```
In [1]:
        import numpy as np
         import pandas as pd
         import matplotlib.pyplot as plt
         import tensorflow as tf
        from tensorflow import keras
         import seaborn as sns
In [2]:
        from tensorflow.keras.layers import Input, Lambda, Dense, Flatten
        from tensorflow.keras.models import Model
         from tensorflow.keras.applications.resnet50 import ResNet50, preprocess input
         from tensorflow.keras.preprocessing import image
        from tensorflow.keras.preprocessing.image import ImageDataGenerator, load img
         from tensorflow.keras.models import Sequential
         import numpy as np
        from glob import glob
         import matplotlib.pyplot as plt
In [3]:
        train Path = r'C:\Users\anshul\Desktop\MS\Subjects\Spring 2022\Data Analytics\FINAL PRO
        test Path = r'C:\Users\anshul\Desktop\MS\Subjects\Spring 2022\Data Analytics\FINAL PROJ
In [4]:
        # Set Resize variable
        IMAGE_SIZE = [224, 224] # This is my desired image size... and also ResNet50 accepts im
In [5]:
         resnet = ResNet50(
            input shape = IMAGE SIZE + [3], # Making the image into 3 Channel, so concating 3.
            weights = 'imagenet', # Default weights.
            include top = False
         )
In [6]:
        resnet.summary()
        Model: "resnet50"
         Layer (type)
                                      Output Shape
                                                          Param #
                                                                     Connected to
        ______
```

input\_1 (InputLayer) [(None, 224, 224, 3 0 [] )] ['input\_1[0][0]'] conv1 pad (ZeroPadding2D) (None, 230, 230, 3) 0 (None, 112, 112, 64 9472 conv1 conv (Conv2D) ['conv1\_pad[0][0]'] ) conv1 bn (BatchNormalization) (None, 112, 112, 64 256 ['conv1 conv[0][0]'] conv1\_relu (Activation) (None, 112, 112, 64 0 ['conv1 bn[0][0]']

```
pool1 pad (ZeroPadding2D)
                                (None, 114, 114, 64
                                                                  ['conv1 relu[0][0]']
                                                                  ['pool1 pad[0][0]']
pool1 pool (MaxPooling2D)
                                (None, 56, 56, 64)
                                                     0
conv2_block1_1_conv (Conv2D)
                                (None, 56, 56, 64)
                                                     4160
                                                                  ['pool1_pool[0][0]']
conv2 block1 1 bn (BatchNormal (None, 56, 56, 64)
                                                                  ['conv2_block1_1_conv
                                                     256
[0][0]
ization)
conv2_block1_1_relu (Activatio (None, 56, 56, 64) 0
                                                                  ['conv2_block1_1_bn[0]
[0]']
n)
conv2_block1_2_conv (Conv2D)
                                (None, 56, 56, 64)
                                                     36928
                                                                  ['conv2_block1_1_relu
[0][0]']
conv2 block1 2 bn (BatchNormal
                                (None, 56, 56, 64)
                                                     256
                                                                  ['conv2 block1 2 conv
[0][0]']
ization)
conv2 block1 2 relu (Activatio (None, 56, 56, 64) 0
                                                                  ['conv2 block1 2 bn[0]
[0]']
n)
conv2 block1 0 conv (Conv2D)
                                (None, 56, 56, 256) 16640
                                                                  ['pool1 pool[0][0]']
conv2_block1_3_conv (Conv2D)
                                (None, 56, 56, 256)
                                                                  ['conv2_block1_2_relu
                                                     16640
[0][0]']
conv2 block1 0 bn (BatchNormal
                                (None, 56, 56, 256)
                                                      1024
                                                                  ['conv2 block1 0 conv
[0][0]
ization)
conv2_block1_3_bn (BatchNormal (None, 56, 56, 256) 1024
                                                                  ['conv2 block1 3 conv
[0][0]']
ization)
conv2 block1 add (Add)
                                (None, 56, 56, 256) 0
                                                                  ['conv2_block1_0_bn[0]
[0]',
                                                                   'conv2_block1_3_bn[0]
[0]']
conv2 block1 out (Activation) (None, 56, 56, 256) 0
                                                                  ['conv2 block1 add[0]
[0]']
conv2 block2 1 conv (Conv2D)
                                (None, 56, 56, 64)
                                                     16448
                                                                  ['conv2 block1 out[0]
[0]']
conv2 block2 1 bn (BatchNormal (None, 56, 56, 64)
                                                     256
                                                                  ['conv2 block2 1 conv
[0][0]']
ization)
conv2 block2 1 relu (Activatio (None, 56, 56, 64) 0
                                                                  ['conv2 block2 1 bn[0]
[0]']
n)
conv2_block2_2_conv (Conv2D)
                                (None, 56, 56, 64)
                                                     36928
                                                                  ['conv2_block2_1_relu
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[0][0]']
conv2_block2_2_bn (BatchNormal (None, 56, 56, 64) 256
                                                                 ['conv2_block2_2_conv
[0][0]']
ization)
conv2 block2 2 relu (Activatio (None, 56, 56, 64) 0
                                                                 ['conv2_block2_2_bn[0]
[0]']
n)
conv2_block2_3_conv (Conv2D)
                                (None, 56, 56, 256) 16640
                                                                 ['conv2_block2_2_relu
[0][0]']
conv2_block2_3_bn (BatchNormal (None, 56, 56, 256) 1024
                                                                 ['conv2_block2_3_conv
[0][0]']
ization)
                                (None, 56, 56, 256) 0
conv2_block2_add (Add)
                                                                 ['conv2_block1_out[0]
[0]',
                                                                  'conv2 block2 3 bn[0]
[0]']
conv2 block2 out (Activation) (None, 56, 56, 256) 0
                                                                 ['conv2 block2 add[0]
[0]']
conv2_block3_1_conv (Conv2D)
                                (None, 56, 56, 64)
                                                     16448
                                                                 ['conv2_block2_out[0]
[0]']
conv2 block3 1 bn (BatchNormal (None, 56, 56, 64)
                                                     256
                                                                 ['conv2_block3_1_conv
[0][0]
ization)
conv2 block3 1 relu (Activatio (None, 56, 56, 64) 0
                                                                 ['conv2 block3 1 bn[0]
[0]']
n)
conv2_block3_2_conv (Conv2D)
                                (None, 56, 56, 64)
                                                     36928
                                                                 ['conv2_block3_1_relu
[0][0]']
conv2_block3_2_bn (BatchNormal (None, 56, 56, 64) 256
                                                                 ['conv2_block3_2_conv
[0][0]']
ization)
conv2 block3 2 relu (Activatio (None, 56, 56, 64) 0
                                                                 ['conv2 block3 2 bn[0]
[0]']
n)
conv2_block3_3_conv (Conv2D)
                                (None, 56, 56, 256) 16640
                                                                 ['conv2_block3_2_relu
[0][0]']
conv2_block3_3_bn (BatchNormal (None, 56, 56, 256) 1024
                                                                 ['conv2_block3_3_conv
[0][0]
ization)
conv2_block3_add (Add)
                                (None, 56, 56, 256) 0
                                                                 ['conv2_block2_out[0]
[0]',
                                                                   'conv2 block3 3 bn[0]
[0]']
conv2 block3 out (Activation) (None, 56, 56, 256) 0
                                                                 ['conv2_block3_add[0]
```

