflow as tf
config = tf.ConfigProto()
config.gpu_options.per_process_gpu_memory_fraction = 0.75
config.gpu_options.allow_growth= True
# config = tf.ConfigProto()
# config.gpu_options.allow_growth = True
```

```
# Create a session with the above options specified.
# k.tensorflow_backend.set_session(tf.Session(config=config))
```

In [0]:

```
type(y_train["arr_0"])
```

Out[0]:

numpy.ndarray

In [0]:

```
unique, counts = np.unique(y_train["arr_0"], return_counts=True)
```

In [0]:

```
dict(zip(unique, counts))
```

Out[0]:

```
{'difficult': 335,
 'gametocyte': 113,
 'leukocyte': 85,
 'ring': 281,
 'schizont': 142,
 'trophozoite': 1207}
```

In [0]:

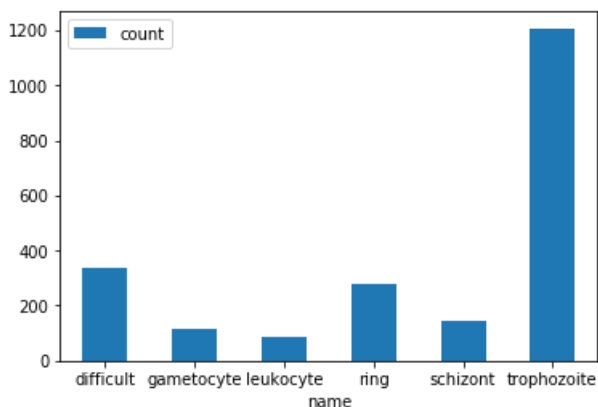
```
unique
```

Out[0]:

```
array(['difficult', 'gametocyte', 'leukocyte', 'ring', 'schizont',
       'trophozoite'], dtype=object)
```

In [0]:

```
df = pd.DataFrame({"name":unique,"count":counts})
ax = df.plot.bar(x='name', y='count', rot=0)
```



In [0]:

```
unique, counts = np.unique(y_test["arr_0"], return_counts=True)
```

In [0]:

```
dict(zip(unique, counts))
```

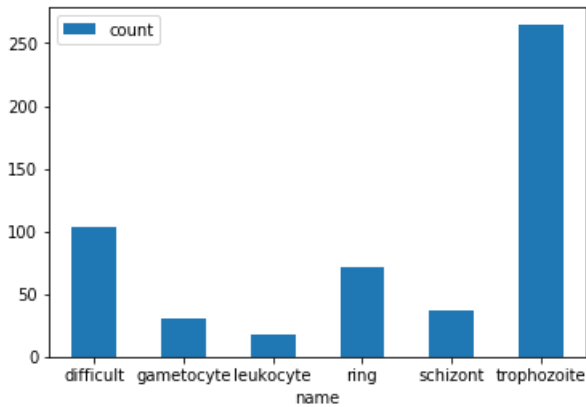
Out[0]:



```
{'difficult': 104,  
 'gametocyte': 31,  
 'leukocyte': 18,  
 'ring': 72,  
 'schizont': 37,  
 'trophozoite': 265}
```

In [0]:

```
df = pd.DataFrame({"name":unique,"count" :counts})  
ax = df.plot.bar(x='name', y='count', rot=0)
```



In [0]:

```
from sklearn.feature_extraction.text import CountVectorizer
```

In [0]:

```
vect = CountVectorizer()  
y_train_vect = vect.fit_transform(y_train["arr_0"])
```

In [0]:

```
y_test_vect = vect.transform(y_test["arr_0"])
```

In [0]:

```
vect.get_feature_names()
```

Out[0]:

```
['difficult', 'gametocyte', 'leukocyte', 'ring', 'schizont', 'trophozoite']
```

In [0]:

```
y_test_vect.toarray()
```

Out[0]:

```
array([[0, 0, 0, 0, 0, 1],  
       [0, 0, 0, 0, 0, 1],  
       [0, 0, 0, 0, 0, 1],  
       ...,  
       [0, 0, 0, 0, 0, 1],  
       [0, 0, 0, 0, 0, 1],  
       [0, 0, 0, 0, 0, 1]])
```

In [0]:

```
print("Train dataset shape:",X_train["arr_0"].shape,y_train_vect.shape)  
print("Test dataset shape",X_test["arr_0"].shape,y_test_vect.shape)
```

```
Train dataset shape: (2163, 32, 32, 3) (2163, 6)
Test dataset shape (527, 32, 32, 3) (527, 6)
```

```
In [0]:
```

```
img_height, img_width, channel = X_train["arr_0"].shape[1],X_train["arr_0"].shape[2],X_train["arr_0"].shape[3]
```

```
In [0]:
```

```
X_train_mean = np.mean(X_train["arr_0"], axis=(0,1,2))
X_train_std = np.std(X_train["arr_0"], axis=(0,1,2))
X_train = (X_train["arr_0"] - X_train_mean) / X_train_std
X_test = (X_test["arr_0"] - X_train_mean) / X_train_std
```

```
In [0]:
```

```
X_test.shape
```

```
Out[0]:
```

```
(527, 32, 32, 3)
```

```
In [0]:
```

```
batch_size = 32
num_classes = 6
epochs = 100
l = 50
compression = 0.45
dropout_rate = 0.2
```

```
In [0]:
```

```
# Dense Block
def denseblock(input, num_filter = 12, dropout_rate = 0.5):
    global compression
    temp = input
    for _ in range(l):
        BatchNorm = layers.BatchNormalization()(temp)
        relu = layers.Activation('relu')(BatchNorm)
        Conv2D_3_3 = layers.SeparableConv2D(int(num_filter*compression), (5,5), use_bias=False, padding='same')(relu)
        if dropout_rate>0:
            Conv2D_3_3 = layers.Dropout(dropout_rate)(Conv2D_3_3)
        concat = layers.Concatenate(axis=-1)([temp,Conv2D_3_3])

        temp = concat

    return temp

## transition Block
def transition(input, num_filter = 12, dropout_rate = 0.5):
    global compression
    BatchNorm = layers.BatchNormalization()(input)
    relu = layers.Activation('relu')(BatchNorm)
    Conv2D_BottleNeck = layers.SeparableConv2D(int(num_filter*compression), (7,7), use_bias=False, padding='same')(relu)
    if dropout_rate>0:
        Conv2D_BottleNeck = layers.Dropout(dropout_rate)(Conv2D_BottleNeck)
    avg = layers.AveragePooling2D(pool_size=(2,2))(Conv2D_BottleNeck)
    return avg

