```
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow_backend.py:66: The name tf.get_defau
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow backend.py:541: The name tf.placehol
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow backend.py:4432: The name tf.random
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow backend.py:4267: The name tf.nn.max
Downloading data from https://github.com/fchollet/deep-learning-models/releases/download/v0.1/vgg16 weights tf dim ordering
58892288/58889256 [====
                                                                        - 1s Ous/step
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow backend.py:216: The name tf.is variation variation of the control of
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow backend.py:223: The name tf.variable
Experimento VGG16-1
experimento = Experimento VGG16-1
model = <keras.engine.training.Model object at 0x7fa806300a58>
samples_per_class = 100
number_of_classes = 102
optimizador = rmsprop
clasificador = VGG16-1
batch_size = 128
epochs = 10
run experiment = True
Creando sub-conjunto de datos con 102 clases y 100 muestras por clase
number_of_classes: 102
Sub-conjunto con 102 clases creado.
Cantidad de muestras: 6398
Creando datos de train, validate v test ...
Datos de train, validate y test creados.
Split de Entrenamiento, Validación y prueba: 4478, 960, 960
Número de clases: 102
Número de muestras: 100
Usando rmsprop
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/optimizers.py:793: The name tf.train.Optimizer is depre
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow_backend.py:3576: The name tf.log is
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/tensorflow core/python/ops/math grad.py:1424: where (from ter
Instructions for updating:
Use tf.where in 2.0, which has the same broadcast rule as np.where
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow_backend.py:1033: The name tf.assign_
WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/keras/backend/tensorflow backend.py:1020: The name tf.assign
Train on 4478 samples, validate on 960 samples
Epoch 1/10
4478/4478 [
                       Epoch 2/10
4478/4478 [
                          Epoch 3/10
4478/4478 [
                                     ========= 1 - 5s lms/step - loss: 1.0029 - acc: 0.7617 - val loss: 1.2930 - val acc: 0.6844
Epoch 4/10
4478/4478 r
                                      ========= 1 - 5s 1ms/step - loss: 0.6731 - acc: 0.8377 - val loss: 1.2504 - val acc: 0.6792
Epoch 5/10
4478/4478 r
                          Epoch 6/10
4478/4478 [=
                     Epoch 7/10
4478/4478 [
                                      ========] - 5s 1ms/step - loss: 0.2131 - acc: 0.9571 - val loss: 1.0589 - val acc: 0.7292
Epoch 8/10
4478/4478 [
                                ============== ] - 5s 1ms/step - loss: 0.1518 - acc: 0.9701 - val_loss: 1.0883 - val_acc: 0.7344
Epoch 9/10
4478/4478 [
                             =========== ] - 5s lms/step - loss: 0.1079 - acc: 0.9788 - val loss: 1.1770 - val acc: 0.7250
Epoch 10/10
4478/4478 [
                                                ======] - 5s 1ms/step - loss: 0.0953 - acc: 0.9810 - val_loss: 0.9329 - val_acc: 0.7646
                 Usando modelo pre-entrenado
                                                                                            Loss
   1.0
                                                                 3.5

    training loss

   0.9
                                                                                                          validation loss
                                                                 3.0
   0.8
                                                                 2.5
 0.7
0.6
                                                                 2.0
                                                                 1.5
   0.5
                                                                 1.0
   0.4
                                        training accuracy