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[0]'] conv3\_block1\_1\_conv (Conv2D) (None, 28, 28, 128) 32896 ['conv2\_block3\_out[0] [0]'] conv3\_block1\_1\_bn (BatchNormal (None, 28, 28, 128) 512 ['conv3\_block1\_1\_conv [0][0] ization) conv3 block1 1 relu (Activatio (None, 28, 28, 128) 0 ['conv3 block1 1 bn[0] [0]'] n) conv3\_block1\_2\_conv (Conv2D) (None, 28, 28, 128) 147584 ['conv3\_block1\_1\_relu [0][0] conv3 block1 2 bn (BatchNormal (None, 28, 28, 128) 512 ['conv3\_block1\_2\_conv [0][0]'] ization) conv3 block1 2 relu (Activatio (None, 28, 28, 128) 0 ['conv3\_block1\_2\_bn[0] [0]'] n) conv3\_block1\_0\_conv (Conv2D) (None, 28, 28, 512) 131584 ['conv2 block3 out[0] [0]'] conv3\_block1\_3\_conv (Conv2D) (None, 28, 28, 512) 66048 ['conv3 block1 2 relu [0][0]'] conv3 block1 0 bn (BatchNormal (None, 28, 28, 512) 2048 ['conv3\_block1\_0\_conv [0][0]'] ization) conv3\_block1\_3\_bn (BatchNormal (None, 28, 28, 512) 2048 ['conv3\_block1\_3\_conv [0][0] ization) conv3 block1 add (Add) ['conv3 block1 0 bn[0] (None, 28, 28, 512) 0 [0]', 'conv3\_block1\_3\_bn[0] [0]'] conv3 block1 out (Activation) (None, 28, 28, 512) 0 ['conv3\_block1\_add[0] [0]'] conv3 block2 1 conv (Conv2D) (None, 28, 28, 128) 65664 ['conv3 block1 out[0] [0]'] conv3\_block2\_1\_bn (BatchNormal (None, 28, 28, 128) 512 ['conv3\_block2\_1\_conv [0][0]'] ization) conv3 block2 1 relu (Activatio (None, 28, 28, 128) 0 ['conv3 block2 1 bn[0] [0]'] n)

(None, 28, 28, 128) 147584

conv3\_block2\_2\_conv (Conv2D)

[0][0]']

['conv3\_block2\_1\_relu

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conv3 block2 2 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3 block2 2 conv
[0][0]
ization)
conv3 block2 2 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block2 2 bn[0]
[0]']
n)
conv3_block2_3_conv (Conv2D)
                                (None, 28, 28, 512) 66048
                                                                 ['conv3_block2_2_relu
[0][0]
conv3 block2 3 bn (BatchNormal (None, 28, 28, 512) 2048
                                                                 ['conv3 block2 3 conv
[0][0]
ization)
conv3 block2 add (Add)
                                (None, 28, 28, 512) 0
                                                                 ['conv3_block1_out[0]
[0]',
                                                                  'conv3_block2_3_bn[0]
[0]']
conv3 block2 out (Activation) (None, 28, 28, 512) 0
                                                                 ['conv3_block2_add[0]
[0]']
conv3 block3 1 conv (Conv2D)
                                (None, 28, 28, 128) 65664
                                                                 ['conv3 block2 out[0]
[0]']
conv3_block3_1_bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3_block3_1_conv
[0][0]']
ization)
conv3 block3 1 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block3 1 bn[0]
[0]']
n)
conv3_block3_2_conv (Conv2D)
                               (None, 28, 28, 128) 147584
                                                                 ['conv3_block3_1_relu
[0][0]']
conv3 block3 2 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3 block3 2 conv
[0][0]]
ization)
conv3 block3 2 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block3 2 bn[0]
[0]']
n)
conv3 block3 3 conv (Conv2D)
                                (None, 28, 28, 512) 66048
                                                                 ['conv3 block3 2 relu
[0][0]]
conv3 block3 3 bn (BatchNormal (None, 28, 28, 512) 2048
                                                                 ['conv3 block3 3 conv
[0][0]']
ization)
conv3_block3_add (Add)
                                (None, 28, 28, 512) 0
                                                                 ['conv3_block2_out[0]
[0]',
                                                                  'conv3_block3_3_bn[0]
[0]']
conv3_block3_out (Activation) (None, 28, 28, 512) 0
                                                                 ['conv3_block3_add[0]
[0]']
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conv3_block4_1_conv (Conv2D)
                                (None, 28, 28, 128) 65664
                                                                 ['conv3_block3_out[0]
[0]']
conv3_block4_1_bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3_block4_1_conv
[0][0]
ization)
conv3_block4_1_relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3_block4_1_bn[0]
[0]']
n)
conv3_block4_2_conv (Conv2D)
                                (None, 28, 28, 128) 147584
                                                                 ['conv3_block4_1_relu
[0][0]']
conv3 block4 2 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3 block4 2 conv
[0][0]
ization)
conv3 block4 2 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block4 2 bn[0]
[0]']
n)
conv3 block4 3 conv (Conv2D)
                                (None, 28, 28, 512) 66048
                                                                 ['conv3 block4 2 relu
[0][0]']
conv3_block4_3_bn (BatchNormal (None, 28, 28, 512) 2048
                                                                 ['conv3_block4_3_conv
[0][0]']
ization)
conv3_block4_add (Add)
                                (None, 28, 28, 512) 0
                                                                 ['conv3_block3_out[0]
[0]',
                                                                  'conv3_block4_3_bn[0]
[0]']
conv3_block4_out (Activation) (None, 28, 28, 512) 0
                                                                 ['conv3_block4_add[0]
[0]']
conv4 block1 1 conv (Conv2D)
                                (None, 14, 14, 256)
                                                   131328
                                                                 ['conv3 block4 out[0]
[0]']
conv4 block1 1 bn (BatchNormal (None, 14, 14, 256) 1024
                                                                 ['conv4_block1_1_conv
[0][0]
ization)
conv4_block1_1_relu (Activatio (None, 14, 14, 256) 0
                                                                 ['conv4_block1_1_bn[0]
[0]']
n)
conv4 block1 2 conv (Conv2D)
                                (None, 14, 14, 256) 590080
                                                                 ['conv4 block1 1 relu
[0][0]']
conv4 block1 2 bn (BatchNormal (None, 14, 14, 256) 1024
                                                                 ['conv4 block1 2 conv
[0][0]']
ization)
conv4_block1_2_relu (Activatio (None, 14, 14, 256) 0
                                                                 ['conv4_block1_2_bn[0]
[0]']
n)
                                (None, 14, 14, 1024 525312
conv4 block1 0 conv (Conv2D)
                                                                 ['conv3_block4_out[0]
```

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[0]']
                                )
conv4_block1_3_conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4_block1_2_relu
[0][0]
                                )
conv4_block1_0_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block1_0_conv
[0][0]']
ization)
conv4_block1_3_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block1_3_conv
[0][0]']
ization)
                                )
conv4_block1_add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block1_0_bn[0]
[0]',
                                )
                                                                   'conv4_block1_3_bn[0]
[0]']
conv4_block1_out (Activation) (None, 14, 14, 1024 0
                                                                  ['conv4_block1_add[0]
[0]']
                                )
conv4_block2_1_conv (Conv2D)
                                (None, 14, 14, 256) 262400
                                                                  ['conv4_block1_out[0]
[0]']
conv4 block2 1 bn (BatchNormal (None, 14, 14, 256)
                                                     1024
                                                                  ['conv4 block2 1 conv
[0][0]
ization)
conv4_block2_1_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block2_1_bn[0]
[0]']
n)
conv4_block2_2_conv (Conv2D)
                                (None, 14, 14, 256)
                                                     590080
                                                                  ['conv4_block2_1_relu
[0][0]
conv4 block2 2 bn (BatchNormal
                                                      1024
                                (None, 14, 14, 256)
                                                                  ['conv4_block2_2_conv
[0][0]']
ization)
conv4_block2_2_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block2_2_bn[0]
[0]']
n)
conv4 block2 3 conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4 block2 2 relu
[0][0]']
                                )
conv4_block2_3_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block2_3_conv
[0][0]
ization)
conv4_block2_add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block1_out[0]
[0]',
                                                                   'conv4_block2_3_bn[0]
                                )
[0]']
conv4_block2_out (Activation) (None, 14, 14, 1024 0
                                                                  ['conv4_block2_add[0]
```