#output layer
def output_layer(input):
    global compression
    BatchNorm = layers.BatchNormalization()(input)
    relu = layers.Activation('relu')(BatchNorm)
    AvgPooling = layers.AveragePooling2D(pool_size=(2,2))(relu)
    flat = layers.Flatten()(AvgPooling)
    output = layers.Dense(num_classes, activation='softmax')(flat)
```

```
return output
```

```
In [0]:
```

```
import keras.backend as K
K.clear_session()
```

```
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow_backend.py:107: The name tf.reset_default_graph is deprecated. Please use tf.compat.v1.reset_default_graph instead.
```

```
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow_backend.py:111: The name tf.placeholder_with_default is deprecated. Please use tf.compat.v1.placeholder_with_default instead.
```

```
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow_backend.py:66: The name tf.get_default_graph is deprecated. Please use tf.compat.v1.get_default_graph instead.
```

```
In [0]:
```

```
num_filter = 64

dropout_rate = 0
l = 10

input = layers.Input(shape=(img_height, img_width, channel,))
First_Conv2D = layers.SeparableConv2D(num_filter, (5,5), use_bias=False, padding='same')(input)

First_Block = denseblock(First_Conv2D, num_filter, dropout_rate)
First_Transition = transition(First_Block, num_filter, dropout_rate)

Second_Block = denseblock(First_Transition, num_filter, dropout_rate)
Second_Transition = transition(Second_Block, num_filter, dropout_rate)

Third_Block = denseblock(Second_Transition, num_filter, dropout_rate)
Third_Transition = transition(Third_Block, num_filter, dropout_rate)

Last_Block = denseblock(Third_Transition, num_filter, dropout_rate)
output = output_layer(Last_Block)
```

```
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/tensorflow_core/python/ops/resource_variable_ops.py:1630: calling BaseResourceVariable.__init__ (from tensorflow.python.ops.resource_variable_ops) with constraint is deprecated and will be removed in a future version.
Instructions for updating:
If using Keras pass *_constraint arguments to layers.
```

