```
 1 import tensorflow as tf
 2 from tensorflow.keras.callbacks import
   LearningRateScheduler
 3 from tensorflow.keras.layers import Dense,  Conv2D,
   MaxPooling2D, Dropout, Flatten,
   GlobalAveragePooling2D
 4 from tensorflow.keras.optimizers import Adam, SGD,
   RMSprop
 5 from tensorflow.keras.preprocessing.image import
   ImageDataGenerator
 6 from tensorflow.keras.callbacks import Callback
 7 import numpy as np
 8 import matplotlib.pyplot as plt
 9 import os
10 from os.path import join
11 import multiprocessing
12 from sklearn.metrics import confusion_matrix
13
14 def trainCNN( ):
15
16     tf.keras.backend.clear_session()
17
18     ImageResolution = (640, 360)
19     ImageResolutionGrayScale = (640, 360, 1)
20     modelNumber = 'Model22'
21
22     base_dir = 'C:\work_dir\meteorData\extraData'
23     results_dir_weights = 'G:\GIEyA\TFG\
   meteor_classification\\results\weights\\' +
   modelNumber
24
25     train_dir = join(base_dir, 'train')
26     validation_dir = join(base_dir, 'validation')
27     test_dir = join(base_dir, 'test')
28
29     #Rescale all images by 1./255
30
31     train_datagen = ImageDataGenerator(rescale=1.0/
   255#,
32                                        #
   rotation_range=10, # Range from 0 to 180 degrees to
   randomly rotate images
33                                        #
   width_shift_range=0.05,
```

```
34                                                  #
   height_shift_range=0.05,
35                                                  #shear_range=5
   , # Shear the image by 5 degrees
36                                                  #zoom_range=0.
   1,
37                                                  #
   horizontal_flip=True,
38                                                  #vertical_flip
   =True,
39                                                  #fill_mode='
   nearest'
40                                                  )
41
42      validation_datagen = ImageDataGenerator(rescale=1
   .0/255.)
43      test_datagen = ImageDataGenerator(rescale=1.0/255
   .0)
44
45      train_generator = train_datagen.
   flow_from_directory(train_dir,
46
        batch_size=16, #16
47
        class_mode='binary',
48
        color_mode='grayscale',
49
        target_size=ImageResolution) # 640x360 = 480x480
   . (640, 360)
50
51      validation_generator = validation_datagen.
   flow_from_directory(validation_dir,
52
                batch_size=16, #16
53
                class_mode='binary',
54
                color_mode='grayscale',
55
                target_size=ImageResolution)
56
57      test_generator = test_datagen.flow_from_directory
   (test_dir,
```

```
58
    batch_size=1,
59
    class_mode='binary',
60
    color_mode='grayscale',
61
    target_size=ImageResolution,
62
    shuffle=False)
63
64      model = tf.keras.models.Sequential([
65          Conv2D(16, (11, 11), activation='relu',
   input_shape=ImageResolutionGrayScale, strides=1),
66          MaxPooling2D(pool_size=(3, 3)),
67          Dropout(0.25),
68
69          Conv2D(16, (7, 7), activation='relu',
   kernel_initializer='he_uniform'),
70          #Conv2D(12, (3, 3), activation='relu',
   kernel_initializer='he_uniform'),
71          MaxPooling2D(pool_size=(3, 3)),
72          Dropout(0.25),
73
74          Conv2D(12, (5, 5), activation='relu',
   kernel_initializer='he_uniform'),
75          #Conv2D(16, (3, 3), activation='relu',
   kernel_initializer='he_uniform'),
76          MaxPooling2D(pool_size=(2, 2)),
77          Dropout(0.25),
78
79          Conv2D(8, (3, 3), activation='relu',
   kernel_initializer='he_uniform'),
80          MaxPooling2D(pool_size=(2, 2)),
81
82          Flatten(),
83          Dense(840, activation='relu',
   kernel_initializer='he_uniform'),
84          Dropout(0.30),
85          Dense(32, activation='relu',
   kernel_initializer='he_uniform'),
86          Dropout(0.20),
87          Dense(1, activation='sigmoid',
   kernel_initializer='he_uniform')
```

```
 88      ])
 89
 90      print(model.summary())
 91      optimizer = Adam(learning_rate=5e-4) #3e-3 # Try
     with more and less learning rate # 5e-3
 92      model.compile(optimizer=optimizer,
 93                    loss='binary_crossentropy',
 94                    metrics=['accuracy'])
 95      #model.load_weights(join(results_dir_weights, '
    model_acc_0.926.h5'))
 96
 97      class SaveModelCallback(Callback):
 98          def __init__(self, thresholdTrain,
    thresholdValid):
 99              super(SaveModelCallback, self).__init__
    ()
100              self.thresholdTrain = thresholdTrain
101              self.thresholdValid = thresholdValid
102
103          def on_epoch_end(self, epoch, logs=None):
104              if((logs.get('accuracy') >= self.
