BusinessCase

October 9, 2019

1 Images of satellites classification

```
In [37]: from google_images_download import google_images_download #importing the library
    import pandas
    import cv2 #to load and displays images
    import matplotlib.pyplot as plt
    import imutils
    import os
    import pandas as pd
    from shutil import copyfile
```

1.1 Download images of satellites / non satellites

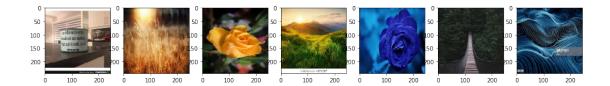
```
In [5]: downloadImages(categories, nb_images)
```

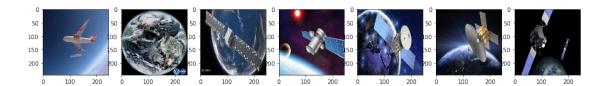
```
In [6]: catpd = [pandas.read_json("logs/" + str(cat) + ".json") for cat in categories]
```

1.1.1 download of images

In [7]: downloadImages(["satellite", "images"], nb_images)

```
In [8]: imgpd = pandas.read_json("logs/images.json")
        satpd = pandas.read_json("logs/satellite.json")
In [9]: imgpd.image_filename.count(), satpd.image_filename.count()
Out[9]: (397, 398)
In [10]: satpd.iloc[0]
Out[10]: image_description
                                Virgin Orbit Tests its Satellite-Delivery Rock...
         image_filename
                                                  virgin-orbit-first-release-2.jpg
         image_format
                                                                                jpg
                                                                                615
         image_height
         image_host
                                                                 universetoday.com
         image_link
                                https://www.universetoday.com/wp-content/uploa...
         image_source
                                https://www.universetoday.com/142812/virgin-or...
         image_thumbnail_url
                                https://encrypted-tbn0.gstatic.com/images?q=tb...
         image_width
                                                                               1000
         Name: 0, dtype: object
1.1.2 display of the first images
In [11]: def draw_imgs(imgs_list):
             1 = int(len(imgs_list))
             n = int(len(imgs_list[0]))
             _, axs = plt.subplots(l, n, figsize=(17, 17))
             axs = axs.flatten()
             for img, ax in zip([item for sublist in imgs_list for item in sublist], axs):
                 ax.imshow(img)
             plt.show()
In [12]: listnonsat = []
         for i in range(0,7):
             img =cv2.imread("./downloads/images - thumbnail/"+imgpd.image_filename[i])
             img = cv2.resize(img, (244,244), cv2.INTER_AREA)
             img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
             listnonsat.append(img)
         listsat = []
         for i in range(0,7):
             img =cv2.imread("./downloads/satellite - thumbnail/"+satpd.image_filename[i])
             img = cv2.resize(img, (244,244), cv2.INTER_AREA)
             img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
             listsat.append(img)
         draw_imgs([listnonsat, listsat])
```

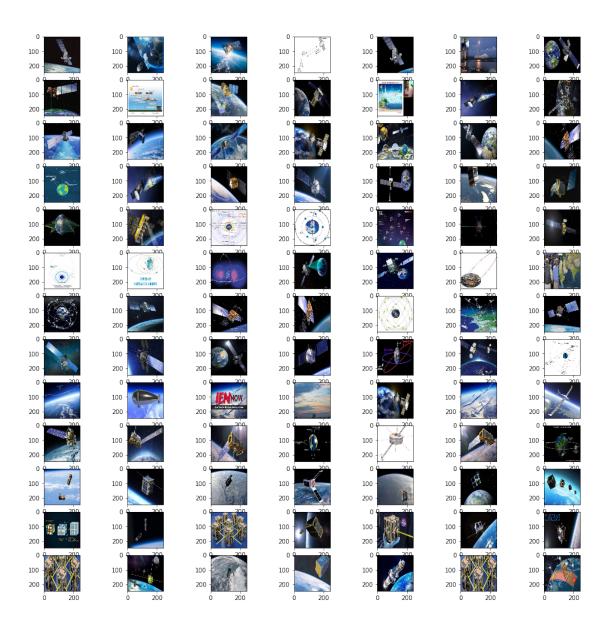




Remote Sensing Satellite
Navigation Satellite
LEO satellite
MEO satellite
HEO satellite
GPS satellite
GEO satellite

Communications Satellite

Drone Satellite Polar Satellite Nano Satellites CubeSats SmallSats



1.2 Classify satellite images

In [14]: $\#saving\ images\ in\ the\ right\ directories\ for\ keras\ CNN$

train_size = 200
test_size = 100

try:

```
os.mkdir("./classification/test")
             os.mkdir("./classification/test/images")
             os.mkdir("./classification/test/satellite")
             os.mkdir("./classification/train")
             os.mkdir("./classification/train/images")
             os.mkdir("./classification/train/satellite")
             os.mkdir("./classification/valid")
             os.mkdir("./classification/valid/images")
             os.mkdir("./classification/valid/satellite")
         except:
             print("directories already in place")
         def path_from_number(n):
             if i <= train_size:
                 path="train"
             else:
                 if i<=train_size+test_size:</pre>
                     path = "test"
                 else:
                     path = "valid"
             return path
         listnonsat = []
         for i in range(0,imgpd.shape[0]):
                 img =cv2.imread("./downloads/images - thumbnail/"+imgpd.image_filename[i])
                 img = cv2.resize(img, (64,64), cv2.INTER_AREA)
                 img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
                 cv2.imwrite("./classification/" + path_from_number(i)+"/images/"+str(i)+".jpg",
                 listnonsat.append(img)
                 print("image not resizable")
         listsat = []
         for i in range(0,satpd.shape[0]):
             try:
                 img =cv2.imread("./downloads/satellite - thumbnail/"+satpd.image_filename[i])
                 img = cv2.resize(img, (64,64), cv2.INTER_AREA)
                 img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
                 cv2.imwrite("./classification/" + path_from_number(i)+"/satellite/"+str(i)+".jr
                 listsat.append(img)
                 print("image not resizable")
directories already in place
image not resizable
```

os.mkdir("./classification")