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[0]']
                                )
conv4_block3_1_conv (Conv2D)
                                (None, 14, 14, 256) 262400
                                                                  ['conv4_block2_out[0]
[0]']
conv4 block3 1 bn (BatchNormal
                                (None, 14, 14, 256)
                                                      1024
                                                                  ['conv4 block3 1 conv
[0][0]']
ization)
conv4 block3 1 relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block3_1_bn[0]
[0]']
n)
conv4 block3 2 conv (Conv2D)
                                (None, 14, 14, 256)
                                                     590080
                                                                  ['conv4 block3 1 relu
[0][0]']
conv4_block3_2_bn (BatchNormal (None, 14, 14, 256)
                                                                  ['conv4_block3_2_conv
                                                     1024
[0][0]
ization)
conv4_block3_2_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block3_2_bn[0]
[0]']
n)
conv4_block3_3_conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4_block3_2_relu
[0][0]']
                                )
conv4 block3 3 bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block3_3_conv
[0][0]']
ization)
                                )
                                (None, 14, 14, 1024 0
conv4 block3 add (Add)
                                                                  ['conv4_block2_out[0]
[0]',
                                )
                                                                   'conv4_block3_3_bn[0]
[0]']
conv4 block3 out (Activation)
                                (None, 14, 14, 1024 0
                                                                  ['conv4 block3 add[0]
[0]']
conv4_block4_1_conv (Conv2D)
                                (None, 14, 14, 256)
                                                     262400
                                                                  ['conv4_block3_out[0]
[0]']
conv4_block4_1_bn (BatchNormal
                                 (None, 14, 14, 256)
                                                      1024
                                                                  ['conv4_block4_1_conv
[0][0]
ization)
conv4_block4_1_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block4_1_bn[0]
[0]']
n)
conv4 block4 2 conv (Conv2D)
                                (None, 14, 14, 256)
                                                     590080
                                                                  ['conv4 block4 1 relu
[0][0]']
                                                                  ['conv4_block4_2_conv
conv4 block4 2 bn (BatchNormal (None, 14, 14, 256) 1024
[0][0]']
ization)
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conv4 block4 2 relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4 block4 2 bn[0]
[0]']
n)
                                (None, 14, 14, 1024 263168
conv4 block4 3 conv (Conv2D)
                                                                  ['conv4 block4 2 relu
[0][0]
                                )
conv4 block4 3 bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block4_3_conv
[0][0]
ization)
                                )
conv4_block4_add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block3_out[0]
[0]',
                                )
                                                                   'conv4 block4 3 bn[0]
[0]']
conv4_block4_out (Activation) (None, 14, 14, 1024 0
                                                                  ['conv4_block4_add[0]
[0]']
                                )
conv4_block5_1_conv (Conv2D)
                                (None, 14, 14, 256)
                                                                  ['conv4_block4_out[0]
                                                     262400
[0]']
conv4 block5 1 bn (BatchNormal
                                (None, 14, 14, 256)
                                                      1024
                                                                  ['conv4 block5 1 conv
[0][0]']
ization)
conv4 block5 1 relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4 block5 1 bn[0]
[0]']
n)
conv4 block5 2 conv (Conv2D)
                                (None, 14, 14, 256)
                                                     590080
                                                                  ['conv4 block5 1 relu
[0][0]']
conv4 block5 2 bn (BatchNormal (None, 14, 14, 256)
                                                     1024
                                                                  ['conv4 block5 2 conv
[0][0]']
ization)
conv4_block5_2_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block5_2_bn[0]
[0]']
n)
conv4 block5 3 conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4 block5 2 relu
[0][0]']
                                )
conv4 block5 3 bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4 block5 3 conv
[0][0]
ization)
                                )
conv4 block5 add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4 block4 out[0]
[0]',
                                )
                                                                   'conv4 block5 3 bn[0]
[0]']
conv4 block5 out (Activation) (None, 14, 14, 1024 0
                                                                  ['conv4 block5 add[0]
[0]']
                                )
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conv4_block6_1_conv (Conv2D)
                                (None, 14, 14, 256)
                                                     262400
                                                                  ['conv4_block5_out[0]
[0]']
conv4_block6_1_bn (BatchNormal
                                (None, 14, 14, 256)
                                                      1024
                                                                  ['conv4_block6_1_conv
[0][0]
ization)
conv4_block6_1_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block6_1_bn[0]
[0]']
n)
conv4_block6_2_conv (Conv2D)
                                (None, 14, 14, 256)
                                                     590080
                                                                  ['conv4_block6_1_relu
[0][0]']
conv4 block6 2 bn (BatchNormal (None, 14, 14, 256)
                                                      1024
                                                                  ['conv4 block6 2 conv
[0][0]
ization)
conv4 block6 2 relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4 block6 2 bn[0]
[0]']
n)
conv4 block6 3 conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4 block6 2 relu
[0][0]']
                                )
conv4_block6_3_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block6_3_conv
[0][0]']
ization)
                                )
conv4 block6 add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block5_out[0]
[0]',
                                )
                                                                   'conv4 block6 3 bn[0]
[0]']
conv4 block6 out (Activation)
                                (None, 14, 14, 1024 0
                                                                  ['conv4 block6 add[0]
[0]']
                                )
conv5_block1_1_conv (Conv2D)
                                                                  ['conv4_block6_out[0]
                                (None, 7, 7, 512)
                                                      524800
[0]']
conv5 block1 1 bn (BatchNormal
                                (None, 7, 7, 512)
                                                      2048
                                                                  ['conv5_block1_1_conv
[0][0]']
ization)
conv5 block1 1 relu (Activatio (None, 7, 7, 512)
                                                                  ['conv5 block1 1 bn[0]
[0]']
n)
conv5_block1_2_conv (Conv2D)
                                (None, 7, 7, 512)
                                                      2359808
                                                                  ['conv5_block1_1_relu
[0][0]']
conv5 block1 2 bn (BatchNormal (None, 7, 7, 512)
                                                      2048
                                                                  ['conv5 block1 2 conv
[0][0]']
ization)
conv5_block1_2_relu (Activatio (None, 7, 7, 512)
                                                                  ['conv5_block1_2_bn[0]
                                                     0
[0]']
n)
```