```
In [0]:
```

```
model = Model(inputs=[input], outputs=[output])
model.summary()
```

```
Model: "model"
```

| Layer (type)                     | Output Shape        | Param # | Connected to                                       |
|----------------------------------|---------------------|---------|--|
| =====                            |                     |         |  |
| input_1 (InputLayer)             | [(None, 32, 32, 3)] | 0       |  |
| separable_conv2d (SeparableConv) | (None, 32, 32, 64)  | 267     | input_1[0][0]                                      |
| batch_normalization (BatchNorma  | (None, 32, 32, 64)  | 256     | separable_conv2d[0][0]                             |
| activation (Activation)          | (None, 32, 32, 64)  | 0       | batch_normalization[0][0]                          |
| separable_conv2d_1 (SeparableCo  | (None, 32, 32, 28)  | 3392    | activation[0][0]                                   |
| concatenate (Concatenate)        | (None, 32, 32, 92)  | 0       | separable_conv2d[0][0]<br>separable_conv2d_1[0][0] |
| batch_normalization_1 (BatchNor  | (None, 32, 32, 92)  | 368     | concatenate[0][0]                                  |

|                                 |                     |       |   |
|---------------------------------|---------------------|-------|---|
| activation_1 (Activation)       | (None, 32, 32, 92)  | 0     | batch_normalization_1[0][0]                     |
| separable_conv2d_2 (SeparableCo | (None, 32, 32, 28)  | 4876  | activation_1[0][0]                              |
| concatenate_1 (Concatenate)     | (None, 32, 32, 120) | 0     | concatenate[0][0]<br>separable_conv2d_2[0][0]   |
| batch_normalization_2 (BatchNor | (None, 32, 32, 120) | 480   | concatenate_1[0][0]                             |
| activation_2 (Activation)       | (None, 32, 32, 120) | 0     | batch_normalization_2[0][0]                     |
| separable_conv2d_3 (SeparableCo | (None, 32, 32, 28)  | 6360  | activation_2[0][0]                              |
| concatenate_2 (Concatenate)     | (None, 32, 32, 148) | 0     | concatenate_1[0][0]<br>separable_conv2d_3[0][0] |
| batch_normalization_3 (BatchNor | (None, 32, 32, 148) | 592   | concatenate_2[0][0]                             |
| activation_3 (Activation)       | (None, 32, 32, 148) | 0     | batch_normalization_3[0][0]                     |
| separable_conv2d_4 (SeparableCo | (None, 32, 32, 28)  | 7844  | activation_3[0][0]                              |
| concatenate_3 (Concatenate)     | (None, 32, 32, 176) | 0     | concatenate_2[0][0]<br>separable_conv2d_4[0][0] |
| batch_normalization_4 (BatchNor | (None, 32, 32, 176) | 704   | concatenate_3[0][0]                             |
| activation_4 (Activation)       | (None, 32, 32, 176) | 0     | batch_normalization_4[0][0]                     |
| separable_conv2d_5 (SeparableCo | (None, 32, 32, 28)  | 9328  | activation_4[0][0]                              |
| concatenate_4 (Concatenate)     | (None, 32, 32, 204) | 0     | concatenate_3[0][0]<br>separable_conv2d_5[0][0] |
| batch_normalization_5 (BatchNor | (None, 32, 32, 204) | 816   | concatenate_4[0][0]                             |
| activation_5 (Activation)       | (None, 32, 32, 204) | 0     | batch_normalization_5[0][0]                     |
| separable_conv2d_6 (SeparableCo | (None, 32, 32, 28)  | 10812 | activation_5[0][0]                              |
| concatenate_5 (Concatenate)     | (None, 32, 32, 232) | 0     | concatenate_4[0][0]<br>separable_conv2d_6[0][0] |
| batch_normalization_6 (BatchNor | (None, 32, 32, 232) | 928   | concatenate_5[0][0]                             |
| activation_6 (Activation)       | (None, 32, 32, 232) | 0     | batch_normalization_6[0][0]                     |
| separable_conv2d_7 (SeparableCo | (None, 32, 32, 28)  | 12296 | activation_6[0][0]                              |
| concatenate_6 (Concatenate)     | (None, 32, 32, 260) | 0     | concatenate_5[0][0]<br>separable_conv2d_7[0][0] |
| batch_normalization_7 (BatchNor | (None, 32, 32, 260) | 1040  | concatenate_6[0][0]                             |
| activation_7 (Activation)       | (None, 32, 32, 260) | 0     | batch_normalization_7[0][0]                     |
| separable_conv2d_8 (SeparableCo | (None, 32, 32, 28)  | 13780 | activation_7[0][0]                              |
| concatenate_7 (Concatenate)     | (None, 32, 32, 288) | 0     | concatenate_6[0][0]<br>separable_conv2d_8[0][0] |
| batch_normalization_8 (BatchNor | (None, 32, 32, 288) | 1152  | concatenate_7[0][0]                             |
| activation_8 (Activation)       | (None, 32, 32, 288) | 0     | batch_normalization_8[0][0]                     |
| separable_conv2d_9 (SeparableCo | (None, 32, 32, 28)  | 15264 | activation_8[0][0]                              |
| concatenate_8 (Concatenate)     | (None, 32, 32, 316) | 0     | concatenate_7[0][0]<br>separable_conv2d_9[0][0] |
| batch_normalization_9 (BatchNor | (None, 32, 32, 316) | 1264  | concatenate_8[0][0]                             |
| activation_9 (Activation)       | (None, 32, 32, 316) | 0     | batch_normalization_9[0][0]                     |
| separable_conv2d_10 (SeparableC | (None, 32, 32, 28)  | 16748 | activation_9[0][0]                              |

|                                 |                     |       |  |
|---------------------------------|---------------------|-------|--|
| concatenate_9 (Concatenate)     | (None, 32, 32, 344) | 0     | concatenate_8[0][0]<br>separable_conv2d_10[0][0]     |
| batch_normalization_10 (BatchNo | (None, 32, 32, 344) | 1376  | concatenate_9[0][0]                                  |
| activation_10 (Activation)      | (None, 32, 32, 344) | 0     | batch_normalization_10[0][0]                         |
| separable_conv2d_11 (SeparableC | (None, 32, 32, 28)  | 26488 | activation_10[0][0]                                  |
| average_pooling2d (AveragePooli | (None, 16, 16, 28)  | 0     | separable_conv2d_11[0][0]                            |
| batch_normalization_11 (BatchNo | (None, 16, 16, 28)  | 112   | average_pooling2d[0][0]                              |
| activation_11 (Activation)      | (None, 16, 16, 28)  | 0     | batch_normalization_11[0][0]                         |
| separable_conv2d_12 (SeparableC | (None, 16, 16, 28)  | 1484  | activation_11[0][0]                                  |
| concatenate_10 (Concatenate)    | (None, 16, 16, 56)  | 0     | average_pooling2d[0][0]<br>separable_conv2d_12[0][0] |
| batch_normalization_12 (BatchNo | (None, 16, 16, 56)  | 224   | concatenate_10[0][0]                                 |
| activation_12 (Activation)      | (None, 16, 16, 56)  | 0     | batch_normalization_12[0][0]                         |
| separable_conv2d_13 (SeparableC | (None, 16, 16, 28)  | 2968  | activation_12[0][0]                                  |
| concatenate_11 (Concatenate)    | (None, 16, 16, 84)  | 0     | concatenate_10[0][0]<br>separable_conv2d_13[0][0]    |
| batch_normalization_13 (BatchNo | (None, 16, 16, 84)  | 336   | concatenate_11[0][0]                                 |
| activation_13 (Activation)      | (None, 16, 16, 84)  | 0     | batch_normalization_13[0][0]                         |
| separable_conv2d_14 (SeparableC | (None, 16, 16, 28)  | 4452  | activation_13[0][0]                                  |
| concatenate_12 (Concatenate)    | (None, 16, 16, 112) | 0     | concatenate_11[0][0]<br>separable_conv2d_14[0][0]    |
| batch_normalization_14 (BatchNo | (None, 16, 16, 112) | 448   | concatenate_12[0][0]                                 |
