```
!unzip '/content/drive/MyDrive/archive (1).zip'
       inflating: train_data/train_data/himbul/100_5161.JPG
       inflating: train_data/train_data/himbul/100_5162.JPG
       inflating: train_data/train_data/himbul/10774570945_9bc537c255_o.jpg
       inflating: train data/train data/himbul/11383838134 96e891a316 o.jpg
       inflating: train_data/train_data/himbul/11383857084_cdd7514746_o.jpg
       inflating: train_data/train_data/himbul/11387473723_464965720a_o.jpg
       inflating: train_data/train_data/himbul/9007817678_24db19fc63_o.jpg
       inflating: train_data/train_data/himgri/12029790563_2fe54a68aa_o.jpg
       inflating: train_data/train_data/himgri/12029822653_1185544e7b_o.jpg
       inflating: train_data/train_data/himgri/12029933015_802428e277_o.jpg
       inflating: train data/train data/himgri/12029987304 031b7a2d53 o.jpg
       inflating: train_data/train_data/himgri/12030165813_f5341e8ed0_o.jpg
       inflating: train_data/train_data/himgri/12030221124_1baaf905d1_o.jpg
       inflating: train_data/train_data/himgri/12030269234_1c3f5a8e8c_o.jpg
       inflating: train_data/train_data/himgri/12152037683_13e1556c41_o.jpg
       inflating: train_data/train_data/himgri/12152178844_dc29e3126f_o.jpg
       inflating: train_data/train_data/himgri/12152510436_23b62fed3b_o.jpg
       inflating: train data/train data/himgri/12265055185 138e3c7c70 o.jpg
       inflating: train_data/train_data/himgri/12265498144_d2e80faa3b_o.jpg
       inflating: train_data/train_data/himgri/12265561764_4814951031_o.jpg
       inflating: train_data/train_data/himgri/12265582724_61cb64e73a_o.jpg
       inflating: train data/train data/himgri/12265738206 2b9b25cc8a o.jpg
       inflating: train_data/train_data/himgri/12265747116_d4b4fa3741_o.jpg
       inflating: train_data/train_data/himgri/12266053036_fcab92d8e8_o.jpg
       inflating: train_data/train_data/himgri/12266077576_1d7143aaf7_o.jpg
       inflating: train_data/train_data/himgri/12266086526_82cd337667_o.jpg
       inflating: train_data/train_data/himgri/IMG_5463.JPG
       inflating: train_data/train_data/hsparo/100_4757.JPG
       inflating: train_data/train_data/hsparo/100_4758.JPG
       inflating: train_data/train_data/hsparo/100_5039.JPG
       inflating: train_data/train_data/hsparo/100_5040.JPG
       inflating: train data/train data/hsparo/100 5041.JPG
       inflating: train_data/train_data/hsparo/100_5048.JPG
       inflating: train_data/train_data/hsparo/100_5049.JPG
       inflating: train_data/train_data/hsparo/100_5050.JPG
       inflating: train_data/train_data/hsparo/100_5572.JPG
       inflating: train_data/train_data/indvul/DSC_0502.jpg
       inflating: train_data/train_data/indvul/DSC_0571e.jpg
       inflating: train data/train data/indvul/DSC 0572.jpg
       inflating: train_data/train_data/indvul/DSC_0576e.jpg
       inflating: train_data/train_data/indvul/DSC_0582.jpg
       inflating: train_data/train_data/indvul/DSC_0583e.jpg
       inflating: train_data/train_data/indvul/DSC_0584.jpg
       inflating: train_data/train_data/indvul/DSC_0616c.jpg
       inflating: train_data/train_data/indvul/DSC_0617.jpg
       inflating: train_data/train_data/jglowl/12152151476_7a1524aabb_o.jpg
       inflating: train_data/train_data/jglowl/DSC01335.jpg
       inflating: train_data/train_data/jglowl/DSC01336.jpg
       inflating: train_data/train_data/jglowl/_D32_10285.jpg
       inflating: train_data/train_data/jglowl/_D32_10578.jpg
       inflating: train_data/train_data/jglowl/_D32_10583.jpg
       inflating: train_data/train_data/lbicrw/100_4037.JPG
       inflating: train_data/train_data/lbicrw/100_4912.JPG
       inflating: train_data/train_data/lbicrw/100_4913.JPG
       inflating: train_data/train_data/lbicrw/100_4914.JPG
       inflating: train_data/train_data/lbicrw/100_4915.JPG
       inflating: train_data/train_data/lbicrw/100_4916.JPG
       inflating: train_data/train_data/mgprob/100_5587.JPG
# Data Augmentation
from tensorflow.keras.preprocessing.image import ImageDataGenerator
train_gen = ImageDataGenerator(rescale=(1./255),horizontal_flip=True,shear_range=0.2)
test gen = ImageDataGenerator(rescale=(1./255)) #--> (0 to 255) convert to (0 to 1)
train = train_gen.flow_from_directory('/content/train_data/train_data',
                                      target_size=(120, 120),
                                     class_mode='categorical',
                                     batch_size=8)
test = test_gen.flow_from_directory('/content/test_data/test_data',
                                    target_size=(120, 120),
                                      class mode='categorical',
                                     batch_size=8)
     Found 150 images belonging to 16 classes.
```