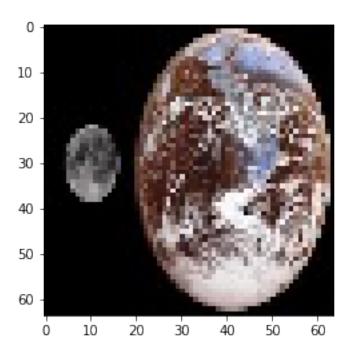
```
image not resizable
In [15]: len(listnonsat), len(listsat)
Out[15]: (396, 397)
In [16]: from keras.models import Sequential
         from keras.layers import Conv2D, MaxPooling2D
         from keras.layers import Activation, Flatten, Dense, Dropout
         from keras.preprocessing.image import ImageDataGenerator
         import time
         IMG_SIZE = 64 # Replace with the size of your images
         NB_CHANNELS = 3 # 3 for RGB images or 1 for grayscale images
         BATCH_SIZE = 32 # Typical values are 8, 16 or 32
         NB_TRAIN_IMG = 200 # Replace with the total number training images
         NB_VALID_IMG = 50 # Replace with the total number validation images
/home/franck/data/anaconda3/lib/python3.6/site-packages/h5py/__init__.py:34: FutureWarning: Conv
  from ._conv import register_converters as _register_converters
Using Theano backend.
In [17]: cnn = Sequential()
         cnn.add(Conv2D(filters=32,
                        kernel_size=(2,2),
                        strides=(1,1),
                        padding='same',
                        input_shape=(IMG_SIZE,IMG_SIZE,NB_CHANNELS),
                        data_format='channels_last'))
         cnn.add(Activation('relu'))
         cnn.add(MaxPooling2D(pool_size=(2,2),
                              strides=2))
         cnn.add(Conv2D(filters=64,
                        kernel_size=(2,2),
                        strides=(1,1),
                        padding='valid'))
         cnn.add(Activation('relu'))
         cnn.add(MaxPooling2D(pool_size=(2,2),
                              strides=2))
         cnn.add(Conv2D(filters=128,
                        kernel_size=(2,2),
                        strides=(1,1),
                        padding='valid'))
         cnn.add(Activation('relu'))
         cnn.add(MaxPooling2D(pool_size=(2,2),
                              strides=2))
         cnn.add(Flatten())
         cnn.add(Dense(32))
```

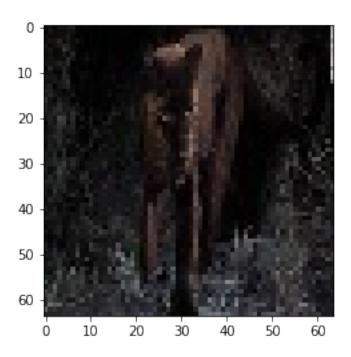
```
cnn.add(Activation('relu'))
     cnn.add(Dropout(0.25))
     cnn.add(Dense(1))
     cnn.add(Activation('sigmoid'))
     cnn.compile(loss='binary_crossentropy', optimizer='rmsprop', metrics=['accuracy'])
In [18]: print(cnn.summary())
               Output Shape
Layer (type)
______
               (None, 64, 64, 32)
conv2d_1 (Conv2D)
activation_1 (Activation) (None, 64, 64, 32)
max_pooling2d_1 (MaxPooling2 (None, 32, 32, 32)
______
conv2d_2 (Conv2D)
               (None, 31, 31, 64)
______
activation_2 (Activation)
               (None, 31, 31, 64)
  ______
max_pooling2d_2 (MaxPooling2 (None, 15, 15, 64)
______
conv2d_3 (Conv2D)
            (None, 14, 14, 128) 32896
_____
activation_3 (Activation) (None, 14, 14, 128)
______
max_pooling2d_3 (MaxPooling2 (None, 7, 7, 128)
_____
               (None, 6272)
flatten_1 (Flatten)
______
dense_1 (Dense)
               (None, 32)
______
activation_4 (Activation) (None, 32)
  _____
            (None, 32)
dropout_1 (Dropout)
-----
dense_2 (Dense) (None, 1)
activation_5 (Activation) (None, 1)
______
Total params: 242,337
Trainable params: 242,337
Non-trainable params: 0
None
```

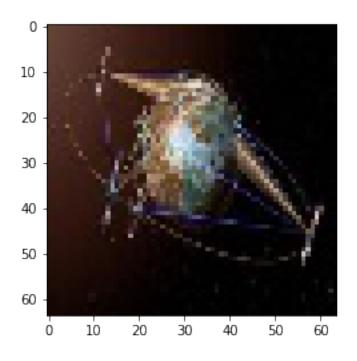
In [19]: train_datagen = ImageDataGenerator(