| activation_14 (Activation)      | (None, 16, 16, 112) | 0     | batch_normalization_14[0][0]                         |
| separable_conv2d_15 (SeparableC | (None, 16, 16, 28)  | 5936  | activation_14[0][0]                                  |
| concatenate_13 (Concatenate)    | (None, 16, 16, 140) | 0     | concatenate_12[0][0]<br>separable_conv2d_15[0][0]    |
| batch_normalization_15 (BatchNo | (None, 16, 16, 140) | 560   | concatenate_13[0][0]                                 |
| activation_15 (Activation)      | (None, 16, 16, 140) | 0     | batch_normalization_15[0][0]                         |
| separable_conv2d_16 (SeparableC | (None, 16, 16, 28)  | 7420  | activation_15[0][0]                                  |
| concatenate_14 (Concatenate)    | (None, 16, 16, 168) | 0     | concatenate_13[0][0]<br>separable_conv2d_16[0][0]    |
| batch_normalization_16 (BatchNo | (None, 16, 16, 168) | 672   | concatenate_14[0][0]                                 |
| activation_16 (Activation)      | (None, 16, 16, 168) | 0     | batch_normalization_16[0][0]                         |
| separable_conv2d_17 (SeparableC | (None, 16, 16, 28)  | 8904  | activation_16[0][0]                                  |
| concatenate_15 (Concatenate)    | (None, 16, 16, 196) | 0     | concatenate_14[0][0]<br>separable_conv2d_17[0][0]    |
| batch_normalization_17 (BatchNo | (None, 16, 16, 196) | 784   | concatenate_15[0][0]                                 |
| activation_17 (Activation)      | (None, 16, 16, 196) | 0     | batch_normalization_17[0][0]                         |
| separable_conv2d_18 (SeparableC | (None, 16, 16, 28)  | 10388 | activation_17[0][0]                                  |
| concatenate_16 (Concatenate)    | (None, 16, 16, 224) | 0     | concatenate_15[0][0]<br>separable_conv2d_18[0][0]    |
| batch_normalization_18 (BatchNo | (None, 16, 16, 224) | 896   | concatenate_16[0][0]                                 |
| activation_18 (Activation)      | (None, 16, 16, 224) | 0     | batch_normalization_18[0][0]                         |

|                                 |                     |       |  |
|---------------------------------|---------------------|-------|--|
| separable_conv2d_19 (SeparableC | (None, 16, 16, 28)  | 11872 | activation_18[0][0]                                    |
| concatenate_17 (Concatenate)    | (None, 16, 16, 252) | 0     | concatenate_16[0][0]<br>separable_conv2d_19[0][0]      |
| batch_normalization_19 (BatchNo | (None, 16, 16, 252) | 1008  | concatenate_17[0][0]                                   |
| activation_19 (Activation)      | (None, 16, 16, 252) | 0     | batch_normalization_19[0][0]                           |
| separable_conv2d_20 (SeparableC | (None, 16, 16, 28)  | 13356 | activation_19[0][0]                                    |
| concatenate_18 (Concatenate)    | (None, 16, 16, 280) | 0     | concatenate_17[0][0]<br>separable_conv2d_20[0][0]      |
| batch_normalization_20 (BatchNo | (None, 16, 16, 280) | 1120  | concatenate_18[0][0]                                   |
| activation_20 (Activation)      | (None, 16, 16, 280) | 0     | batch_normalization_20[0][0]                           |
| separable_conv2d_21 (SeparableC | (None, 16, 16, 28)  | 14840 | activation_20[0][0]                                    |
| concatenate_19 (Concatenate)    | (None, 16, 16, 308) | 0     | concatenate_18[0][0]<br>separable_conv2d_21[0][0]      |
| batch_normalization_21 (BatchNo | (None, 16, 16, 308) | 1232  | concatenate_19[0][0]                                   |
| activation_21 (Activation)      | (None, 16, 16, 308) | 0     | batch_normalization_21[0][0]                           |
| separable_conv2d_22 (SeparableC | (None, 16, 16, 28)  | 23716 | activation_21[0][0]                                    |
| average_pooling2d_1 (AveragePoo | (None, 8, 8, 28)    | 0     | separable_conv2d_22[0][0]                              |
| batch_normalization_22 (BatchNo | (None, 8, 8, 28)    | 112   | average_pooling2d_1[0][0]                              |
| activation_22 (Activation)      | (None, 8, 8, 28)    | 0     | batch_normalization_22[0][0]                           |
| separable_conv2d_23 (SeparableC | (None, 8, 8, 28)    | 1484  | activation_22[0][0]                                    |
| concatenate_20 (Concatenate)    | (None, 8, 8, 56)    | 0     | average_pooling2d_1[0][0]<br>separable_conv2d_23[0][0] |
| batch_normalization_23 (BatchNo | (None, 8, 8, 56)    | 224   | concatenate_20[0][0]                                   |
| activation_23 (Activation)      | (None, 8, 8, 56)    | 0     | batch_normalization_23[0][0]                           |
| separable_conv2d_24 (SeparableC | (None, 8, 8, 28)    | 2968  | activation_23[0][0]                                    |
| concatenate_21 (Concatenate)    | (None, 8, 8, 84)    | 0     | concatenate_20[0][0]<br>separable_conv2d_24[0][0]      |
| batch_normalization_24 (BatchNo | (None, 8, 8, 84)    | 336   | concatenate_21[0][0]                                   |
| activation_24 (Activation)      | (None, 8, 8, 84)    | 0     | batch_normalization_24[0][0]                           |
| separable_conv2d_25 (SeparableC | (None, 8, 8, 28)    | 4452  | activation_24[0][0]                                    |
| concatenate_22 (Concatenate)    | (None, 8, 8, 112)   | 0     | concatenate_21[0][0]<br>separable_conv2d_25[0][0]      |
| batch_normalization_25 (BatchNo | (None, 8, 8, 112)   | 448   | concatenate_22[0][0]                                   |
| activation_25 (Activation)      | (None, 8, 8, 112)   | 0     | batch_normalization_25[0][0]                           |
| separable_conv2d_26 (SeparableC | (None, 8, 8, 28)    | 5936  | activation_25[0][0]                                    |
| concatenate_23 (Concatenate)    | (None, 8, 8, 140)   | 0     | concatenate_22[0][0]<br>separable_conv2d_26[0][0]      |
| batch_normalization_26 (BatchNo | (None, 8, 8, 140)   | 560   | concatenate_23[0][0]                                   |
| activation_26 (Activation)      | (None, 8, 8, 140)   | 0     | batch_normalization_26[0][0]                           |
| separable_conv2d_27 (SeparableC | (None, 8, 8, 28)    | 7420  | activation_26[0][0]                                    |
| concatenate_24 (Concatenate)    | (None, 8, 8, 168)   | 0     | concatenate_23[0][0]<br>separable_conv2d_27[0][0]      |

|                        |               |                   |       |  |
|------------------------|---------------|-------------------|-------|--|
| batch_normalization_27 | (BatchNo      | (None, 8, 8, 168) | 672   | concatenate_24[0][0]                                   |
| activation_27          | (Activation)  | (None, 8, 8, 168) | 0     | batch_normalization_27[0][0]                           |
| separable_conv2d_28    | (SeparableC   | (None, 8, 8, 28)  | 8904  | activation_27[0][0]                                    |
| concatenate_25         | (Concatenate) | (None, 8, 8, 196) | 0     | concatenate_24[0][0]<br>separable_conv2d_28[0][0]      |
| batch_normalization_28 | (BatchNo      | (None, 8, 8, 196) | 784   | concatenate_25[0][0]                                   |
| activation_28          | (Activation)  | (None, 8, 8, 196) | 0     | batch_normalization_28[0][0]                           |
| separable_conv2d_29    | (SeparableC   | (None, 8, 8, 28)  | 10388 | activation_28[0][0]                                    |
| concatenate_26         | (Concatenate) | (None, 8, 8, 224) | 0     | concatenate_25[0][0]<br>separable_conv2d_29[0][0]      |
| batch_normalization_29 | (BatchNo      | (None, 8, 8, 224) | 896   | concatenate_26[0][0]                                   |