Found 157 images belonging to 16 classes.

```
train.class_indices
   {'blasti': 0,
    'bonegl': 1,
    'brhkyt': 2,
    'cbrtsh': 3,
    'cmnmvn': 4,
    'gretit': 5,
    'hilpig': 6,
    'himbul': 7,
    'himgri': 8,
    'hsparo': 9,
    'indvul': 10,
    'jglowl': 11.
    'lbicrw': 12,
    'mgprob': 13,
    'rebimg': 14,
    'wcrsrt': 15}
from tensorflow.keras.layers import Convolution2D,MaxPooling2D,Flatten,Dense
from tensorflow.keras.models import Sequential
model = Sequential()
model.add(Convolution2D(20,(3,3),activation='relu',input_shape=(120, 120, 3)))
model.add(MaxPooling2D(pool_size=(2,2)))
model.add(Flatten())
model.add(Dense(45,activation='relu'))
model.add(Dense(16,activation='softmax'))
model.compile(optimizer='adam',loss='categorical crossentropy',metrics=['accuracy'])
model.fit(train,batch size=16,validation data=test,epochs=20)
   Epoch 1/20
   19/19 [============ ] - 89s 5s/step - loss: 3.7453 - accuracy: 0.1533 - val_loss: 2.7484 - val_accuracy: 0.1274
   Fnoch 2/20
   19/19 [============= - 83s 5s/step - loss: 2.6261 - accuracy: 0.1933 - val loss: 2.7914 - val accuracy: 0.1847
   Epoch 3/20
   Epoch 4/20
   Epoch 5/20
   19/19 [============= ] - 83s 5s/step - loss: 2.1155 - accuracy: 0.3867 - val_loss: 2.5395 - val_accuracy: 0.1975
   Epoch 6/20
   Epoch 7/20
   Epoch 8/20
   19/19 [============= ] - 83s 5s/step - loss: 1.5243 - accuracy: 0.5400 - val_loss: 2.5815 - val_accuracy: 0.2229
   Fnoch 9/20
   19/19 [============ ] - 83s 5s/step - loss: 1.3815 - accuracy: 0.6000 - val loss: 2.6106 - val accuracy: 0.1911
   Epoch 10/20
   19/19 [============ - 82s 4s/step - loss: 1.2442 - accuracy: 0.6200 - val loss: 2.9040 - val accuracy: 0.2229
   Epoch 11/20
   Epoch 12/20
   19/19 [============ ] - 82s 4s/step - loss: 0.9467 - accuracy: 0.7000 - val_loss: 2.8541 - val_accuracy: 0.2229
   Epoch 13/20
              19/19 [======
   Epoch 14/20
   Epoch 15/20
   19/19 [============= ] - 82s 4s/step - loss: 0.5179 - accuracy: 0.8600 - val_loss: 3.1108 - val_accuracy: 0.2038
   Epoch 16/20
   19/19 [==========] - 82s 5s/step - loss: 0.3999 - accuracy: 0.8800 - val_loss: 3.2028 - val_accuracy: 0.2293
   Epoch 17/20
   19/19 [===========] - 82s 4s/step - loss: 0.3219 - accuracy: 0.9400 - val loss: 3.7455 - val accuracy: 0.2420
   Epoch 18/20
   19/19 [============= ] - 82s 4s/step - loss: 0.2629 - accuracy: 0.9533 - val_loss: 3.2475 - val_accuracy: 0.2420
   Epoch 19/20
   Epoch 20/20
   19/19 [============= ] - 81s 4s/step - loss: 0.0939 - accuracy: 0.9933 - val_loss: 3.7223 - val_accuracy: 0.2102
   <keras.callbacks.History at 0x7fe31c04c8b0>
```

```
from google.colab import drive
drive.mount('/content/drive')
model.save('birds.h5')
# Testing
import numpy as np
from tensorflow.keras.preprocessing import image
# Testing 1
img1 = image.load_img('/content/gretit.JPG',target_size=(120,120))
img1 = image.img_to_array(img1)
img1 = np.expand_dims(img1,axis=0)
pred = np.argmax(model.predict(img1))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
    1/1 [=======] - 0s 128ms/step
    himbul
# Testing 2
img2 = image.load_img('/content/hsparo.JPG',target_size=(120,120))
img2 = image.img_to_array(img2)
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
    1/1 [======] - 0s 19ms/step
    hsparo
# Testing 3
img2 = image.load_img('/content/bonegl.jpg',target_size=(120,120))
img2 = image.img_to_array(img2)
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
    1/1 [======] - 0s 18ms/step
    1
    bonegl
# Testing 4
img2 = image.load_img('/content/brhkyt.JPG',target_size=(120,120))
img2 = image.img_to_array(img2)
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
    1/1 [======] - 0s 28ms/step
    13
    mgprob
# Testing 5
img2 = image.load_img('/content/himgri.jpg',target_size=(120,120))
img2 = image.img_to_array(img2)
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
    himgri
```

