CNN

April 16, 2023

0.1 Train and Deploy a CNN Model Using TensorFlow Serving

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[1]: import numpy as np
     import pandas as pd
     import keras
     from tqdm import tqdm
     import os
     from sklearn.model_selection import train_test_split
     import cv2
     from PIL import Image
     import tensorflow as tf
     from matplotlib import pyplot as plt
     from keras.layers import Dense, Dropout, Flatten, Input
     from keras.preprocessing.image import ImageDataGenerator
     from tensorflow.keras.utils import img_to_array, array_to_img, load_img
     from keras.preprocessing import image
     from keras.utils import plot_model
     from keras.models import Model
     from keras.layers.convolutional import Conv2D
     from keras.layers.pooling import MaxPooling2D
     from numpy import array
[2]: train = pd.read_csv('trainLabels.csv')
[3]: train.tail()
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[4]: targets_series = pd.Series(train['level'])
     one_hot = pd.get_dummies(targets_series, sparse = True)
     targets_series[:10]
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[5]: one_hot[:10]
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[6]: one_hot_labels = np.asarray(one_hot)
     one_hot_labelsY = np.asarray(targets_series)
     one_hot_labelsY[:10]
[6]: array([0, 0, 0, 0, 3, 3, 0, 0, 0, 1], dtype=int64)
[7]: im_size1 = 224
     im_size2 = 224
     x_train = []
     y_train = []
[8]: i = 0
     for f, breed in tqdm(train.values):
         print(f)
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 [9]: test = train[:1000]
      len(train)
 [9]: 1427
[10]: # Set the target size to a smaller value
      target_size = (224, 224)
      # Iterate over each image in the test set
      for f in tqdm(test.values):
          try:
              # Load the image using the correct path
              img = load_img('9804_left.jpeg'.format(f), target_size=target_size)
              arr = img_to_array(img)
```

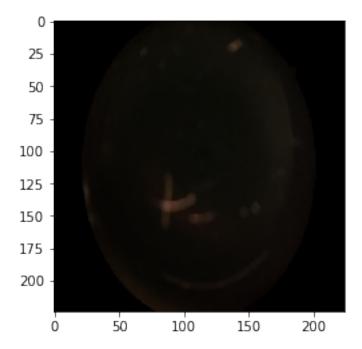
```
label = one_hot_labelsY[i]
  x_train.append(arr)
  y_train.append(label)
  i += 1
except:
  pass
```

100% | 1000/1000 [00:02<00:00, 377.29it/s]

[11]: len(x_train)

[11]: 1000

[12]: plt.imshow(x_train[681]/255) #681 > Try some other number too plt.show()



pool2 = MaxPooling2D(pool_size=(2, 2))(conv2)

```
flat = Flatten()(pool2)
     hidden1 = Dense(10, activation='relu')(flat)
     output = Dense(1, activation='sigmoid')(hidden1)
     model = Model(inputs=visible, outputs=output)
[15]: y_train_raw = np.array(Y_train)
     x_train_raw = np.array(X_train)
[21]: model.summary()
    Model: "sequential"
     Layer (type)
                              Output Shape
                                                     Param #
    ______
     conv2d_2 (Conv2D)
                              (None, 783, 783, 32)
                                                     1568
     max_pooling2d_2 (MaxPooling (None, 391, 391, 32)
     2D)
     conv2d_3 (Conv2D)
                              (None, 388, 388, 64)
                                                     32832
     max_pooling2d_3 (MaxPooling (None, 194, 194, 64)
     2D)
     conv2d_4 (Conv2D)
                              (None, 191, 191, 128)
                                                     131200
     max_pooling2d_4 (MaxPooling (None, 95, 95, 128)
                                                     0
     2D)
                              (None, 1155200)
     flatten_1 (Flatten)
     dense_2 (Dense)
                              (None, 256)
                                                     295731456
     dropout (Dropout)
                              (None, 256)
     dense 3 (Dense)
                              (None, 5)
                                                     1285
    Total params: 295,898,341
    Trainable params: 295,898,341
    Non-trainable params: 0
     ._____
[22]: # Convert labels to integers and adjust the label range
     y_train_raw = y_train_raw.astype(np.int32)
     y_train_raw -= y_train_raw.min()
```

```
# Define the model
     model = keras.models.Sequential([
        keras.layers.Conv2D(32, kernel_size=4, activation='relu', input_shape=(224,__
      4224, 3)),
        keras.layers.MaxPooling2D(pool_size=(2, 2)),
        keras.layers.Conv2D(64, kernel size=4, activation='relu'),
        keras.layers.MaxPooling2D(pool_size=(2, 2)),
        keras.layers.Conv2D(128, kernel size=4, activation='relu'),
        keras.layers.MaxPooling2D(pool_size=(2, 2)),
        keras.layers.Flatten(),
        keras.layers.Dense(256, activation='relu'),
        keras.layers.Dropout(0.5),
        keras.layers.Dense(5, activation='softmax')
     ])
     # Compile the model
     model.compile(optimizer='adam', loss='sparse_categorical_crossentropy', __
      →metrics=['accuracy'])
[23]: x_valid_raw = np.array(X_valid)
     y_valid_raw = np.array(Y_valid)
[24]: # Define the callback to stop training once the desired accuracy is reached
     class StopTrainingAtAccuracy(keras.callbacks.Callback):
        def __init__(self, target_accuracy):
            super(StopTrainingAtAccuracy, self).__init__()
            self.target_accuracy = target_accuracy
        def on_epoch_end(self, epoch, logs=None):
            if logs is None:
               logs = {}
            if logs.get('val_accuracy') >= self.target_accuracy:
               self.model.stop_training = True
               print(f"\nReached {self.target_accuracy*100:.2f}% validation_
      →accuracy. Stopping training...\n")
[25]: history = model.fit(x_train_raw, y_train_raw, epochs=10,__
      →validation_data=(x_valid_raw, y_valid_raw),
                      callbacks=[StopTrainingAtAccuracy(0.80)])
    Epoch 1/10
    0.6467 - val_loss: 0.8418 - val_accuracy: 0.7500
    Epoch 2/10
    0.7244 - val_loss: 0.9085 - val_accuracy: 0.7500
    Epoch 3/10
```

```
0.7244 - val_loss: 0.8464 - val_accuracy: 0.7500
  Epoch 4/10
  0.7244 - val_loss: 0.8282 - val_accuracy: 0.7500
  Epoch 5/10
  0.7244 - val_loss: 0.8335 - val_accuracy: 0.7500
  Epoch 6/10
  0.7244 - val_loss: 0.8301 - val_accuracy: 0.7500
  Epoch 7/10
  0.7244 - val_loss: 0.8349 - val_accuracy: 0.7500
  Epoch 8/10
  29/29 [=========== ] - 103s 4s/step - loss: 0.9315 - accuracy:
  0.7244 - val_loss: 0.8551 - val_accuracy: 0.7500
  Epoch 9/10
  0.7244 - val_loss: 0.8299 - val_accuracy: 0.7500
  Epoch 10/10
  0.7244 - val_loss: 0.8310 - val_accuracy: 0.7500
[]:
```