```
conv5 block1 0 conv (Conv2D)
                                (None, 7, 7, 2048)
                                                                  ['conv4 block6 out[0]
                                                      2099200
[0]']
 conv5 block1 3 conv (Conv2D)
                                (None, 7, 7, 2048)
                                                      1050624
                                                                  ['conv5 block1 2 relu
[0][0]
 conv5_block1_0_bn (BatchNormal (None, 7, 7, 2048)
                                                                  ['conv5_block1_0_conv
                                                      8192
[0][0]']
 ization)
 conv5 block1 3 bn (BatchNormal
                                 (None, 7, 7, 2048)
                                                      8192
                                                                  ['conv5_block1_3_conv
[0][0]']
 ization)
                                (None, 7, 7, 2048)
 conv5_block1_add (Add)
                                                                  ['conv5_block1_0_bn[0]
                                                      0
[0]',
                                                                    'conv5_block1_3_bn[0]
[0]']
 conv5_block1_out (Activation) (None, 7, 7, 2048)
                                                      0
                                                                  ['conv5_block1_add[0]
[0]']
 conv5 block2 1 conv (Conv2D)
                                (None, 7, 7, 512)
                                                      1049088
                                                                  ['conv5_block1_out[0]
[0]']
 conv5_block2_1_bn (BatchNormal (None, 7, 7, 512)
                                                      2048
                                                                  ['conv5_block2_1_conv
[0][0]']
 ization)
 conv5 block2 1 relu (Activatio (None, 7, 7, 512)
                                                                  ['conv5 block2 1 bn[0]
[0]']
 n)
 conv5_block2_2_conv (Conv2D)
                                (None, 7, 7, 512)
                                                      2359808
                                                                  ['conv5_block2_1_relu
[0][0]']
 conv5_block2_2_bn (BatchNormal (None, 7, 7, 512)
                                                      2048
                                                                  ['conv5 block2 2 conv
[0][0]
 ization)
 conv5 block2 2 relu (Activatio (None, 7, 7, 512)
                                                                  ['conv5 block2 2 bn[0]
                                                      0
[0]']
 n)
 conv5_block2_3_conv (Conv2D)
                                (None, 7, 7, 2048)
                                                      1050624
                                                                  ['conv5 block2 2 relu
[0][0]
 conv5 block2 3 bn (BatchNormal
                                 (None, 7, 7, 2048)
                                                      8192
                                                                  ['conv5 block2 3 conv
[0][0]']
 ization)
 conv5_block2_add (Add)
                                (None, 7, 7, 2048)
                                                      0
                                                                  ['conv5_block1_out[0]
[0]',
                                                                    'conv5_block2_3_bn[0]
[0]']
 conv5_block2_out (Activation) (None, 7, 7, 2048)
                                                      0
                                                                  ['conv5_block2_add[0]
[0]']
```

```
['conv5 block2 out[0]
         conv5_block3_1_conv (Conv2D)
                                         (None, 7, 7, 512)
                                                              1049088
         [0]']
         conv5_block3_1_bn (BatchNormal
                                         (None, 7, 7, 512)
                                                                           ['conv5_block3_1_conv
                                                              2048
         [0][0]']
         ization)
         conv5_block3_1_relu (Activatio (None, 7, 7, 512)
                                                                           ['conv5_block3_1_bn[0]
         [0]']
         n)
                                         (None, 7, 7, 512)
         conv5_block3_2_conv (Conv2D)
                                                              2359808
                                                                           ['conv5_block3_1_relu
         [0][0]']
         conv5 block3 2 bn (BatchNormal (None, 7, 7, 512)
                                                              2048
                                                                           ['conv5 block3 2 conv
         [0][0]
         ization)
         conv5 block3 2 relu (Activatio (None, 7, 7, 512)
                                                                           ['conv5 block3 2 bn[0]
         [0]']
         n)
         conv5 block3 3 conv (Conv2D)
                                         (None, 7, 7, 2048)
                                                              1050624
                                                                           ['conv5 block3 2 relu
         [0][0]
         conv5 block3 3 bn (BatchNormal (None, 7, 7, 2048)
                                                              8192
                                                                           ['conv5_block3_3_conv
         [0][0]']
         ization)
         conv5 block3 add (Add)
                                         (None, 7, 7, 2048)
                                                                           ['conv5 block2 out[0]
        [0]',
                                                                            'conv5_block3_3_bn[0]
        [0]']
         conv5_block3_out (Activation) (None, 7, 7, 2048)
                                                                           ['conv5_block3_add[0]
        [0]']
        Total params: 23,587,712
        Trainable params: 23,534,592
        Non-trainable params: 53,120
In [7]:
         for layer in resnet.layers:
             layer.trainable = False
         # This will let us use the default weights used by the imagenet.
In [8]:
         # Usefule for getting number of output classes.
         # folders = glob('../input/car-brand-images-dataset/Train/*')
         folders = glob(train Path + '/*')
         folders
        ['C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
Out[8]:
```