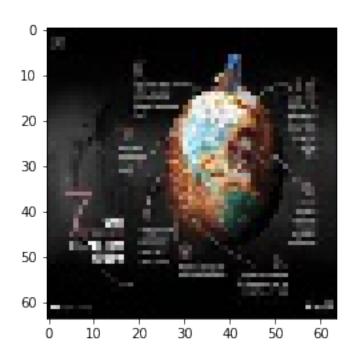
```
rescale=1./255,
       shear_range=0.2,
       zoom_range=0.2,
       horizontal_flip=True)
    test_datagen = ImageDataGenerator(rescale=1./255)
    train_generator = train_datagen.flow_from_directory(
       'classification/train',
       target_size=(64, 64),
       batch_size=32,
       class_mode='binary')
    validation_generator = test_datagen.flow_from_directory(
       'classification/valid',
       target_size=(64, 64),
       batch_size=32,
       class_mode='binary')
Found 400 images belonging to 2 classes.
Found 193 images belonging to 2 classes.
In [20]: cnn.fit_generator(
       train_generator,
       steps_per_epoch=100,
       epochs=20,
       validation_data=validation_generator,
       validation_steps=80)
Epoch 1/20
Epoch 2/20
Epoch 3/20
Epoch 4/20
Epoch 5/20
Epoch 6/20
Epoch 7/20
Epoch 8/20
Epoch 9/20
```

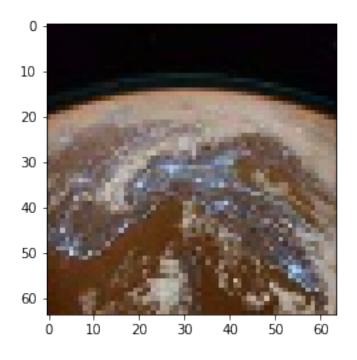
```
Epoch 10/20
Epoch 11/20
Epoch 12/20
Epoch 13/20
Epoch 14/20
Epoch 15/20
Epoch 16/20
Epoch 17/20
Epoch 18/20
Epoch 19/20
Epoch 20/20
Out[20]: <keras.callbacks.History at 0x7f849cfd4c50>
In [21]: cnn.save_weights('cnn.h5')
In [22]: cnn.load_weights('cnn.h5')
In [23]: test_generator = test_datagen.flow_from_directory(
      'classification/test',
      target_size=(64, 64),
      batch_size=32,
      class_mode='binary')
   test_imgs, test_labels = next(test_generator)
Found 200 images belonging to 2 classes.
In [24]: test_imgs.shape
Out[24]: (32, 64, 64, 3)
In [25]: predictions = cnn.predict_generator(test_generator, steps=1)
In [26]: predictions.shape
Out[26]: (32, 1)
```