| activation_29          | (Activation)  | (None, 8, 8, 224) | 0     | batch_normalization_29[0][0]                           |
| separable_conv2d_30    | (SeparableC   | (None, 8, 8, 28)  | 11872 | activation_29[0][0]                                    |
| concatenate_27         | (Concatenate) | (None, 8, 8, 252) | 0     | concatenate_26[0][0]<br>separable_conv2d_30[0][0]      |
| batch_normalization_30 | (BatchNo      | (None, 8, 8, 252) | 1008  | concatenate_27[0][0]                                   |
| activation_30          | (Activation)  | (None, 8, 8, 252) | 0     | batch_normalization_30[0][0]                           |
| separable_conv2d_31    | (SeparableC   | (None, 8, 8, 28)  | 13356 | activation_30[0][0]                                    |
| concatenate_28         | (Concatenate) | (None, 8, 8, 280) | 0     | concatenate_27[0][0]<br>separable_conv2d_31[0][0]      |
| batch_normalization_31 | (BatchNo      | (None, 8, 8, 280) | 1120  | concatenate_28[0][0]                                   |
| activation_31          | (Activation)  | (None, 8, 8, 280) | 0     | batch_normalization_31[0][0]                           |
| separable_conv2d_32    | (SeparableC   | (None, 8, 8, 28)  | 14840 | activation_31[0][0]                                    |
| concatenate_29         | (Concatenate) | (None, 8, 8, 308) | 0     | concatenate_28[0][0]<br>separable_conv2d_32[0][0]      |
| batch_normalization_32 | (BatchNo      | (None, 8, 8, 308) | 1232  | concatenate_29[0][0]                                   |
| activation_32          | (Activation)  | (None, 8, 8, 308) | 0     | batch_normalization_32[0][0]                           |
| separable_conv2d_33    | (SeparableC   | (None, 8, 8, 28)  | 23716 | activation_32[0][0]                                    |
| average_pooling2d_2    | (AveragePoo   | (None, 4, 4, 28)  | 0     | separable_conv2d_33[0][0]                              |
| batch_normalization_33 | (BatchNo      | (None, 4, 4, 28)  | 112   | average_pooling2d_2[0][0]                              |
| activation_33          | (Activation)  | (None, 4, 4, 28)  | 0     | batch_normalization_33[0][0]                           |
| separable_conv2d_34    | (SeparableC   | (None, 4, 4, 28)  | 1484  | activation_33[0][0]                                    |
| concatenate_30         | (Concatenate) | (None, 4, 4, 56)  | 0     | average_pooling2d_2[0][0]<br>separable_conv2d_34[0][0] |
| batch_normalization_34 | (BatchNo      | (None, 4, 4, 56)  | 224   | concatenate_30[0][0]                                   |
| activation_34          | (Activation)  | (None, 4, 4, 56)  | 0     | batch_normalization_34[0][0]                           |
| separable_conv2d_35    | (SeparableC   | (None, 4, 4, 28)  | 2968  | activation_34[0][0]                                    |
| concatenate_31         | (Concatenate) | (None, 4, 4, 84)  | 0     | concatenate_30[0][0]<br>separable_conv2d_35[0][0]      |
| batch_normalization_35 | (BatchNo      | (None, 4, 4, 84)  | 336   | concatenate_31[0][0]                                   |
| activation_35          | (Activation)  | (None, 4, 4, 84)  | 0     | batch_normalization_35[0][0]                           |
| separable_conv2d_36    | (SeparableC   | (None, 4, 4, 28)  | 4452  | activation_35[0][0]                                    |

|                                 |                   |       |   |
|---------------------------------|-------------------|-------|---|
| concatenate_32 (Concatenate)    | (None, 4, 4, 112) | 0     | concatenate_31[0][0]<br>separable_conv2d_36[0][0] |
| batch_normalization_36 (BatchNo | (None, 4, 4, 112) | 448   | concatenate_32[0][0]                              |
| activation_36 (Activation)      | (None, 4, 4, 112) | 0     | batch_normalization_36[0][0]                      |
| separable_conv2d_37 (SeparableC | (None, 4, 4, 28)  | 5936  | activation_36[0][0]                               |
| concatenate_33 (Concatenate)    | (None, 4, 4, 140) | 0     | concatenate_32[0][0]<br>separable_conv2d_37[0][0] |
| batch_normalization_37 (BatchNo | (None, 4, 4, 140) | 560   | concatenate_33[0][0]                              |
| activation_37 (Activation)      | (None, 4, 4, 140) | 0     | batch_normalization_37[0][0]                      |
| separable_conv2d_38 (SeparableC | (None, 4, 4, 28)  | 7420  | activation_37[0][0]                               |
| concatenate_34 (Concatenate)    | (None, 4, 4, 168) | 0     | concatenate_33[0][0]<br>separable_conv2d_38[0][0] |
| batch_normalization_38 (BatchNo | (None, 4, 4, 168) | 672   | concatenate_34[0][0]                              |
| activation_38 (Activation)      | (None, 4, 4, 168) | 0     | batch_normalization_38[0][0]                      |
| separable_conv2d_39 (SeparableC | (None, 4, 4, 28)  | 8904  | activation_38[0][0]                               |
| concatenate_35 (Concatenate)    | (None, 4, 4, 196) | 0     | concatenate_34[0][0]<br>separable_conv2d_39[0][0] |
| batch_normalization_39 (BatchNo | (None, 4, 4, 196) | 784   | concatenate_35[0][0]                              |
| activation_39 (Activation)      | (None, 4, 4, 196) | 0     | batch_normalization_39[0][0]                      |
| separable_conv2d_40 (SeparableC | (None, 4, 4, 28)  | 10388 | activation_39[0][0]                               |
| concatenate_36 (Concatenate)    | (None, 4, 4, 224) | 0     | concatenate_35[0][0]<br>separable_conv2d_40[0][0] |
| batch_normalization_40 (BatchNo | (None, 4, 4, 224) | 896   | concatenate_36[0][0]                              |
| activation_40 (Activation)      | (None, 4, 4, 224) | 0     | batch_normalization_40[0][0]                      |
| separable_conv2d_41 (SeparableC | (None, 4, 4, 28)  | 11872 | activation_40[0][0]                               |
| concatenate_37 (Concatenate)    | (None, 4, 4, 252) | 0     | concatenate_36[0][0]<br>separable_conv2d_41[0][0] |
| batch_normalization_41 (BatchNo | (None, 4, 4, 252) | 1008  | concatenate_37[0][0]                              |
| activation_41 (Activation)      | (None, 4, 4, 252) | 0     | batch_normalization_41[0][0]                      |
| separable_conv2d_42 (SeparableC | (None, 4, 4, 28)  | 13356 | activation_41[0][0]                               |
| concatenate_38 (Concatenate)    | (None, 4, 4, 280) | 0     | concatenate_37[0][0]<br>separable_conv2d_42[0][0] |
| batch_normalization_42 (BatchNo | (None, 4, 4, 280) | 1120  | concatenate_38[0][0]                              |
| activation_42 (Activation)      | (None, 4, 4, 280) | 0     | batch_normalization_42[0][0]                      |
| separable_conv2d_43 (SeparableC | (None, 4, 4, 28)  | 14840 | activation_42[0][0]                               |
| concatenate_39 (Concatenate)    | (None, 4, 4, 308) | 0     | concatenate_38[0][0]<br>separable_conv2d_43[0][0] |
| batch_normalization_43 (BatchNo | (None, 4, 4, 308) | 1232  | concatenate_39[0][0]                              |
| activation_43 (Activation)      | (None, 4, 4, 308) | 0     | batch_normalization_43[0][0]                      |
| average_pooling2d_3 (AveragePoo | (None, 2, 2, 308) | 0     | activation_43[0][0]                               |
| flatten (Flatten)               | (None, 1232)      | 0     | average_pooling2d_3[0][0]                         |
| dense (Dense)                   | (None, 6)         | 7398  | flatten[0][0]                                     |
| =====                           |                   |       |   |
| Total params: 458,297           |                   |       |   |



Trainable params: 442,721  
Non-trainable params: 15,576

---

In [0]:

```
datagen = ImageDataGenerator(  
    rotation_range=20,  
    width_shift_range=0.15,  
    height_shift_range=0.15,  
    horizontal_flip=True,  
    zoom_range = 0.1  
)  
datagen.fit(X_train)
```

In [0]:

```
from tensorflow.python.keras.callbacks import ModelCheckpoint, EarlyStopping, ReduceLROnPlateau, LearningRateScheduler
```

In [0]:

```
import math
```

In [0]:

```
#https://machinelearningmastery.com/check-point-deep-learning-models-keras/  
filepath="epochs:{epoch:03d}-val_acc:{val_acc:.3f}.hdf5"  
checkpoint_1 = ModelCheckpoint(filepath, monitor='val_acc', verbose=1, mode='max')
```

In [0]:

```
reduce_lr_1 = ReduceLROnPlateau(monitor='val_loss', factor=0.1,  
                                patience=4, verbose = 1)
```

In [0]:

```
earlystopping_1 = EarlyStopping(monitor='val_loss', patience=10, verbose=1)
```

In [0]:

```
callbacks_list = [earlystopping_1, reduce_lr_1, checkpoint_1]
```

In [0]:

```
# determine Loss function and Optimizer  
model.compile(loss='categorical_crossentropy',  
              optimizer="adam",  
              metrics=['accuracy'])
```

In [0]:

```
y_train = y_train_vect.toarray()  
y_test = y_test_vect.toarray()
```

In [0]:

```
y_test.shape
```

Out[0]:

```
(527, 6)
```

In [0]:

```
result = model.fit_generator(datagen.flow(X_train, y_train, batch_size=batch_size),
```

```
result = model.fit_generator(datagen.flow(X_train, y_train, batch_size=batch_size),
                             steps_per_epoch=X_train.shape[0] // 16,
                             epochs=100,
                             verbose=1,
                             validation_data=(X_test, y_test), callbacks=callbacks_list)
```

Epoch 1/100

134/135 [=====>.] - ETA: 0s - loss: 1.0972 - acc: 0.6049

Epoch 00001: saving model to epochs:001-val\_acc:0.503.hdf5

135/135 [=====] - 38s 281ms/step - loss: 1.0953 - acc: 0.6050 - val\_loss: 1.5779 - val\_acc: 0.5028

Epoch 2/100

134/135 [=====>.] - ETA: 0s - loss: 0.9198 - acc: 0.6464

Epoch 00002: saving model to epochs:002-val\_acc:0.503.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.9193 - acc: 0.6463 - val\_loss: 1.3714 - val\_acc: 0.5028

Epoch 3/100

134/135 [=====>.] - ETA: 0s - loss: 0.8712 - acc: 0.6618

Epoch 00003: saving model to epochs:003-val\_acc:0.548.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.8685 - acc: 0.6631 - val\_loss: 1.1550 - val\_acc: 0.5484

Epoch 4/100

134/135 [=====>.] - ETA: 0s - loss: 0.8249 - acc: 0.6818

Epoch 00004: saving model to epochs:004-val\_acc:0.605.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.8238 - acc: 0.6821 - val\_loss: 1.0831 - val\_acc: 0.6053

Epoch 5/100

134/135 [=====>.] - ETA: 0s - loss: 0.8108 - acc: 0.6786

Epoch 00005: saving model to epochs:005-val\_acc:0.416.hdf5

135/135 [=====] - 12s 93ms/step - loss: 0.8104 - acc: 0.6782 - val\_loss: 2.5003 - val\_acc: 0.4156

Epoch 6/100

134/135 [=====>.] - ETA: 0s - loss: 0.7735 - acc: 0.6926

Epoch 00006: saving model to epochs:006-val\_acc:0.562.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.7730 - acc: 0.6928 - val\_loss: 1.3009 - val\_acc: 0.5617

Epoch 7/100

134/135 [=====>.] - ETA: 0s - loss: 0.7365 - acc: 0.7032

Epoch 00007: saving model to epochs:007-val\_acc:0.645.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.7376 - acc: 0.7035 - val\_loss: 0.8486 - val\_acc: 0.6452

Epoch 8/100

134/135 [=====>.] - ETA: 0s - loss: 0.7424 - acc: 0.7058

Epoch 00008: saving model to epochs:008-val\_acc:0.454.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.7409 - acc: 0.7068 - val\_loss: 2.4321 - val\_acc: 0.4535

Epoch 9/100

134/135 [=====>.] - ETA: 0s - loss: 0.7353 - acc: 0.7114

Epoch 00009: saving model to epochs:009-val\_acc:0.636.hdf5

135/135 [=====] - 13s 93ms/step - loss: 0.7328 - acc: 0.7122 - val\_loss: 1.0098 - val\_acc: 0.6357

Epoch 10/100

134/135 [=====>.] - ETA: 0s - loss: 0.6908 - acc: 0.7231

Epoch 00010: saving model to epochs:010-val\_acc:0.691.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.6898 - acc: 0.7233 - val\_loss: 0.8323 - val\_acc: 0.6907

Epoch 11/100

134/135 [=====>.] - ETA: 0s - loss: 0.6698 - acc: 0.7318

Epoch 00011: saving model to epochs:011-val\_acc:0.645.hdf5

135/135 [=====] - 13s 93ms/step - loss: 0.6701 - acc: 0.7313 - val\_loss: 1.0330 - val\_acc: 0.6452

Epoch 12/100

134/135 [=====>.] - ETA: 0s - loss: 0.6487 - acc: 0.7417

Epoch 00012: saving model to epochs:012-val\_acc:0.668.hdf5

135/135 [=====] - 12s 92ms/step - loss: 0.6519 - acc: 0.7410 - val\_loss: 0.8860 - val\_acc: 0.6679

Epoch 13/100

134/135 [=====>.] - ETA: 0s - loss: 0.6270 - acc: 0.7417

Epoch 00013: saving model to epochs:013-val\_acc:0.615.hdf5

135/135 [=====] - 13s 93ms/step - loss: 0.6276 - acc: 0.7417 - val\_loss: 1.1006 - val\_acc: 0.6148

Epoch 14/100

134/135 [=====>.] - ETA: 0s - loss: 0.6230 - acc: 0.7410

Epoch 00014: ReduceLROnPlateau reducing learning rate to 0.00010000000474974513.

Epoch 00014: saving model to epochs:014-val\_acc:0.537.hdf5

135/135 [=====] - 13s 97ms/step - loss: 0.6229 - acc: 0.7403 - val loss:

```

1.4882 - val_acc: 0.5370
Epoch 15/100
134/135 [=====>.] - ETA: 0s - loss: 0.5387 - acc: 0.7778
Epoch 00015: saving model to epochs:015-val_acc:0.719.hdf5
135/135 [=====] - 13s 93ms/step - loss: 0.5380 - acc: 0.7785 - val_loss:
0.6694 - val_acc: 0.7192
Epoch 16/100
134/135 [=====>.] - ETA: 0s - loss: 0.4975 - acc: 0.7963
Epoch 00016: saving model to epochs:016-val_acc:0.729.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4982 - acc: 0.7960 - val_loss:
0.6649 - val_acc: 0.7287
Epoch 17/100
134/135 [=====>.] - ETA: 0s - loss: 0.4899 - acc: 0.7992
Epoch 00017: saving model to epochs:017-val_acc:0.731.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4881 - acc: 0.8002 - val_loss:
0.6703 - val_acc: 0.7306
Epoch 18/100
134/135 [=====>.] - ETA: 0s - loss: 0.4771 - acc: 0.8089
Epoch 00018: saving model to epochs:018-val_acc:0.727.hdf5
135/135 [=====] - 13s 93ms/step - loss: 0.4774 - acc: 0.8089 - val_loss:
0.7371 - val_acc: 0.7268
Epoch 19/100
134/135 [=====>.] - ETA: 0s - loss: 0.4570 - acc: 0.8082
Epoch 00019: saving model to epochs:019-val_acc:0.734.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4581 - acc: 0.8078 - val_loss:
0.6862 - val_acc: 0.7343
Epoch 20/100
134/135 [=====>.] - ETA: 0s - loss: 0.4366 - acc: 0.8189
Epoch 00020: ReduceLROnPlateau reducing learning rate to 1.0000000474974514e-05.

Epoch 00020: saving model to epochs:020-val_acc:0.725.hdf5
135/135 [=====] - 13s 93ms/step - loss: 0.4370 - acc: 0.8190 - val_loss:
0.7601 - val_acc: 0.7249
Epoch 21/100
134/135 [=====>.] - ETA: 0s - loss: 0.4318 - acc: 0.8282
Epoch 00021: saving model to epochs:021-val_acc:0.727.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4319 - acc: 0.8281 - val_loss:
0.7041 - val_acc: 0.7268
Epoch 22/100
134/135 [=====>.] - ETA: 0s - loss: 0.4164 - acc: 0.8257
Epoch 00022: saving model to epochs:022-val_acc:0.742.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4158 - acc: 0.8259 - val_loss:
0.7020 - val_acc: 0.7419
Epoch 23/100
134/135 [=====>.] - ETA: 0s - loss: 0.4275 - acc: 0.8240
Epoch 00023: saving model to epochs:023-val_acc:0.740.hdf5
135/135 [=====] - 12s 93ms/step - loss: 0.4290 - acc: 0.8232 - val_loss:
0.7024 - val_acc: 0.7400
Epoch 24/100
134/135 [=====>.] - ETA: 0s - loss: 0.4161 - acc: 0.8390
Epoch 00024: ReduceLROnPlateau reducing learning rate to 1.0000000656873453e-06.

Epoch 00024: saving model to epochs:024-val_acc:0.744.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4151 - acc: 0.8391 - val_loss:
0.7085 - val_acc: 0.7438
Epoch 25/100
134/135 [=====>.] - ETA: 0s - loss: 0.4189 - acc: 0.8247
Epoch 00025: saving model to epochs:025-val_acc:0.746.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4203 - acc: 0.8242 - val_loss:
0.7089 - val_acc: 0.7457
Epoch 26/100
134/135 [=====>.] - ETA: 0s - loss: 0.4171 - acc: 0.8275
Epoch 00026: saving model to epochs:026-val_acc:0.744.hdf5
135/135 [=====] - 12s 92ms/step - loss: 0.4180 - acc: 0.8270 - val_loss:
0.7078 - val_acc: 0.7438
Epoch 00026: early stopping

```

In [0]:

```

def plt_dynamic_auc(x, vy, ty, ax, colors=['b']):
    ax.plot(x, vy, 'b', label="Validation auc")
    ax.plot(x, ty, 'r', label="Train auc")
    plt.legend()
    plt.grid()
    fig.canvas.draw()

```

In [0]:

