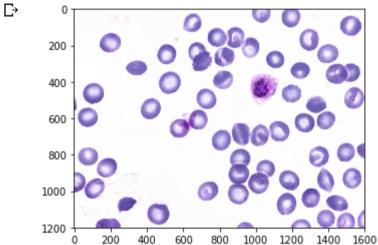
```
1 !wget --header="Host: storage.googleapis.com" --header="User-Agent: Mozilla/5.0 (Windows NT 10.0; Win64; x64) AppleWebKit/537.36 (KHTML, li
       --2019-10-03 07:18:16-- <a href="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?GoogleAccessId="https://storage.googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?Googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?Googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?Googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?Googleapis.com/kaggle-datasets/188282/420762/malaria-bounding-boxes.zip?Googleapis.com/kaggle-datasets/188282/420762/malaria-boxes.zip?Googleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapis.com/kaggleapi
       Resolving storage.googleapis.com (storage.googleapis.com)... 64.233.184.128, 2a00:1450:400c:c08::80
       Connecting to storage.googleapis.com (storage.googleapis.com) 64.233.184.128 :443... connected.
       HTTP request sent, awaiting response... 200 OK
       Length: 2259224287 (2.1G) [application/zip]
       Saving to: 'CurlWget597'
       CurlWget597
                                                          100%[========>]
                                                                                                                                   2.10G 46.2MB/s
                                                                                                                                                                                    in 49s
       2019-10-03 07:19:06 (43.8 MB/s) - 'CurlWget597' saved [2259224287/2259224287]
1 !unzip CurlWget597
1 import ison
2 training json = '/content/malaria/training.json'
4 with open(training json) as file:
                     file.seek(0)
                     train data = json.load(file)
1 train data
1 class dict = {'red blood cell': 0, 'trophozoite': 1, 'schizont': 2, 'difficult': 3, 'ring': 4, 'leukocyte': 5, 'gametocyte': 6}
1 train data =[]
2 for i in train data:
         path = 'malaria'+i['image']['pathname']
         for j in i['objects']:
              category = j['category']
              bounding box = j['bounding box']
              line = bounding box['maximum']['c'],bounding box['maximum']['r'],bounding box['minimum']['c'],bounding box['minimum']['r'],class dict[c
              train data .append(line)
```

```
1 train data
 1 import csv
 2 headers = [ 'minimum c', 'minimum r', 'maximum c', 'maximum r', 'category', 'path']
 3 with open('train.csv', 'w') as f:
           wr = csv.writer(f, quoting=csv.QUOTE ALL)
 5
           wr.writerow(headers)
           wr.writerows(train data )
 6
 1 import pandas as pd
 2 train df=pd.read csv('train.csv')
 3 train df.head(2)
C→
        minimum c minimum r maximum c maximum r category
                                                                                                            path
             1540
     0
                         1158
                                     1440
                                                 1057
                                                                 malaria/images/8d02117d-6c71-4e47-b50a-6cc8d5e...
     1
              1403
                          971
                                     1303
                                                  868
                                                              0 malaria/images/8d02117d-6c71-4e47-b50a-6cc8d5e...
 1 train df.columns
    Index(['minimum c', 'minimum r', 'maximum c', 'maximum r', 'category', 'path'], dtype='object')
 1 train df['category'].value counts()
         77420
С⇒
          1473
    3
           441
           353
           179
           144
           103
    Name: category, dtype: int64
 1 train_df['path'].value_counts()
```

```
train_df.shape

(80113, 6)

import matplotlib.pyplot as plt
from matplotlib import patches
image = plt.imread('/content/malaria/images/002f20ad-2ace-499c-9335-c9080bc3e6b5.png')
plt.imshow(image)
plt.show()
```



```
image.shape

(1200, 1600, 3)

train_df[train_df.path=="malaria/images/003a89b0-a095-417a-8dd6-f408339bbc68.png"]

for _,row in train_df[train_df.path=="malaria/images/003a89b0-a095-417a-8dd6-f408339bbc68.png"].iterrows():
    if row.category!='red blood cell':
        print(row)
```

Classification task: You are given an image with single object and you have to classify among different class, of which class it is from.

CNN is used as a classifier to classify between the images. So comes a point:

If a image contains several objects.

We have to detect the object which is far complex than classifying.

Can we detect objects in a given figure using naive CNN?

The **ANSWER** is YES.

How?

Take a image divide it into grids. Take any pre-trained model AlexNet, VGG take each grid and pass each grid into the model which can classified.