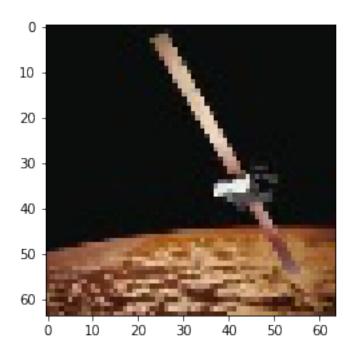


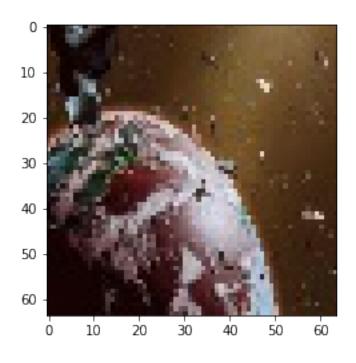


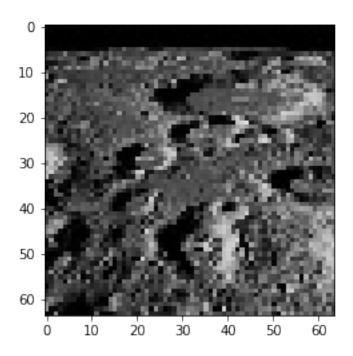


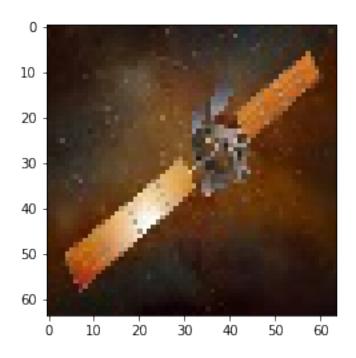


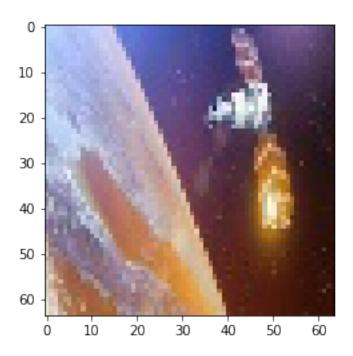


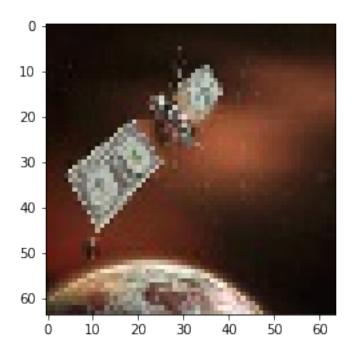


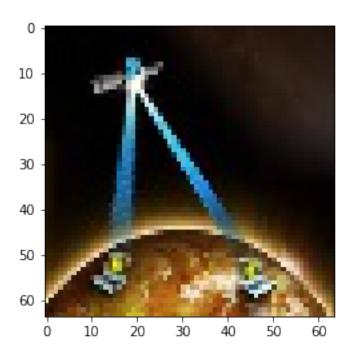


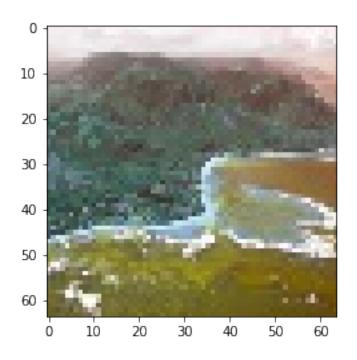


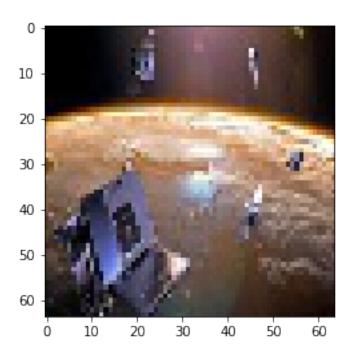


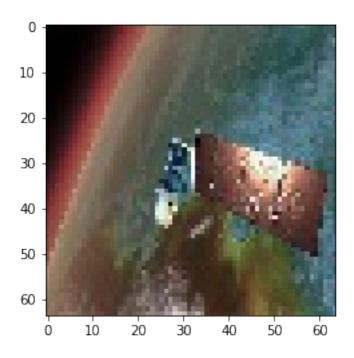


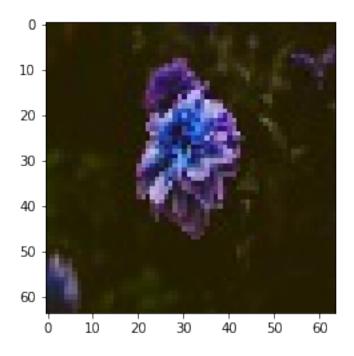


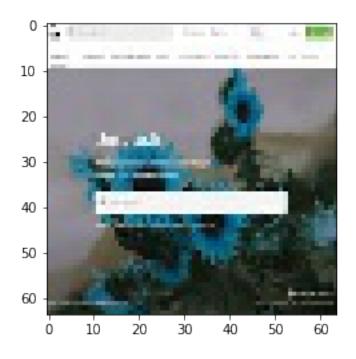


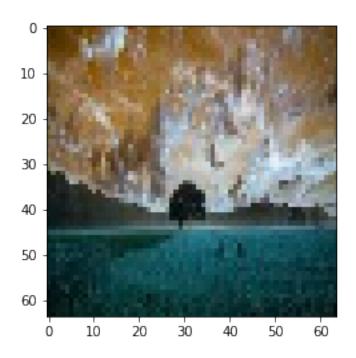


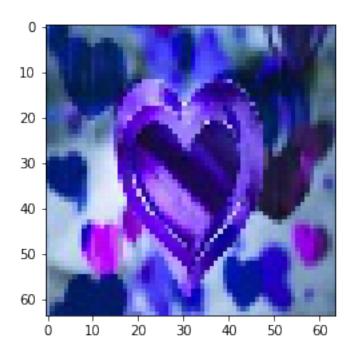


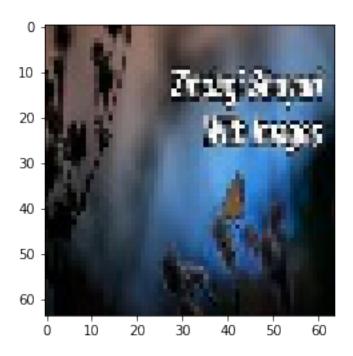


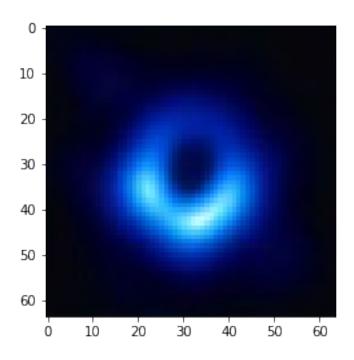


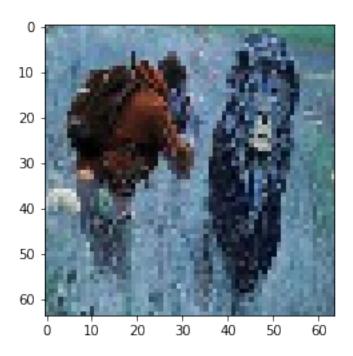


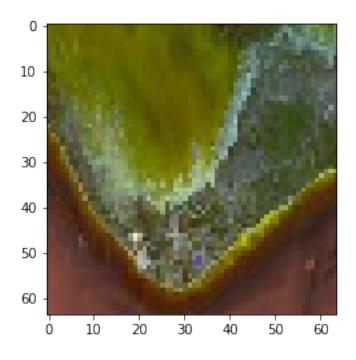


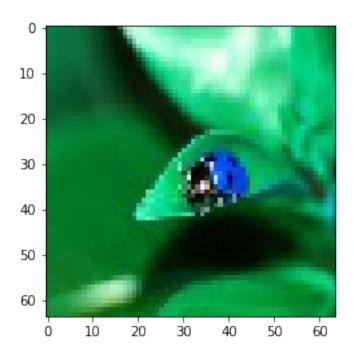


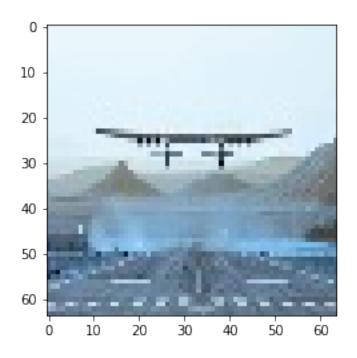


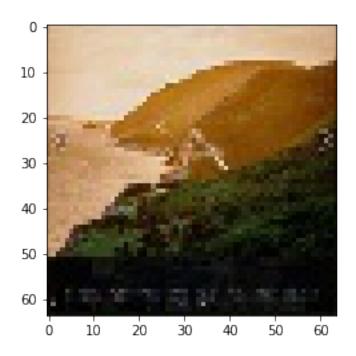


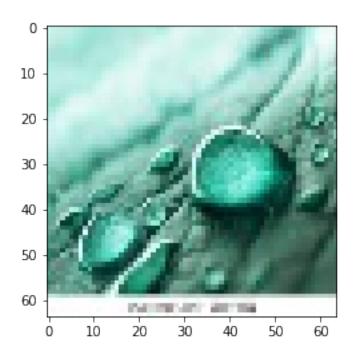


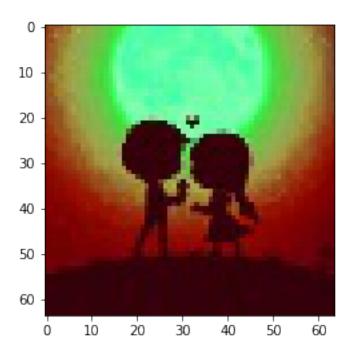


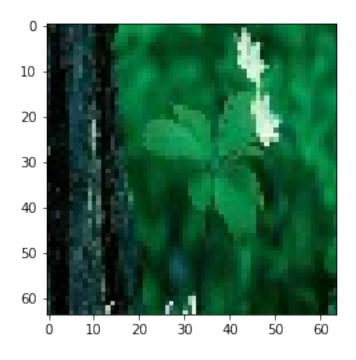


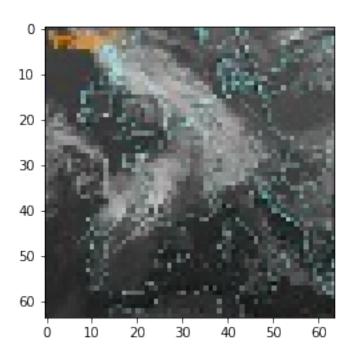