                                                                 0.5
                                        validation accuracy
   0.3
                                                                 0.0
                                                                                            epochs
                              epoch
Exactitud en subconjunto de test:
Test loss: 0.826099677880605
Test accuracy: 0.7916666666666666
Exactitud en todo el dataset:
Test loss: 0.41863870030140965
Test accuracy: 0.8999453253143794
Experimento VGG16-2
```

experimento = Experimento VGG16-2

samples per class = 100

model = <keras.engine.training.Model object at 0x7fa806300a58>

```
number of classes = 102
optimizador = rmsprop
clasificador = VGG16-2
batch_size = 128
epochs = 10
run experiment = True
Número de clases: 102
Número de muestras: 100
Usando rmsprop
Train on 4478 samples, validate on 960 samples
Epoch 1/10
                ==========] - 6s 1ms/step - loss: 4.1919 - acc: 0.2461 - val_loss: 2.5728 - val_acc: 0.3667
4478/4478 [
Epoch 2/10
4478/4478 [
                                ======= 1 - 5s lms/step - loss: 1.6574 - acc: 0.5717 - val loss: 1.5544 - val acc: 0.6021
Epoch 3/10
4478/4478 [
                           Epoch 4/10
4478/4478 [
                           ========= ] - 5s 1ms/step - loss: 0.7323 - acc: 0.7943 - val loss: 1.4193 - val acc: 0.6281
Epoch 5/10
4478/4478 [
                               ========] - 5s 1ms/step - loss: 0.4984 - acc: 0.8591 - val loss: 1.3239 - val acc: 0.6792
Epoch 6/10
4478/4478 [
                                       ==] - 5s lms/step - loss: 0.3646 - acc: 0.8971 - val loss: 1.1904 - val acc: 0.7260
Epoch 7/10
4478/4478 [
                                   =====] - 5s 1ms/step - loss: 0.2559 - acc: 0.9265 - val_loss: 1.5605 - val_acc: 0.6875
Epoch 8/10
4478/4478 [
                                   =====] - 5s lms/step - loss: 0.3603 - acc: 0.9201 - val loss: 1.0253 - val acc: 0.7573
Epoch 9/10
4478/4478
                             ========] - 5s 1ms/step - loss: 0.1345 - acc: 0.9661 - val_loss: 1.2461 - val_acc: 0.7135
Epoch 10/10
4478/4478 [=
                      =========] - 5s lms/step - loss: 0.2498 - acc: 0.9515 - val_loss: 1.1467 - val_acc: 0.7406
            Usando modelo pre-entrenado
                                                                 Loss
  1.0
                                                                          training loss
  0.9
  0.8
  0.7
 0.7
0.6
0.5
                                               2
  0.4
                                               1
                            training accuracy
  0.3
                             validation accuracy
                                                                epochs
Exactitud en subconjunto de test:
Test loss: 0.9612103035052617
Test accuracy: 0.785416666666667
Exactitud en todo el dataset:
Test loss: 0.4306638018210168
Test accuracy: 0.9070530343863924
Experimento VGG16-3
experimento = Experimento VGG16-3
model = <keras.engine.training.Model object at 0x7fa806300a58>
samples per class = 100
number_of_classes = 102
optimizador = rmsprop
clasificador = VGG16-3
batch_size = 128
epochs = 10
run_experiment = True
Número de clases: 102
Número de muestras: 100
Usando rmsprop
Train on 4478 samples, validate on 960 samples
Epoch 1/10
4478/4478 [=============] - 5s lms/step - loss: 3.6097 - acc: 0.2588 - val_loss: 2.3834 - val_acc: 0.4167
Epoch 2/10
4478/4478 [=============] - 5s lms/step - loss: 1.6374 - acc: 0.5969 - val_loss: 1.6633 - val_acc: 0.5687
Epoch 3/10
4478/4478 [
           =========================== | - 5s lms/step - loss: 1.0798 - acc: 0.7157 - val loss: 1.2812 - val acc: 0.6625
Epoch 4/10
4478/4478 r
                            ========= ] - 5s 1ms/step - loss: 0.7246 - acc: 0.8015 - val loss: 1.4575 - val acc: 0.6156
Epoch 5/10
4478/4478 [
                                 =======] - 5s 1ms/step - loss: 0.5046 - acc: 0.8671 - val loss: 1.3544 - val acc: 0.6490
Epoch 6/10
4478/4478 r
                                 ======= ] - 5s lms/step - loss: 0.3745 - acc: 0.8941 - val loss: 1.1185 - val acc: 0.7188