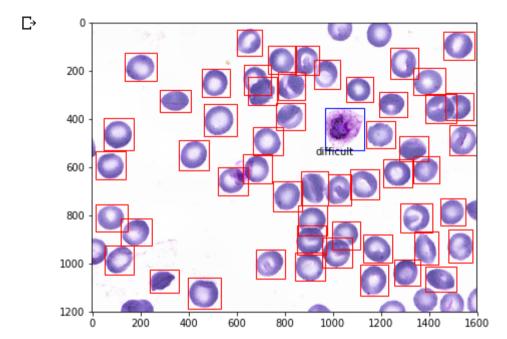
- 1. This is Brute Force method there is another method which is very efficient It is Fast RCNN (Regions with CNN)
- 2. And Second is YOLO You Only Look Once

```
1 fig = plt.figure()
  ax = fig.add axes([0,0,1,1])
5 image = plt.imread('malaria/images/002f20ad-2ace-499c-9335-c9080bc3e6b5.png')
   plt.imshow(image)
 8
  for ,row in train df[train df.path=="malaria/images/002f20ad-2ace-499c-9335-c9080bc3e6b5.png"].iterrows():
       xmin = row.minimum c
10
       xmax = row.maximum c
11
       ymin = row.minimum r
12
13
       vmax = row.maximum r
14
15
       1 = xmax-xmin
16
       b = ymax-ymin
17
18
       if row.category==0:
         color='r'
19
         #ax.annotate('red blood cell',xy=(xmax-40,ymin+20))
20
21
       elif row.category==1:
22
         color='g'
         ax.annotate('trophozoite',xy=(xmax-40,ymin+20))
23
       elif row.category==3:
24
         color='b'
25
         ax.annotate('difficult',xy=(xmax-40,ymin+20))
26
27
       elif row.category==4:
28
         color='r'
         ax.annotate('ring',xy=(xmax-40,ymin+20))
29
       elif row.category==2:
30
         color='r'
31
```

```
10/3/2019
               ax.annotate('schizont',xy=(xmax-40,ymin+20))
     32
             elif row.category==6:
     33
               color='o'
     34
     35
     36
     37
               color='b'
     38
     39
     40
     41
```

42 43

```
ax.annotate('gametocyte',xy=(xmax-40,ymin+20))
elif row.category==5:
 ax.annotate('leukocyte',xy=(xmax-40,ymin+20))
rect = patches.Rectangle((xmin,ymin), 1, b, edgecolor = color, facecolor = 'none')
ax.add patch(rect)
```



1 #!git clone https://github.com/dek8v5/Malaria_detection_with_Faster-RCNN_and_YOLOv3.git 1 1 train_df.columns Index(['minimum_c', 'minimum_r', 'maximum_c', 'maximum_r', 'category', 'path'], dtype='object')

```
1 train_df.isnull().any()
            minimum c
                                                                    False
            minimum r
                                                                    False
             maximum c
                                                                    False
             maximum r
                                                                    False
                                                                    False
             category
             path
                                                                    False
            dtype: bool
1 data = pd.DataFrame()
2 data['format'] = train df['path']
       for i in range(data.shape[0]):
                        data['format'][i] = data['format'][i] + ',' + str(train_df['minimum_c'][i]) + ',' + str(train_df['minimum_r'][i]) + ',' + str(train_df['minim
8 data.to csv('annotate.txt', header=None, index=None, sep=' ')
1 !pip install -r /content/keras-frcnn/requirements.txt
1 !python /content/keras-frcnn/train frcnn.py -o simple --num epochs 2 -p annotate.txt
1
1 | !python test frcnn.py -p "/images/41be1bd3-0d31-4881-bf1f-3ccdfa21ff12.jpg"
```

Tried to create a bounding box on newly seen images FRCNN model is learning too slow this system

Classification

There are **4** Infected cell 'gametocyte', 'ring', 'difficult', 'schizont', 'trophozoite' and **2** uninfected cell 'red blood cell' and 'leukocyte' We divide it into Infected and Uninfected classfication problem

Crop each cells from the actual image data (80,000 cells). Each cell is labeled either 0 or 1.

Metrics

As class is heavily imbalanced We will use F1- Score as a metric. First we will check with Random forest classifer and use a neural network to determine the score.

```
        minimum_c
        minimum_r
        maximum_c
        maximum_r
        category
        path

        0
        1540
        1158
        1440
        1057
        0 malaria/images/8d02117d-6c71-4e47-b50a-6cc8d5e...

        1
        1403
        971
        1303
        868
        0 malaria/images/8d02117d-6c71-4e47-b50a-6cc8d5e...
```

```
1 train_df['category'].value_counts()
```

77420 1473

```
3    441
4    353
2    179
6    144
5    103
Name: category[train_df.category == 5] = 0
2 train_df.category[train_df.category == 1] = 1
3 train_df.category[train_df.category == 2] = 1
4 train_df.category[train_df.category == 3] = 1
5 train_df.category[train_df.category == 4] = 1
6 train_df.category[train_df.category == 6] = 1
```