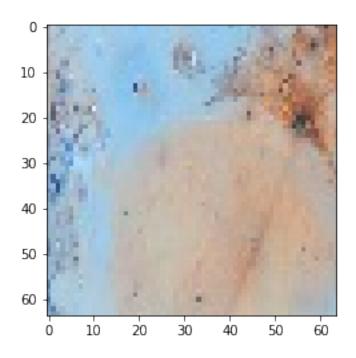


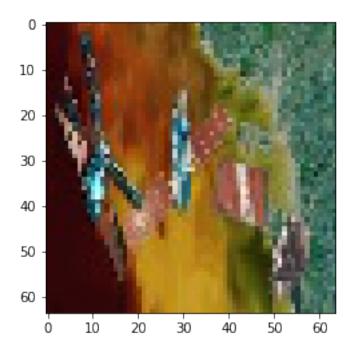






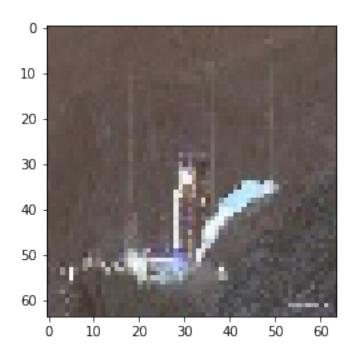


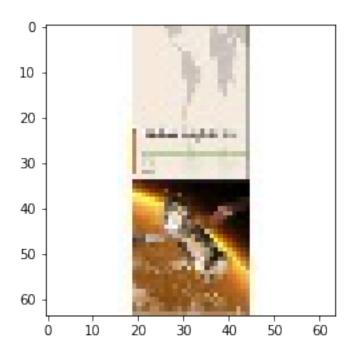


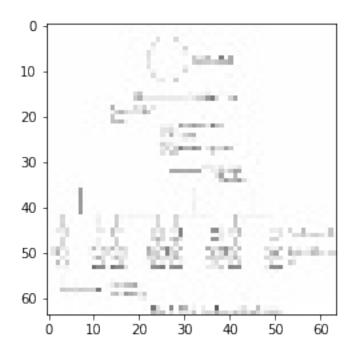


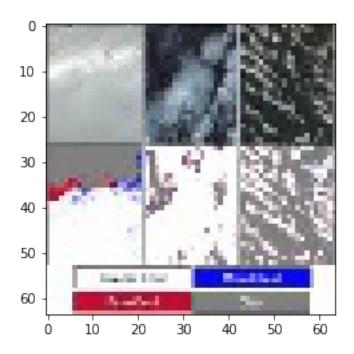
1.3 filtering specific satellites datasets

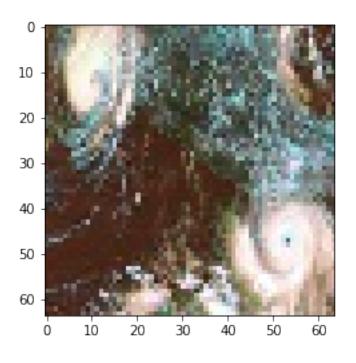
```
os.mkdir("./specific/Remote Sensing Satellite")
         except:
             print("directory exists")
         listspecific = []
         for i in range(0,catpd[1].shape[0]):
             try:
                 img =cv2.imread("./downloads/Remote Sensing Satellite - thumbnail/"+catpd[1].im
                 img = cv2.resize(img, (64,64), cv2.INTER_AREA)
                 img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
                 cv2.imwrite("./specific/Remote Sensing Satellite/"+str(i)+".jpg", img)
                 listspecific.append(img)
             except:
                 print("image not resizable")
         draw_imgs([listspecific])
directory exists
image not resizable
```