```
\\Image recognition\\ImageDataSet\\Adult',
          'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Airplane',
           C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Alpaca',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Bird',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Bus',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Car',
           C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Cat',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Child',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Dog',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Elephant',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Flower',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Giraffe',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Horse',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Monkey',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Panda',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Reptile',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Train',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Vessel',
           'C:\\Users\\anshul\\Desktop\\MS\\Subjects\\Spring 2022\\Data Analytics\\FINAL PROJECT
         \\Image recognition\\ImageDataSet\\Zebra']
 In [9]:
          labels = ['Adult', 'Airplane', 'Alpaca', 'Bird', 'Bus', 'Car', 'Cat', 'Child', 'Dog', 'E
In [10]:
          # Set the flatten layer.
          x = Flatten() (resnet.output)
In [11]:
          prediction = Dense(len(folders), activation = 'softmax')(x)
In [12]:
          # Create a model Object
          model = Model(inputs = resnet.input, outputs = prediction)
In [13]:
          model.summary()
         Model: "model"
          Layer (type)
                                          Output Shape
                                                               Param #
                                                                           Connected to
```

	_ 	========	
input_1 (InputLayer)	[(None, 224, 224, 3)]	0	[]
conv1_pad (ZeroPadding2D)	(None, 230, 230, 3)	0	['input_1[0][0]']
conv1_conv (Conv2D)	(None, 112, 112, 64	9472	['conv1_pad[0][0]']
conv1_bn (BatchNormalization)	(None, 112, 112, 64	256	['conv1_conv[0][0]']
conv1_relu (Activation)	(None, 112, 112, 64	0	['conv1_bn[0][0]']
pool1_pad (ZeroPadding2D)	(None, 114, 114, 64	0	['conv1_relu[0][0]']
<pre>pool1_pool (MaxPooling2D)</pre>	(None, 56, 56, 64)	0	['pool1_pad[0][0]']
conv2_block1_1_conv (Conv2D)	(None, 56, 56, 64)	4160	['pool1_pool[0][0]']
<pre>conv2_block1_1_bn (BatchNormal [0][0]'] ization)</pre>	(None, 56, 56, 64)	256	['conv2_block1_1_conv
<pre>conv2_block1_1_relu (Activatio [0]'] n)</pre>	(None, 56, 56, 64)	0	['conv2_block1_1_bn[0]
<pre>conv2_block1_2_conv (Conv2D) [0][0]']</pre>	(None, 56, 56, 64)	36928	['conv2_block1_1_relu
<pre>conv2_block1_2_bn (BatchNormal [0][0]'] ization)</pre>	(None, 56, 56, 64)	256	['conv2_block1_2_conv
<pre>conv2_block1_2_relu (Activatio [0]'] n)</pre>	(None, 56, 56, 64)	0	['conv2_block1_2_bn[0]
conv2_block1_0_conv (Conv2D)	(None, 56, 56, 256)	16640	['pool1_pool[0][0]']
<pre>conv2_block1_3_conv (Conv2D) [0][0]']</pre>	(None, 56, 56, 256)	16640	['conv2_block1_2_relu
<pre>conv2_block1_0_bn (BatchNormal [0][0]'] ization)</pre>	(None, 56, 56, 256)	1024	['conv2_block1_0_conv
<pre>conv2_block1_3_bn (BatchNormal [0][0]'] ization)</pre>	(None, 56, 56, 256)	1024	['conv2_block1_3_conv
<pre>conv2_block1_add (Add) [0]',</pre>	(None, 56, 56, 256)	0	['conv2_block1_0_bn[0]
[0]']			'conv2_block1_3_bn[0]

```
['conv2 block1 add[0]
conv2 block1 out (Activation) (None, 56, 56, 256) 0
[0]']
conv2_block2_1_conv (Conv2D)
                                (None, 56, 56, 64)
                                                     16448
                                                                  ['conv2_block1_out[0]
[0]']
conv2 block2 1 bn (BatchNormal
                                (None, 56, 56, 64)
                                                     256
                                                                  ['conv2 block2 1 conv
[0][0]']
ization)
conv2 block2 1 relu (Activatio (None, 56, 56, 64) 0
                                                                  ['conv2 block2 1 bn[0]
[0]']
n)
conv2 block2 2 conv (Conv2D)
                                (None, 56, 56, 64)
                                                     36928
                                                                  ['conv2 block2 1 relu
[0][0]']
conv2_block2_2_bn (BatchNormal (None, 56, 56, 64)
                                                     256
                                                                  ['conv2_block2_2_conv
[0][0]
ization)
conv2 block2 2 relu (Activatio (None, 56, 56, 64) 0
                                                                  ['conv2 block2 2 bn[0]
[0]']
n)
conv2 block2 3 conv (Conv2D)
                                (None, 56, 56, 256) 16640
                                                                  ['conv2 block2 2 relu
[0][0]']
conv2 block2 3 bn (BatchNormal (None, 56, 56, 256) 1024
                                                                  ['conv2 block2 3 conv
[0][0]']
ization)
conv2 block2 add (Add)
                                (None, 56, 56, 256) 0
                                                                  ['conv2 block1 out[0]
[0]',
                                                                   'conv2_block2_3_bn[0]
[0]']
conv2 block2 out (Activation) (None, 56, 56, 256) 0
                                                                  ['conv2 block2 add[0]
[0]']
conv2 block3 1 conv (Conv2D)
                                (None, 56, 56, 64)
                                                     16448
                                                                  ['conv2 block2 out[0]
[0]']
conv2 block3 1 bn (BatchNormal
                                (None, 56, 56, 64)
                                                     256
                                                                  ['conv2 block3 1 conv
[0][0]']
ization)
conv2 block3 1 relu (Activatio (None, 56, 56, 64) 0
                                                                  ['conv2 block3 1 bn[0]
[0]']
n)
conv2 block3 2 conv (Conv2D)
                                (None, 56, 56, 64)
                                                     36928
                                                                  ['conv2 block3 1 relu
[0][0]']
conv2 block3 2 bn (BatchNormal (None, 56, 56, 64)
                                                     256
                                                                  ['conv2_block3_2_conv
[0][0]
ization)
conv2_block3_2_relu (Activatio (None, 56, 56, 64) 0
                                                                  ['conv2_block3_2_bn[0]
[0]']
```

n)