    thresholdTrain) and (logs.get('val_accuracy') >=
    self.thresholdValid)):
105                  model.save_weights(join(
    results_dir_weights, modelNumber + '_acc_' +  str(
    logs.get('accuracy'))[0:6] + '_val_acc' + str(logs.
    get('val_accuracy'))[0:6] + '.h5'), save_format='h5'
    )
106
107      callback90 = SaveModelCallback(0.900, 0.900)
108
109      # Training -> 66947
110      # Validation -> 13388
111      # Test -> 8928
112
113      history = model.fit(train_generator,
114                          validation_data=
    validation_generator,
115                          steps_per_epoch=4184, #4184
116                          epochs=120, #Later train
    with more epochs if neccessary
117                          validation_steps=836, #836
118                          verbose=1,
119                          callbacks=[callback90])
```

```
120
121
    ##################################################
    ########################################
122
    ##################################################
    ########################################
123
124     prob_predicted = model.predict(test_generator,
    steps=len(test_generator.filenames))
125     test_labels = []
126
127     for i in range(0, len(test_generator.filenames
    )):
128         test_labels.extend(np.array(test_generator[i
    ][1]))
129
130     # Get the confusion matrix:
131     truePositives = 0
132     trueNegatives = 0
133     falsePositives = 0
134     falseNegatives = 0
135
136     for i in range(len(prob_predicted)):
137         if(prob_predicted[i] >= 0.5 and test_labels[
    i] == 1.0):
138             truePositives += 1
139         elif(prob_predicted[i] >= 0.5 and
    test_labels[i] == 0.0):
140             falsePositives += 1
141         elif(test_labels[i] == 0.0):
142             trueNegatives += 1
143         elif(test_labels[i] == 1.0):
144             falseNegatives += 1
145
146     performanceFile = open(join(results_dir_weights
    , 'performance' + modelNumber + '.txt'), 'w')
147     performanceFile.write(
    '*****************************************\n')
148     performanceFile.write('confusion matrix: \n')
149     performanceFile.write('true positives: {}\n'.
    format(truePositives))
150     performanceFile.write('false positives: {}\n'.
    format(falsePositives))
```

```
151     performanceFile.write('true negatives: {}\n'.
    format(trueNegatives))
152     performanceFile.write('false negatives: {}\n'.
    format(falseNegatives))
153     performanceFile.write(
    '*****************************************\n')
154 
155     modelPrecision = (truePositives) / (
    truePositives + falsePositives)
156     modelRecall = (truePositives) / (truePositives
     + falseNegatives)
157     modelF1score = (2 * (modelPrecision *
    modelRecall)) / (modelPrecision + modelRecall)
158 
159     performanceFile.write(
    '*****************************************\n')
160     performanceFile.write('Performance metrics: \n')
161     performanceFile.write('Model Precision: {}\n'.
    format(modelPrecision))
162     performanceFile.write('Model Recall: {}\n'.
    format(modelRecall))
163     performanceFile.write('Model F1 Score: {}\n'.
    format(modelF1score))
164     performanceFile.write(
    '*****************************************\n')
165 
166     performanceFile.close()
167 
168 
    ##################################################
    ########################################
169 
    ##################################################
    ########################################
170 
171     acc      = history.history['accuracy']
172     val_acc  = history.history['val_accuracy']
173     loss     = history.history['loss']
174     val_loss = history.history['val_loss']
175     epochs = range(len(acc)) #Get number of epochs
176 
177     plt.plot(epochs, acc)
178     plt.plot(epochs, val_acc)
179     plt.title('Meteor detection training and
```

```
179 validation accuracy')
180
181     plt.figure()
182     plt.plot(epochs, loss)
183     plt.plot(epochs, val_loss)
184     plt.title('Meteor detection training and
    validation loss')
185
186     plt.show()
187
188
189 if __name__ == '__main__':
190     p = multiprocessing.Process(target=trainCNN)
191     p.start()
192     p.join()
193
194
```