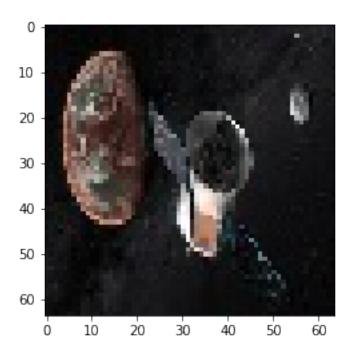


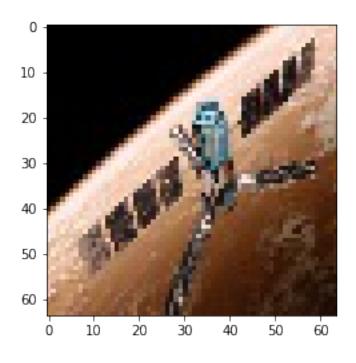


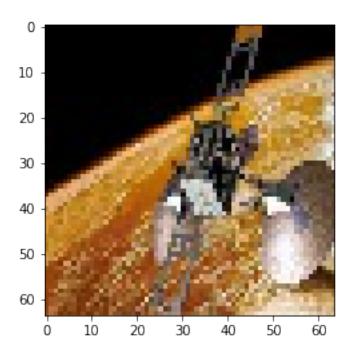


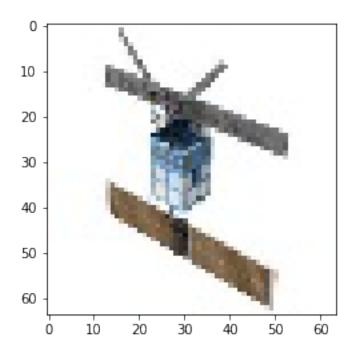


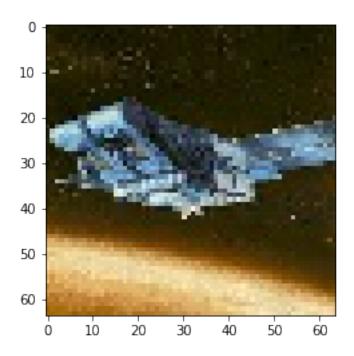


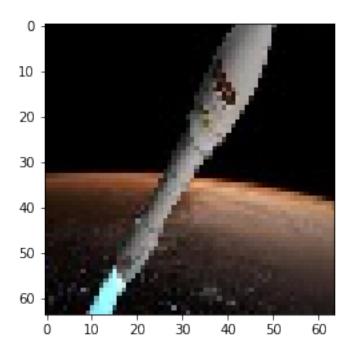




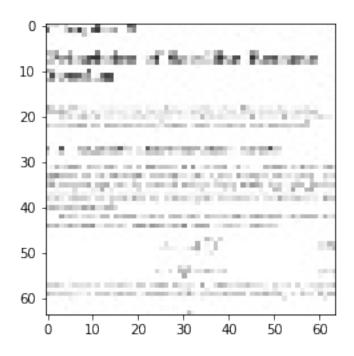


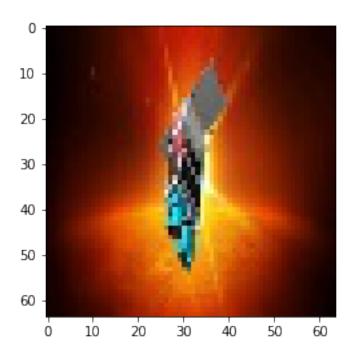


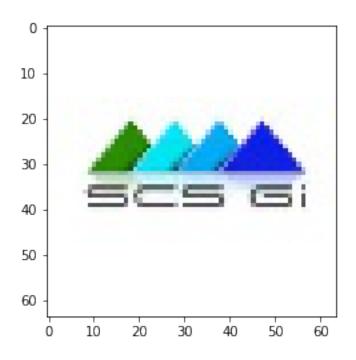


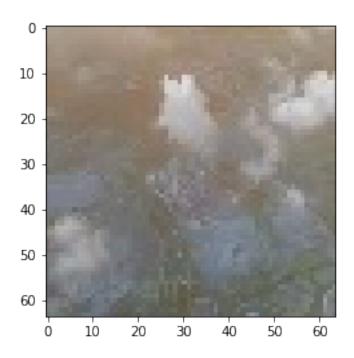


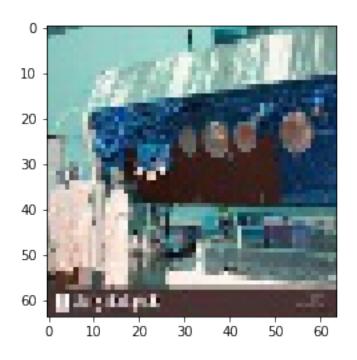
/home/franck/data/anaconda3/lib/python3.6/site-packages/matplotlib/pyplot.py:537: RuntimeWarning max_open_warning, RuntimeWarning)