Epoch 7/10
4478/4478 [
                                  ======] - 5s 1ms/step - loss: 0.2878 - acc: 0.9225 - val_loss: 1.4362 - val_acc: 0.6750
Epoch 8/10
4478/4478 [
                                  ======] - 5s 1ms/step - loss: 0.2100 - acc: 0.9397 - val_loss: 1.4413 - val_acc: 0.6594
Epoch 9/10
4478/4478 [
                                 ======] - 5s 1ms/step - loss: 0.1663 - acc: 0.9560 - val_loss: 1.4200 - val_acc: 0.6937
Epoch 10/10
4478/4478 [
                                =======] - 5s lms/step - loss: 0.1233 - acc: 0.9687 - val_loss: 1.0202 - val_acc: 0.7667
            Usando modelo pre-entrenado
                                                                Loss
  1.0
                                             3.5

    training loss

  0.9
                                                                          validation loss
                                             3.0
  0.8
                                             2.5
  0.7
                                             2.0
  0.6
                                             1.5
```

```
1.0
  0.4
                          training accuracy
                                          0.5
  0.3
                          validation accuracy
Exactitud en subconjunto de test:
Test loss: 0.8771930128335953
Test accuracy: 0.78645833333333334
Exactitud en todo el dataset:
Test loss: 0.48329648602922043
Test accuracy: 0.8857299069943748
Experimento VGG16-4
experimento = Experimento VGG16-4
model = <keras.engine.training.Model object at 0x7fa806300a58>
samples_per_class = 100
number_of_classes = 102
optimizador = Adam
clasificador = VGG16-1
batch_size = 128
epochs = 10
run_experiment = True
Número de clases: 102
Número de muestras: 100
Usando Adam
Train on 4478 samples, validate on 960 samples
Epoch 1/10
4478/4478 [
          ============== | - 5s lms/step - loss: 4.2537 - acc: 0.1402 - val loss: 3.7894 - val acc: 0.2771
Epoch 2/10
                     =========] - 5s 1ms/step - loss: 3.1961 - acc: 0.4236 - val loss: 2.9330 - val acc: 0.4125
4478/4478 [
Epoch 3/10
4478/4478 [
                            ========] - 5s lms/step - loss: 2.3414 - acc: 0.5764 - val loss: 2.3060 - val acc: 0.5531
Epoch 4/10
4478/4478 [
                              ======= 1 - 5s 1ms/step - loss: 1.7767 - acc: 0.6880 - val loss: 1.9263 - val acc: 0.6281
Epoch 5/10
4478/4478 [
                               ====== ] - 5s 1ms/step - loss: 1.4188 - acc: 0.7541 - val loss: 1.6945 - val acc: 0.6594
Epoch 6/10
4478/4478 r
                                    ==] - 5s lms/step - loss: 1.1697 - acc: 0.8086 - val_loss: 1.5509 - val_acc: 0.6635
Epoch 7/10
4478/4478 [
                               ======] - 5s 1ms/step - loss: 0.9918 - acc: 0.8408 - val loss: 1.4116 - val acc: 0.6906
Epoch 8/10
4478/4478 [
                               ======] - 5s 1ms/step - loss: 0.8523 - acc: 0.8691 - val loss: 1.3309 - val acc: 0.7146
Epoch 9/10
4478/4478
                            ========] - 5s 1ms/step - loss: 0.7457 - acc: 0.8886 - val loss: 1.2621 - val acc: 0.7208
Epoch 10/10
4478/4478 [=
                Usando modelo pre-entrenado
                                                            Loss
                                                                     training loss
                                          4.0
  0.8
                                          3.5
                                          3.0
 0.6
و 0.6
                                          2.5
                                          2.0
  0.4
                                          1.5
                          training accuracy
                                          1.0
  0.2
                          validation accuracy
                                          0.5
                                                           epochs
Exactitud en subconjunto de test:
Test loss: 1.088756416241328
Test accuracy: 0.7770833333333333
Exactitud en todo el dataset:
Test loss: 0.7682466194106947
Test accuracy: 0.8625478402912584