```
fig,ax = plt.subplots(1,1)
ax.set_xlabel('epoch') ; ax.set_ylabel('loss')

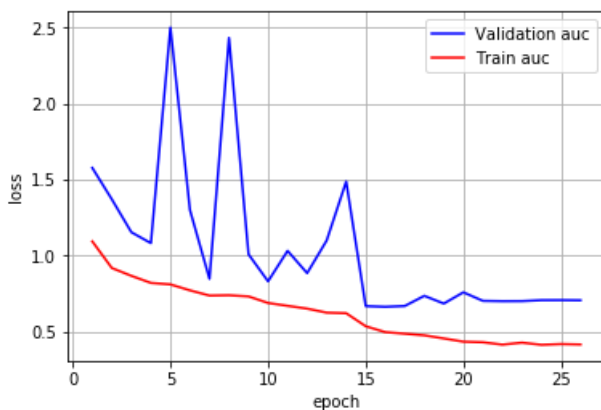
# list of epoch numbers
x = list(range(1,26+1))

# print(history.history.keys())
# dict_keys(['val_loss', 'val_acc', 'loss', 'acc'])
# history = model_drop.fit(X_train, Y_train, batch_size=batch_size, epochs=nb_epoch, verbose=1, validation_data=(X_test, Y_test))

# we will get val_loss and val_acc only when you pass the paramter validation_data
# val_loss : validation loss
# val_acc : validation accuracy

# loss : training loss
# acc : train accuracy
# for each key in history.history we will have a list of length equal to number of epochs

vy = result.history['val_loss']
ty = result.history['loss']
plt_dynamic_auc(x, vy, ty, ax)
```



## Testing

In [ ]:

```
!python test_frcnn.py \
-p /content/drive/My\ Drive/rcnn/train_images \
--result_path_2class /content/drive/My\ Drive/rcnn/Data_model_2/result_df_2class_train.csv \
--config_filename /content/drive/My\ Drive/rcnn/Data_model_2/config.pickle
```

In [ ]:

```
!python test_frcnn.py \
-p /content/drive/My\ Drive/rcnn/test_images \
--result_path_2class /content/drive/My\ Drive/rcnn/Data_model_2/result_df_2class.csv \
--config_filename /content/drive/My\ Drive/rcnn/Data_model_2/config.pickle
```

In [0]:

```
def get_map(annotate_path, result_df_path):

    def get_data(input_path):

        img_data = []

        with open(input_path, 'r') as f:
            for line in f:
                line_split = line.strip().split(',')
                (filename, x1, y1, x2, y2, class_name) = line_split
```

```

    img_data.append({'class': class_name, 'x1': int(x1), 'x2': int(x2), 'y1': int(y1), 'y2': int(y2)
    })

    return img_data
def union(au, bu, area_intersection):
    area_a = (au[2] - au[0]) * (au[3] - au[1])
    area_b = (bu[2] - bu[0]) * (bu[3] - bu[1])
    area_union = area_a + area_b - area_intersection
    return area_union

def intersection(ai, bi):
    x = max(ai[0], bi[0])
    y = max(ai[1], bi[1])
    w = min(ai[2], bi[2]) - x
    h = min(ai[3], bi[3]) - y
    if w < 0 or h < 0:
        return 0
    return w*h

def iou(a, b):
    # a and b should be (x1,y1,x2,y2)

    if a[0] >= a[2] or a[1] >= a[3] or b[0] >= b[2] or b[1] >= b[3]:
        return 0.0

    area_i = intersection(a, b)
    area_u = union(a, b, area_i)

    return float(area_i) / float(area_u + 1e-6)
gt = get_data(annotate_path)
pred = pd.read_csv(result_df_path)
pred.columns = ["name", "class", "x1", "y1", "x2", "y2", "prob"]
Truth = {}
Predicted = {}

for bbox in gt:
    bbox['bbox_matched'] = False

pred_probs = np.array(pred["prob"])
box_idx_sorted_by_prob = np.argsort(pred_probs)[::-1]

for box_idx in tqdm(box_idx_sorted_by_prob):
    pred_box = pred.loc[box_idx]
    pred_class = pred_box['class']
    pred_x1 = pred_box['x1']
    pred_x2 = pred_box['x2']
    pred_y1 = pred_box['y1']
    pred_y2 = pred_box['y2']
    pred_prob = pred_box['prob']
    if pred_class not in Predicted:
        Predicted[pred_class] = []
        Truth[pred_class] = []
    Predicted[pred_class].append(pred_prob)
    found_match = False
    for gt_box in gt:
        gt_class = gt_box['class']
        gt_x1 = gt_box['x1']
        gt_x2 = gt_box['x2']
        gt_y1 = gt_box['y1']
        gt_y2 = gt_box['y2']
        gt_seen = gt_box['bbox_matched']
        if gt_class != pred_class:
            continue
        if gt_seen:
            continue
        iou1 = iou((pred_x1, pred_y1, pred_x2, pred_y2), (gt_x1, gt_y1, gt_x2, gt_y2))
        if iou1 >= 0.5:
            found_match = True
            gt_box['bbox_matched'] = True
            break
    else:
        continue

```

```

Truth[pred_class].append(int(found_match))

for gt_box in gt:
    if not gt_box['bbox_matched']:
        if gt_box['class'] not in Predicted:
            Predicted[gt_box['class']] = []
            Truth[gt_box['class']] = []

        Truth[gt_box['class']].append(1)
        Predicted[gt_box['class']].append(0)
t = {}
p = {}
for key in Truth.keys():
    if key not in t:
        t[key] = []
        p[key] = []
        t[key].extend(Truth[key])
        p[key].extend(Predicted[key])
all_aps = []
for key in t.keys():
    ap = average_precision_score(t[key], p[key])
    print('{} AP: {}'.format(key, ap))
    all_aps.append(ap)
print('mAP = {}'.format(np.mean(np.array(all_aps))))

```

In [0]:

```

print("train map:")
get_map("/content/drive/My Drive/rcnn/annotate_train_2class.txt", "/content/drive/My
Drive/rcnn/Data_model_2/result_df_2class_train.csv" )

```

train map:

```

100%|██████████| 40765/40765 [12:16<00:00, 33.65it/s]

```

```

RBC AP: 0.999631335703299
other AP: 0.9872680356204361
mAP = 0.9934496856618675

```