```
(None, 56, 56, 256) 16640
conv2_block3_3_conv (Conv2D)
                                                                 ['conv2_block3_2_relu
[0][0]']
conv2_block3_3_bn (BatchNormal (None, 56, 56, 256) 1024
                                                                 ['conv2_block3_3_conv
[0][0]
ization)
conv2 block3 add (Add)
                                (None, 56, 56, 256) 0
                                                                 ['conv2 block2 out[0]
[0]',
                                                                  'conv2_block3_3_bn[0]
[0]']
conv2 block3 out (Activation) (None, 56, 56, 256) 0
                                                                 ['conv2 block3 add[0]
[0]']
conv3_block1_1_conv (Conv2D)
                                (None, 28, 28, 128) 32896
                                                                 ['conv2_block3_out[0]
[0]']
conv3 block1 1 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3_block1_1_conv
[0][0]']
ization)
conv3 block1 1 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block1 1 bn[0]
[0]']
n)
conv3 block1 2 conv (Conv2D)
                                (None, 28, 28, 128) 147584
                                                                 ['conv3 block1 1 relu
[0][0]']
conv3_block1_2_bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3_block1_2_conv
[0][0]
ization)
                                                                 ['conv3 block1 2 bn[0]
conv3 block1 2 relu (Activatio (None, 28, 28, 128) 0
[0]']
n)
conv3_block1_0_conv (Conv2D)
                                (None, 28, 28, 512) 131584
                                                                 ['conv2_block3_out[0]
[0]']
conv3_block1_3_conv (Conv2D)
                                (None, 28, 28, 512)
                                                     66048
                                                                 ['conv3_block1_2_relu
[0][0]
conv3_block1_0_bn (BatchNormal
                                (None, 28, 28, 512)
                                                     2048
                                                                 ['conv3_block1_0_conv
[0][0]
ization)
conv3_block1_3_bn (BatchNormal (None, 28, 28, 512) 2048
                                                                 ['conv3_block1_3_conv
[0][0]
ization)
conv3 block1 add (Add)
                                (None, 28, 28, 512) 0
                                                                 ['conv3 block1 0 bn[0]
[0]',
                                                                  'conv3 block1 3 bn[0]
[0]']
conv3_block1_out (Activation) (None, 28, 28, 512) 0
                                                                 ['conv3_block1_add[0]
[0]']
```

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```
conv3 block2 1 conv (Conv2D)
                               (None, 28, 28, 128) 65664
                                                                 ['conv3 block1 out[0]
[0]']
conv3 block2 1 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3 block2 1 conv
[0][0]
ization)
conv3_block2_1_relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block2 1 bn[0]
[0]']
n)
conv3_block2_2_conv (Conv2D)
                               (None, 28, 28, 128) 147584
                                                                 ['conv3_block2_1_relu
[0][0]']
conv3 block2 2 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3 block2 2 conv
[0][0]]
ization)
conv3 block2 2 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block2 2 bn[0]
[0]']
n)
conv3 block2 3 conv (Conv2D)
                               (None, 28, 28, 512) 66048
                                                                 ['conv3 block2 2 relu
[0][0]
conv3_block2_3_bn (BatchNormal (None, 28, 28, 512) 2048
                                                                 ['conv3_block2_3_conv
[0][0]
ization)
conv3 block2 add (Add)
                               (None, 28, 28, 512) 0
                                                                 ['conv3 block1 out[0]
[0]',
                                                                  'conv3 block2 3 bn[0]
[0]']
conv3 block2 out (Activation) (None, 28, 28, 512) 0
                                                                 ['conv3 block2 add[0]
[0]']
conv3 block3 1 conv (Conv2D)
                               (None, 28, 28, 128) 65664
                                                                 ['conv3 block2 out[0]
[0]']
conv3 block3 1 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3 block3 1 conv
[0][0]']
ization)
conv3 block3 1 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block3 1 bn[0]
[0]']
n)
conv3_block3_2_conv (Conv2D)
                               (None, 28, 28, 128) 147584
                                                                 ['conv3_block3_1_relu
[0][0]
conv3 block3 2 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3 block3 2 conv
[0][0]']
ization)
conv3 block3 2 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block3 2 bn[0]
[0]']
n)
```

```
conv3_block3_3_conv (Conv2D)
                               (None, 28, 28, 512) 66048
                                                                 ['conv3 block3 2 relu
[0][0]
conv3_block3_3_bn (BatchNormal (None, 28, 28, 512) 2048
                                                                 ['conv3_block3_3_conv
[0][0]
ization)
conv3_block3_add (Add)
                               (None, 28, 28, 512) 0
                                                                 ['conv3_block2_out[0]
[0]',
                                                                  'conv3 block3 3 bn[0]
[0]']
conv3_block3_out (Activation) (None, 28, 28, 512) 0
                                                                 ['conv3_block3_add[0]
[0]']
conv3_block4_1_conv (Conv2D)
                               (None, 28, 28, 128) 65664
                                                                 ['conv3_block3_out[0]
[0]']
conv3 block4 1 bn (BatchNormal (None, 28, 28, 128) 512
                                                                 ['conv3_block4_1_conv
[0][0]
ization)
conv3 block4 1 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block4 1 bn[0]
[0]']
n)
conv3_block4_2_conv (Conv2D)
                                (None, 28, 28, 128) 147584
                                                                 ['conv3_block4_1_relu
[0][0]
                                                                 ['conv3_block4_2_conv
conv3 block4 2 bn (BatchNormal (None, 28, 28, 128) 512
[0][0]']
ization)
conv3 block4 2 relu (Activatio (None, 28, 28, 128) 0
                                                                 ['conv3 block4 2 bn[0]
[0]']
n)
conv3_block4_3_conv (Conv2D)
                               (None, 28, 28, 512)
                                                   66048
                                                                 ['conv3 block4 2 relu
[0][0]
conv3 block4 3 bn (BatchNormal (None, 28, 28, 512) 2048
                                                                 ['conv3_block4_3_conv
[0][0]
ization)
conv3_block4_add (Add)
                               (None, 28, 28, 512) 0
                                                                 ['conv3_block3_out[0]
[0]',
                                                                  'conv3 block4 3 bn[0]
[0]']
conv3_block4_out (Activation) (None, 28, 28, 512) 0
                                                                 ['conv3_block4_add[0]
[0]']
conv4_block1_1_conv (Conv2D)
                                (None, 14, 14, 256) 131328
                                                                 ['conv3_block4_out[0]
[0]']
conv4 block1 1 bn (BatchNormal (None, 14, 14, 256) 1024
                                                                 ['conv4_block1_1_conv
[0][0]']
ization)
conv4 block1 1 relu (Activatio (None, 14, 14, 256) 0
                                                                 ['conv4_block1_1_bn[0]
```

```
[0]']
n)
conv4_block1_2_conv (Conv2D)
                                (None, 14, 14, 256) 590080
                                                                  ['conv4_block1_1_relu
[0][0]
conv4 block1 2 bn (BatchNormal
                                (None, 14, 14, 256)
                                                     1024
                                                                  ['conv4_block1_2_conv
[0][0]']
ization)
conv4 block1 2 relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block1_2_bn[0]
[0]']
n)
conv4_block1_0_conv (Conv2D)
                                (None, 14, 14, 1024 525312
                                                                  ['conv3 block4 out[0]
[0]']
                                )
conv4 block1 3 conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4_block1_2_relu
[0][0]']
                                )
conv4 block1 0 bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4 block1 0 conv
[0][0]
ization)
                                )
conv4_block1_3_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block1_3_conv
[0][0]']
ization)
                                )
conv4 block1 add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block1_0_bn[0]
[0]',
                                )
                                                                   'conv4 block1 3 bn[0]
[0]']
conv4 block1 out (Activation)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block1_add[0]
[0]']
                                )
conv4_block2_1_conv (Conv2D)
                                (None, 14, 14, 256) 262400
                                                                  ['conv4_block1_out[0]
[0]']
conv4_block2_1_bn (BatchNormal (None, 14, 14, 256) 1024
                                                                  ['conv4_block2_1_conv
[0][0]']
ization)
conv4 block2 1 relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4 block2 1 bn[0]
[0]']
n)
conv4_block2_2_conv (Conv2D)
                                (None, 14, 14, 256)
                                                     590080
                                                                  ['conv4_block2_1_relu
[0][0]']
conv4 block2 2 bn (BatchNormal (None, 14, 14, 256)
                                                     1024
                                                                  ['conv4_block2_2_conv
[0][0]']
ization)
conv4_block2_2_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block2_2_bn[0]
[0]']
n)
```

```
conv4 block2 3 conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4 block2 2 relu
[0][0]']
                                )
conv4_block2_3_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block2_3_conv
[0][0]']
ization)
conv4 block2 add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4 block1 out[0]
[0]',
                                )
                                                                   'conv4_block2_3_bn[0]
[0]']
conv4 block2 out (Activation)
                               (None, 14, 14, 1024 0
                                                                  ['conv4_block2_add[0]
[0]']
conv4 block3 1 conv (Conv2D)
                                (None, 14, 14, 256) 262400
                                                                  ['conv4_block2_out[0]
[0]']
conv4_block3_1_bn (BatchNormal (None, 14, 14, 256)
                                                                  ['conv4_block3_1_conv
                                                     1024
[0][0]
ization)
conv4_block3_1_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block3_1_bn[0]
[0]']
n)
conv4_block3_2_conv (Conv2D)
                                (None, 14, 14, 256) 590080
                                                                  ['conv4_block3_1_relu
[0][0]']
conv4 block3 2 bn (BatchNormal (None, 14, 14, 256)
                                                      1024
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[0][0]
ization)
conv4_block3_2_relu (Activatio (None, 14, 14, 256) 0
                                                                  ['conv4_block3_2_bn[0]
[0]']
n)
conv4_block3_3_conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4_block3_2_relu
[0][0]']
                                )
conv4_block3_3_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block3_3_conv
[0][0]']
ization)
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                                                                  ['conv4_block2_out[0]
conv4 block3 add (Add)
                                (None, 14, 14, 1024 0
[0]',
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                                                                   'conv4_block3_3_bn[0]
[0]']
                               (None, 14, 14, 1024 0
conv4 block3 out (Activation)
                                                                  ['conv4_block3_add[0]
[0]']
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conv4_block4_1_conv (Conv2D)
                                (None, 14, 14, 256) 262400
                                                                  ['conv4_block3_out[0]
[0]']
```