Experimento VGG16-5
experimento = Experimento VGG16-5
model = <keras.engine.training.Model object at 0x7fa806300a58>
samples per class = 100
number_of_classes = 102
optimizador = Adam
clasificador = VGG16-2
batch size = 128
epochs = 10
run_experiment = True
Número de clases: 102
Número de muestras: 100
Usando Adam
Train on 4478 samples, validate on 960 samples
Epoch 1/10
4478/4478 [
                          ========] - 6s 1ms/step - loss: 3.8581 - acc: 0.2575 - val_loss: 2.9874 - val_acc: 0.4188
Epoch 2/10
4478/4478 [
                         ========] - 5s 1ms/step - loss: 2.1098 - acc: 0.5960 - val_loss: 1.8606 - val_acc: 0.6062
Epoch 3/10
4478/4478 [
                            =======] - 5s 1ms/step - loss: 1.2607 - acc: 0.7521 - val_loss: 1.4467 - val_acc: 0.6552
Epoch 4/10
4478/4478 [
                    Epoch 5/10
```

```
Epoch 6/10
4478/4478 [
                      =========] - 5s lms/step - loss: 0.4780 - acc: 0.9165 - val loss: 1.0297 - val acc: 0.7583
Epoch 7/10
4478/4478 [
                            ======] - 5s 1ms/step - loss: 0.3620 - acc: 0.9491 - val loss: 0.9544 - val acc: 0.7656
Epoch 8/10
4478/4478 [
                       ========] - 5s 1ms/step - loss: 0.2794 - acc: 0.9681 - val loss: 0.9096 - val acc: 0.7708
Epoch 9/10
4478/4478
                =========] - 5s lms/step - loss: 0.2192 - acc: 0.9754 - val_loss: 0.8816 - val_acc: 0.7750
Epoch 10/10
4478/4478 [=
            Usando modelo pre-entrenado
                                                       Loss
  1.0
                                                                training loss
                                                                validation loss
  0.8
  0.6
                                        1
  0.4
                        training accuracy
                        validation accuracy
                                        0
Exactitud en subconjunto de test:
Test loss: 0.7812225192785263
Test accuracy: 0.791666666666666
Exactitud en todo el dataset:
Test loss: 0.44634470026624407
Test accuracy: 0.9002733733694432
Experimento VGG16-6
experimento = Experimento VGG16-6
model = <keras.engine.training.Model object at 0x7fa806300a58>
samples per class = 100
number_of_classes = 102
optimizador = Adam
clasificador = VGG16-3
batch_size = 128
epochs = 10
run_experiment = True
Número de clases: 102
Número de muestras: 100
Usando Adam
Train on 4478 samples, validate on 960 samples
Epoch 1/10
4478/4478 [
             Epoch 2/10
4478/4478 [
                       ========= ] - 5s 1ms/step - loss: 2.8440 - acc: 0.4725 - val loss: 2.4297 - val acc: 0.5219
Epoch 3/10
4478/4478 [
               Epoch 4/10
4478/4478 [
               Epoch 5/10
4478/4478 [
             =========] - 5s 1ms/step - loss: 0.9662 - acc: 0.8234 - val loss: 1.3072 - val acc: 0.7115
Epoch 6/10
4478/4478 [
                           :======] - 5s 1ms/step - loss: 0.7582 - acc: 0.8658 - val loss: 1.1972 - val acc: 0.7281
Epoch 7/10
4478/4478 [
                           ======] - 5s 1ms/step - loss: 0.6174 - acc: 0.8955 - val_loss: 1.0955 - val_acc: 0.7531
Epoch 8/10
4478/4478 [
                              =====] - 5s 1ms/step - loss: 0.5011 - acc: 0.9189 - val_loss: 1.0394 - val_acc: 0.7594
Epoch 9/10
4478/4478 [
                        ========] - 5s 1ms/step - loss: 0.4187 - acc: 0.9402 - val_loss: 1.0101 - val_acc: 0.7583
Epoch 10/10
4478/4478 [
                           =======] - 5s 1ms/step - loss: 0.3459 - acc: 0.9553 - val_loss: 0.9913 - val_acc: 0.7646
          Usando modelo pre-entrenado
                                                       Loss
                                                                training loss
  0.8
  0.6
  0.4
                        training accuracy
                        validation accuracy
  0.2
                                                       epochs
```

Exactitud en subconjunto de test: Test loss: 0.8872637708981832 Test accuracy: 0.792708333333333333

Exactitud en todo el dataset: Test loss: 0.5428321770154563 Test accuracy: 0.8882449425329205