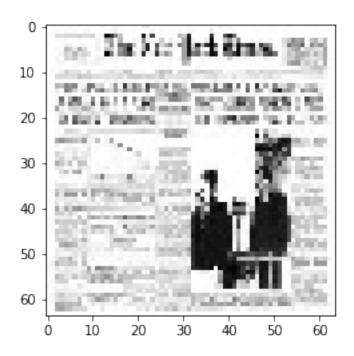


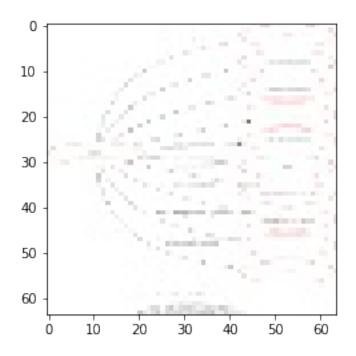


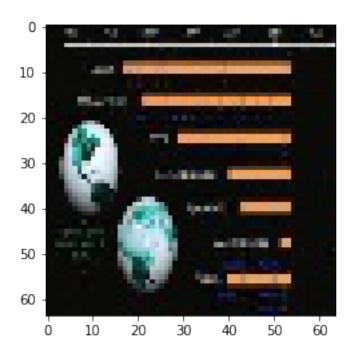


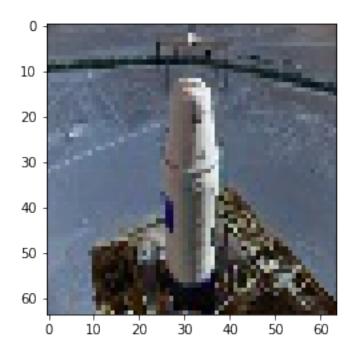


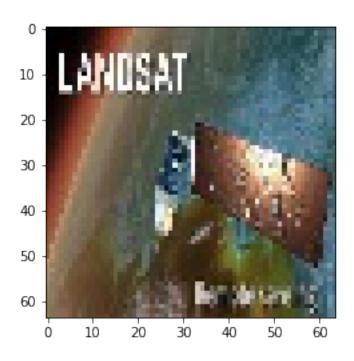


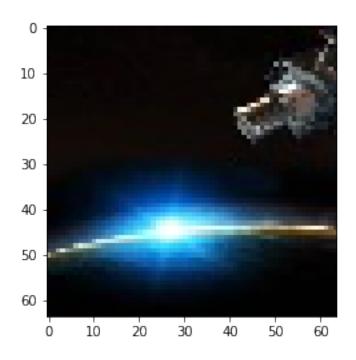


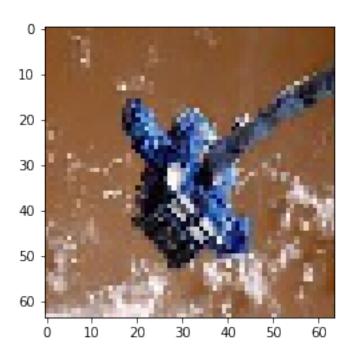


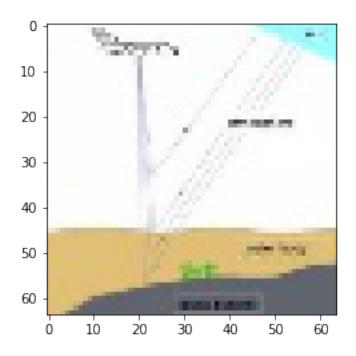


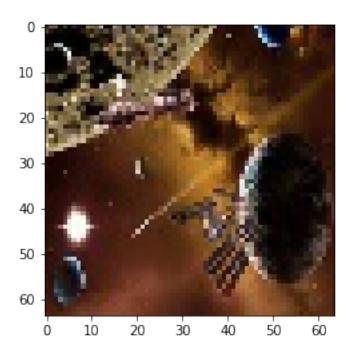


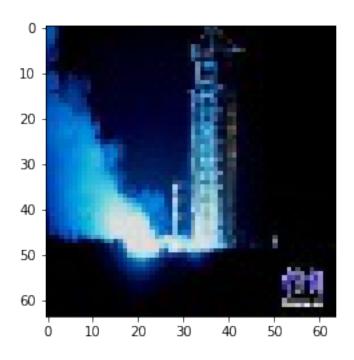


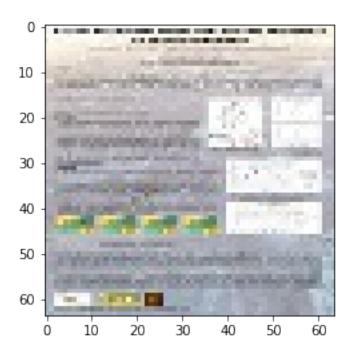


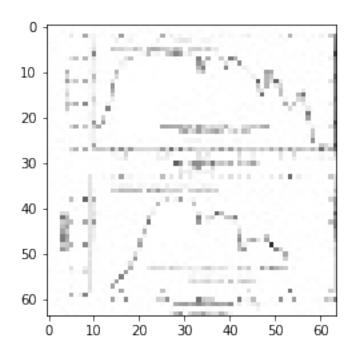


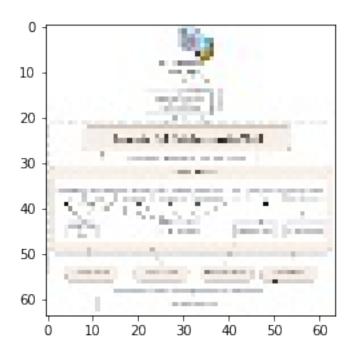


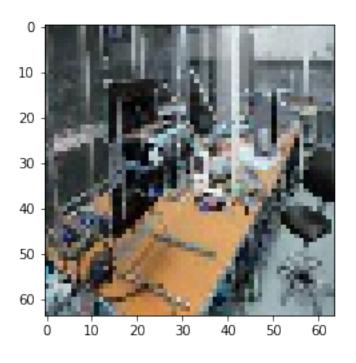


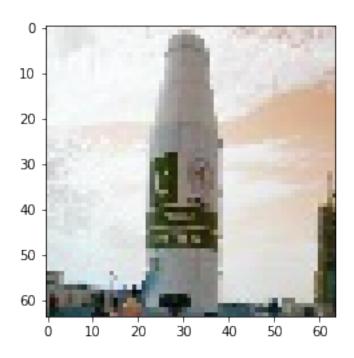


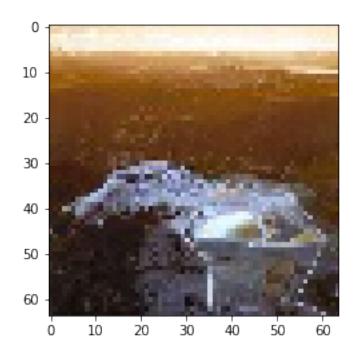






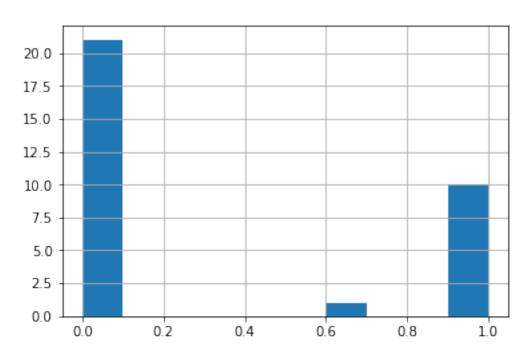






In [34]: pd.Series(specific_predictions.transpose()[0]).hist()