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conv4 block4 1 bn (BatchNormal (None, 14, 14, 256)
                                                     1024
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conv4 block4 1 relu (Activatio (None, 14, 14, 256) 0
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conv4_block4_2_conv (Conv2D)
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[0][0]
conv4 block4 2 bn (BatchNormal
                                (None, 14, 14, 256)
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                                                                 ['conv4_block4_2_conv
[0][0]
ization)
conv4 block4 2 relu (Activatio (None, 14, 14, 256) 0
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[0]']
n)
conv4 block4 3 conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                 ['conv4 block4 2 relu
[0][0]']
                                )
conv4 block4 3 bn (BatchNormal (None, 14, 14, 1024 4096
                                                                 ['conv4 block4 3 conv
[0][0]']
ization)
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conv4 block4 add (Add)
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[0]',
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                                                                  'conv4 block4 3 bn[0]
[0]']
conv4 block4 out (Activation)
                               (None, 14, 14, 1024 0
                                                                 ['conv4 block4 add[0]
[0]']
                                )
conv4_block5_1_conv (Conv2D)
                                (None, 14, 14, 256) 262400
                                                                 ['conv4 block4 out[0]
[0]']
conv4 block5 1 bn (BatchNormal (None, 14, 14, 256) 1024
                                                                 ['conv4_block5_1_conv
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ization)
conv4 block5 1 relu (Activatio (None, 14, 14, 256) 0
                                                                 ['conv4 block5 1 bn[0]
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n)
conv4_block5_2_conv (Conv2D)
                                (None, 14, 14, 256)
                                                     590080
                                                                 ['conv4 block5 1 relu
[0][0]
conv4 block5 2 bn (BatchNormal
                                (None, 14, 14, 256)
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[0][0]
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conv4_block5_2_relu (Activatio (None, 14, 14, 256) 0
                                                                 ['conv4_block5_2_bn[0]
[0]']
n)
conv4_block5_3_conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                 ['conv4_block5_2_relu
[0][0]']
```

)

```
conv4_block5_3_bn (BatchNormal (None, 14, 14, 1024 4096
                                                                  ['conv4_block5_3_conv
[0][0]']
 ization)
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 conv4_block5_add (Add)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block4_out[0]
[0]',
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                                                                   'conv4_block5_3_bn[0]
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conv4_block5_out (Activation)
                                (None, 14, 14, 1024 0
                                                                  ['conv4_block5_add[0]
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 conv4_block6_1_conv (Conv2D)
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 conv4 block6 1 bn (BatchNormal (None, 14, 14, 256)
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 conv4_block6_2_conv (Conv2D)
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 conv4 block6 2 bn (BatchNormal
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 conv4 block6 3 conv (Conv2D)
                                (None, 14, 14, 1024 263168
                                                                  ['conv4_block6_2_relu
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 conv4 block6 3 bn (BatchNormal (None, 14, 14, 1024 4096
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 conv4_block6_add (Add)
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 conv4_block6_out (Activation)
                                (None, 14, 14, 1024 0
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 conv5_block1_1_conv (Conv2D)
                                (None, 7, 7, 512)
                                                      524800
                                                                  ['conv4_block6_out[0]
[0]']
 conv5_block1_1_bn (BatchNormal (None, 7, 7, 512)
                                                      2048
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 ization)
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conv5_block1_1_relu (Activatio (None, 7, 7, 512)
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conv5_block1_2_conv (Conv2D)
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                                                     2359808
                                                                  ['conv5 block1 1 relu
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conv5 block1 2 bn (BatchNormal (None, 7, 7, 512)
                                                      2048
                                                                  ['conv5_block1_2_conv
[0][0]
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conv5_block1_2_relu (Activatio (None, 7, 7, 512)
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conv5_block1_0_conv (Conv2D)
                                (None, 7, 7, 2048)
                                                     2099200
                                                                  ['conv4_block6_out[0]
[0]']
conv5 block1 3 conv (Conv2D)
                                (None, 7, 7, 2048)
                                                     1050624
                                                                  ['conv5 block1 2 relu
[0][0]']
conv5 block1 0 bn (BatchNormal
                                (None, 7, 7, 2048)
                                                     8192
                                                                  ['conv5 block1 0 conv
[0][0]
ization)
conv5_block1_3_bn (BatchNormal (None, 7, 7, 2048) 8192
                                                                  ['conv5_block1_3_conv
[0][0]
ization)
conv5 block1 add (Add)
                                (None, 7, 7, 2048)
                                                     0
                                                                  ['conv5 block1 0 bn[0]
[0]',
                                                                   'conv5 block1 3 bn[0]
[0]']
conv5 block1 out (Activation) (None, 7, 7, 2048)
                                                                  ['conv5 block1 add[0]
[0]']
conv5 block2 1 conv (Conv2D)
                                                                  ['conv5 block1 out[0]
                                (None, 7, 7, 512)
                                                     1049088
[0]']
conv5 block2 1 bn (BatchNormal (None, 7, 7, 512)
                                                     2048
                                                                  ['conv5 block2 1 conv
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ization)
conv5 block2 1 relu (Activatio (None, 7, 7, 512)
                                                                  ['conv5 block2 1 bn[0]
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conv5_block2_2_conv (Conv2D)
                                (None, 7, 7, 512)
                                                     2359808
                                                                  ['conv5_block2_1_relu
[0][0]
conv5 block2 2 bn (BatchNormal (None, 7, 7, 512)
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                                                                  ['conv5_block2_2_conv
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conv5 block2 2 relu (Activatio (None, 7, 7, 512)
                                                                  ['conv5 block2 2 bn[0]
                                                     0
[0]']
n)
```

<pre>conv5_block2_3_conv (Conv2D) [0][0]']</pre>	ResNet_final (None, 7, 7, 2048)	1050624	['conv5_block2_2_relu
<pre>conv5_block2_3_bn (BatchNormal [0][0]'] ization)</pre>	(None, 7, 7, 2048)	8192	['conv5_block2_3_conv
<pre>conv5_block2_add (Add) [0]',</pre>	(None, 7, 7, 2048)	0	['conv5_block1_out[0]
[0]']			'conv5_block2_3_bn[0]
<pre>conv5_block2_out (Activation) [0]']</pre>	(None, 7, 7, 2048)	0	['conv5_block2_add[0]
<pre>conv5_block3_1_conv (Conv2D) [0]']</pre>	(None, 7, 7, 512)	1049088	['conv5_block2_out[0]
<pre>conv5_block3_1_bn (BatchNormal [0][0]'] ization)</pre>	(None, 7, 7, 512)	2048	['conv5_block3_1_conv
<pre>conv5_block3_1_relu (Activatio [0]'] n)</pre>	(None, 7, 7, 512)	0	['conv5_block3_1_bn[0]
<pre>conv5_block3_2_conv (Conv2D) [0][0]']</pre>	(None, 7, 7, 512)	2359808	['conv5_block3_1_relu
<pre>conv5_block3_2_bn (BatchNormal [0][0]'] ization)</pre>	(None, 7, 7, 512)	2048	['conv5_block3_2_conv
<pre>conv5_block3_2_relu (Activatio [0]'] n)</pre>	(None, 7, 7, 512)	0	['conv5_block3_2_bn[0]
<pre>conv5_block3_3_conv (Conv2D) [0][0]']</pre>	(None, 7, 7, 2048)	1050624	['conv5_block3_2_relu
<pre>conv5_block3_3_bn (BatchNormal [0][0]'] ization)</pre>	(None, 7, 7, 2048)	8192	['conv5_block3_3_conv
<pre>conv5_block3_add (Add) [0]',</pre>	(None, 7, 7, 2048)	0	['conv5_block2_out[0]
[0]']			'conv5_block3_3_bn[0]
<pre>conv5_block3_out (Activation) [0]']</pre>	(None, 7, 7, 2048)	0	['conv5_block3_add[0]
<pre>flatten (Flatten) [0]']</pre>	(None, 100352)	0	['conv5_block3_out[0]
dense (Dense)	(None, 19)	1906707	['flatten[0][0]'] 

Total params: 25,494,419