1 train_df['category'].value_counts()

```
Гэ
    0
         77523
           2590
    1
    Name: category, dtype: int64
 1 train df
 2 %matplotlib inline
 3 import cv2
 4 import numpy as np
 5 images=[]
 6 for i, row in train_df.iterrows():
     #print(row['path'])
     image=plt.imread(row['path'])
 8
    #print(image.shape)
    #print(image)
10
    #plt.imshow(image)
11
12
    r min = row['maximum r']
     c min = row['maximum c']
13
    r max = row['minimum r']
14
    c max = row['minimum c']
15
     obj image = image[r min:r max, c min:c max]
16
     #print(obj image.shape)
17
18
     obj image = cv2.resize(obj image, (32, 32), 0, 0, cv2.INTER LINEAR)
19
20
     obj image = obj image.astype(np.float32)
21
22
     plt.show()
     #obj image = np.multiply(obj_image, 1.0 / 255.0)
23
     #plt.imshow(obj image)
24
25
26
     obj image = obj image.flatten()
     images.append(obj image)
27
 1 import pickle
 2 with open('Fruits', 'wb') as fp:
    pickle.dump(images, fp)
 1 import pickle
 2 with open('/content/drive/My Drive/Fruits', 'rb') as fp:
    images = pickle.load(fp)
```

3072

```
1 from google.colab import drive
  2 drive.mount('/content/drive')
     Go to this URL in a browser: <a href="https://accounts.google.com/o/oauth2/auth?client_id=947318989803-6bn6qk8qdgf4n4g3pfee6491hc0brc4i.a">https://accounts.google.com/o/oauth2/auth?client_id=947318989803-6bn6qk8qdgf4n4g3pfee6491hc0brc4i.a</a>
      Enter your authorization code:
      Mounted at /content/drive
  1 from sklearn.model selection import train test split
  X_train, X_test, y_train, y_test = train_test_split(images, train_df['category'], test_size=0.2, random_state=41)
  1 from sklearn.ensemble import RandomForestClassifier
    rf = RandomForestClassifier(n estimators=120)
  5 rf.fit(X train, y train)
  7 y pred test = rf.predict(X test)
We woul take metrics as F1 score as class is heavily imbalanced
  1 from sklearn.metrics import f1 score
  2 print(f1_score(y_test, y_pred_test, average='macro'))
     0.7157014301804683
  1 pickle.dump(rf, open('BBmodel', 'wb'))
  1 len(images[0])
```

Deep Learning model

```
1 import keras
2 from keras.models import Sequential
3 from keras.lavers import Convolution2D
4 from keras.layers import MaxPooling2D
5 from keras.layers import Flatten
6 from keras.layers import Dense
    Using TensorFlow backend.
2 #https://datascience.stackexchange.com/questions/45165/how-to-get-accuracy-f1-precision-and-recall-for-a-keras-model
3 from keras import backend as K
4 def recall m(v true, v pred):
           true positives = K.sum(K.round(K.clip(y true * y pred, 0, 1)))
           possible positives = K.sum(K.round(K.clip(y true, 0, 1)))
6
           recall = true positives / (possible positives + K.epsilon())
8
           return recall
10 def precision m(y true, y pred):
11
           true positives = K.sum(K.round(K.clip(y true * y pred, 0, 1)))
           predicted positives = K.sum(K.round(K.clip(y pred, 0, 1)))
12
13
           precision = true positives / (predicted positives + K.epsilon())
           return precision
14
15
16 def f1 m(y true, y pred):
       precision = precision m(y true, y pred)
17
18
       recall = recall m(y true, y pred)
19
       return 2*((precision*recall)/(precision+recall+K.epsilon()))
1 model = Sequential()
2 model.add(Convolution2D(32,3,3,input shape=(32,32,3),activation = 'relu'))
3 model.add(MaxPooling2D(pool size=(2,2), strides = 2))
4 model.add(Flatten())
5 model.add(Dense(units = 128, activation = 'relu'))
6 model.add(Dense(units = 64, activation = 'relu'))
7 model.add(Dense(units = 32, activation = 'relu'))
9 model.add(Dense(units = 1, activation = 'sigmoid'))
11 model.compile(optimizer = 'adam', loss = 'binary_crossentropy', metrics=['accuracy',f1_m])
```

 \Box

/usr/local/lib/python3.6/dist-packages/ipykernel_launcher.py:2: UserWarning: Update your `Conv2D` call to the Keras 2 API: `Conv

```
Train on 56079 samples, validate on 24034 samples
Epoch 1/10
Epoch 2/10
Epoch 3/10
Epoch 4/10
Epoch 5/10
Epoch 6/10
Epoch 7/10
Epoch 8/10
Epoch 9/10
Epoch 10/10
<keras.callbacks.History at 0x7f8054e08f98>
```

1