Out[34]: <matplotlib.axes._subplots.AxesSubplot at 0x7f83d74ced30>



It looks like filtering is not going to work properly so we're just leaving the specific data sets as downloaded

1.3.1 labelling specific satellite datasets

```
In [77]: try:
             os.mkdir("./labelling")
             os.mkdir("./labelling/train")
             os.mkdir("./labelling/test")
             os.mkdir("./labelling/valid")
             for cat in categories:
                 os.mkdir("./labelling/train/" + cat)
                 os.mkdir("./labelling/test/" + cat)
                 os.mkdir("./labelling/valid/" + cat)
         except:
             print("directory exists")
         listlabelling = []
         for j in range(0, len(categories)):
             for i in range(0,catpd[j].shape[0]):
                 try:
                     image = "./downloads/"+categories[j]+" - thumbnail/"+catpd[j].image_filenam
                     dstype = "train"
                     if i%3 == 1:
                         dstype = "test"
                     if i%3 == 2:
                         dstype = "valid"
                     dest = "./labelling/"+dstype+"/"+categories[j]+"/"+str(i)+".jpg"
                     img =cv2.imread(image)
                     img = cv2.resize(img, (244,244), cv2.INTER_AREA)
                     img = cv2.cvtColor(img, cv2.COLOR_BGR2RGB)
                     cv2.imwrite(dest, img)
                     #copyfile(image, dest)
                 except:
                     print("image not copied")
image not copied
```

```
image not copied
```

We want to use th VGG16 architexture but with only 13 classes

```
output_vgg16_conv = model_vgg16_conv(inputlayer)

#Add the fully-connected layers
x = Flatten(name='flatten')(output_vgg16_conv)
x = Dense(2048, activation='relu', name='fc1')(x)
x = Dense(512, activation='relu', name='fc2')(x)
x = Dense(13, activation='softmax', name='predictions')(x)

#Create the model
labelmodel = Model(input=inputlayer, output=x)

#In the summary, weights and layers from VGG part will be hidden, but they will be fit labelmodel.summary()
```

/home/franck/data/anaconda3/lib/python3.6/site-packages/keras/utils/conv_utils.py:82: FutureWarr return np.copy(kernel[slices])

Layer (type)	Output Shape Param #
input_8 (InputLayer)	(None, None, None, 3)
block1_conv1 (Conv2D)	(None, None, None, 64) 1792
block1_conv2 (Conv2D)	(None, None, None, 64) 36928
block1_pool (MaxPooling2D)	(None, None, 64) 0
block2_conv1 (Conv2D)	(None, None, 128) 73856
block2_conv2 (Conv2D)	(None, None, None, 128) 147584
block2_pool (MaxPooling2D)	(None, None, 128) 0
block3_conv1 (Conv2D)	(None, None, None, 256) 295168
block3_conv2 (Conv2D)	(None, None, None, 256) 590080
block3_conv3 (Conv2D)	(None, None, None, 256) 590080
block3_pool (MaxPooling2D)	(None, None, 256) 0
block4_conv1 (Conv2D)	(None, None, None, 512) 1180160
block4_conv2 (Conv2D)	(None, None, None, 512) 2359808
block4_conv3 (Conv2D)	(None, None, None, 512) 2359808

```
block4_pool (MaxPooling2D) (None, None, None, 512) 0

block5_conv1 (Conv2D) (None, None, None, 512) 2359808

block5_conv2 (Conv2D) (None, None, None, 512) 2359808

block5_conv3 (Conv2D) (None, None, None, 512) 2359808

block5_pool (MaxPooling2D) (None, None, None, 512) 0

Total params: 14,714,688

Trainable params: 14,714,688

Non-trainable params: 0
```

/home/franck/data/anaconda3/lib/python3.6/site-packages/ipykernel_launcher.py:26: UserWarning: U

```
Layer (type)
             Output Shape
                          Param #
______
image_input (InputLayer) (None, 244, 244, 3)
vgg16 (Model)
             multiple
                          14714688
flatten (Flatten)
           (None, 25088)
-----
fc1 (Dense)
              (None, 2048)
                          51382272
-----
fc2 (Dense)
              (None, 512)
                           1049088
           (None, 13)
predictions (Dense)
______
```

Total params: 67,152,717 Trainable params: 67,152,717 Non-trainable params: 0

```
class_mode='categorical')
    validation_label_generator = test_datagen.flow_from_directory(
        'labelling/valid',
        target_size=(244, 244),
        batch_size=32,
        class_mode='categorical')
Found 2606 images belonging to 13 classes.
Found 2594 images belonging to 13 classes.
In [88]: labelmodel.fit_generator(
        train_label_generator,
        steps_per_epoch=10,
        epochs=5,
        validation_data=validation_label_generator,
        validation_steps=5)
Epoch 1/5
Epoch 2/5
Epoch 3/5
Epoch 4/5
Epoch 5/5
Out[88]: <keras.callbacks.History at 0x7f8407cfeba8>
```

By looking at the evolution of the accuracy (and validation accuracy) the network is not learning properly

some overfitting occurs.

We need to improve the quality and quantity of images in the datasets of the different categories to be able

to get a better annotation model.