```
Trainable params: 1,906,707
Non-trainable params: 23,587,712
```

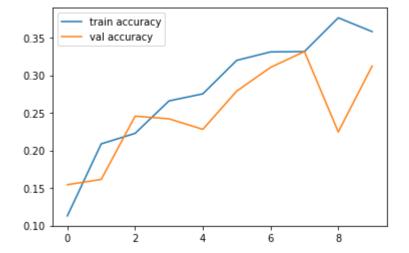
```
In [14]:
          model.compile (
              loss = 'categorical_crossentropy',
              optimizer = 'adam',
              metrics = ['accuracy']
          )
In [15]:
          import tensorflow as tf
          from tensorflow import keras
          from keras preprocessing import image
          from keras.preprocessing.image import ImageDataGenerator
In [16]:
          train datagen = ImageDataGenerator(
              rescale = 1./255,
              shear_range = 0.2,
              zoom_range = 0.2,
              horizontal_flip = True
          test_datagen = ImageDataGenerator(
              rescale = 1./255
In [17]:
          training_set = train_datagen.flow_from_directory(
              train_Path,
              target_size = IMAGE_SIZE,
              batch size = 32,
              class mode = 'categorical' # As we have more than 2 so using categorical.. for 2 we
          )
         Found 2223 images belonging to 19 classes.
In [18]:
          test_set = train_datagen.flow_from_directory(
              test Path,
              target_size = IMAGE_SIZE,
              batch_size = 32,
              class mode = 'categorical'
          )
         Found 570 images belonging to 19 classes.
In [19]:
          # Fir the model.
          history = model.fit_generator(
              training_set,
              validation_data = test_set,
              epochs = 10,
              steps_per_epoch = len(training_set),
```

```
validation steps = len(test set)
)
```

```
C:\Users\anshul\AppData\Local\Temp/ipykernel_16452/2330314088.py:3: UserWarning: `Model.
       fit generator` is deprecated and will be removed in a future version. Please use `Model.
       fit`, which supports generators.
         history = model.fit generator(
       Epoch 1/10
       70/70 [============= - - 223s 3s/step - loss: 9.4701 - accuracy: 0.1129
       - val loss: 3.4073 - val accuracy: 0.1544
       Epoch 2/10
       70/70 [============= - - 211s 3s/step - loss: 3.1209 - accuracy: 0.2087
       - val loss: 3.7761 - val accuracy: 0.1614
       Epoch 3/10
       70/70 [============== ] - 212s 3s/step - loss: 3.4080 - accuracy: 0.2227
       - val loss: 3.6396 - val accuracy: 0.2456
       Epoch 4/10
       - val loss: 3.0815 - val accuracy: 0.2421
       Epoch 5/10
       70/70 [============= ] - 211s 3s/step - loss: 3.1098 - accuracy: 0.2753
       - val_loss: 3.4824 - val_accuracy: 0.2281
       70/70 [============== ] - 221s 3s/step - loss: 2.8098 - accuracy: 0.3198
       - val_loss: 3.6436 - val_accuracy: 0.2789
       Epoch 7/10
       - val loss: 2.9604 - val accuracy: 0.3105
       Epoch 8/10
       70/70 [============== ] - 219s 3s/step - loss: 2.7805 - accuracy: 0.3315
       - val_loss: 2.6378 - val_accuracy: 0.3316
       Epoch 9/10
       70/70 [============] - 217s 3s/step - loss: 2.3830 - accuracy: 0.3765
        - val_loss: 3.5697 - val_accuracy: 0.2246
       Epoch 10/10
       - val loss: 2.9159 - val accuracy: 0.3123
In [20]:
        # Plot the Loss
        plt.plot(history.history['loss'], label = 'train loss')
        plt.plot(history.history['val loss'], label ='val loss')
        plt.legend()
        plt.show()
        # plt.savefig('LossVal loss')
```

```
9 - train_loss val loss val loss val loss val loss
```

```
In [21]: # Plot the Accuracy
    plt.plot(history.history['accuracy'], label = 'train accuracy')
    plt.plot(history.history['val_accuracy'], label = 'val accuracy')
    plt.legend()
    plt.show()
    # plt.savefig('valAccuracy')
```



```
In [22]: # Save it as a h5 file
    #from tensorflow.keras.models import load_model
    #model.save('car_brand_clf_resnet50.h5')
```

```
[2.2869783e-03, 3.1113421e-04, 1.4972646e-03, ..., 9.4501111e-06,
                 7.5181356e-06, 2.6822672e-04],
                [9.9644205e-03, 1.7404910e-02, 7.7631153e-02, ..., 2.4107335e-02,
                 2.2532651e-02, 3.9044460e-03]], dtype=float32)
In [24]:
          prediction = np.argmax(prediction, axis = 1)
          prediction
                                         5, 11, 9, 11, 10, 18, 14,
                         9, 9, 10, 11,
         array([10, 10,
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Out[24]:
                18, 10,
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                17,
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                        4, 11, 15,
                                     9,
                                         8, 10, 15], dtype=int64)
In [25]:
          model.evaluate(test_set,batch_size=512)
         18/18 [============== ] - 43s 2s/step - loss: 2.8674 - accuracy: 0.2965
         [2.867422580718994, 0.29649123549461365]
Out[25]:
In [26]:
          from sklearn.metrics import accuracy score, classification report, confusion matrix
          import numpy as np
In [27]:
          #predict
          y pred=model.predict(test set)
          y_pred=np.argmax(y_pred,axis=1)
```

```
cm = confusion_matrix(test_set.classes, y_pred)
In [29]:
          print(cm)
```

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