## **Model Tuning**

```
model = Sequential()
model.add(Convolution2D(12,(3,3),activation='relu',input_shape=(120, 120, 3)))
model.add(MaxPooling2D(pool_size=(2,2)))
model.add(Convolution2D(24,(3,3),activation='relu'))
model.add(MaxPooling2D(pool_size=(2,2)))
model.add(Convolution2D(36,(3,3),activation='relu'))
model.add(MaxPooling2D(pool_size=(2,2)))
model.add(Flatten())
model.add(Dense(62,activation='relu'))
model.add(Dense(32,activation='relu'))
model.add(Dense(16,activation='relu'))
model.add(Dense(16,activation='rolu'))
```

model.summary()

Model: "sequential\_2"

Layer (type)	Output Shape	Param #
conv2d_2 (Conv2D)	 (None, 118, 118, 12)	336
<pre>max_pooling2d_2 (MaxPooling 2D)</pre>	(None, 59, 59, 12)	0
conv2d_3 (Conv2D)	(None, 57, 57, 24)	2616
<pre>max_pooling2d_3 (MaxPooling 2D)</pre>	(None, 28, 28, 24)	0
conv2d_4 (Conv2D)	(None, 26, 26, 36)	7812
<pre>max_pooling2d_4 (MaxPooling 2D)</pre>	(None, 13, 13, 36)	0
flatten_2 (Flatten)	(None, 6084)	0
dense_4 (Dense)	(None, 62)	377270
dense_5 (Dense)	(None, 32)	2016
dense_6 (Dense)	(None, 16)	528
dense_7 (Dense)	(None, 16)	272
======================================		=======

Trainable params: 390,850 Non-trainable params: 0

model.compile(optimizer='adam',loss='categorical\_crossentropy',metrics=['accuracy'])

model.fit(train,batch\_size=8,validation\_data=test,epochs=50)

```
19/19 [============= ] - 117s 6s/step - loss: 0.3936 - accuracy: 0.8733 - val_loss: 6.4761 - val_accuracy: 0.2739
   Enoch 33/50
   19/19 [============== ] - 81s 4s/step - loss: 0.3207 - accuracy: 0.9067 - val_loss: 6.4551 - val_accuracy: 0.2994
   Epoch 34/50
   19/19 [===========] - 81s 4s/step - loss: 0.2841 - accuracy: 0.9067 - val_loss: 6.3452 - val_accuracy: 0.2994
   Epoch 35/50
   Epoch 36/50
   Epoch 37/50
   Epoch 38/50
   Epoch 39/50
   19/19 [============ ] - 80s 4s/step - loss: 0.2090 - accuracy: 0.9267 - val_loss: 7.2143 - val_accuracy: 0.3057
   Fnoch 40/50
   19/19 [============== ] - 80s 4s/step - loss: 0.3865 - accuracy: 0.8733 - val_loss: 10.3709 - val_accuracy: 0.3057
   Epoch 41/50
   19/19 [=======] - 115s 6s/step - loss: 0.7138 - accuracy: 0.8267 - val_loss: 6.5822 - val_accuracy: 0.2675
   Epoch 42/50
   Epoch 43/50
   19/19 [============= ] - 80s 4s/step - loss: 0.3536 - accuracy: 0.8933 - val_loss: 7.0266 - val_accuracy: 0.2102
   Epoch 44/50
   19/19 [=====
               ==========] - 81s 4s/step - loss: 0.5137 - accuracy: 0.8467 - val_loss: 6.8031 - val_accuracy: 0.2994
   Epoch 45/50
   Epoch 46/50
   Epoch 47/50
   19/19 [===========] - 80s 4s/step - loss: 0.0839 - accuracy: 0.9800 - val_loss: 7.8019 - val_accuracy: 0.3057
   Epoch 48/50
   19/19 [============ ] - 80s 4s/step - loss: 0.0600 - accuracy: 0.9867 - val loss: 8.8786 - val accuracy: 0.2930
# Testing 1
img1 = image.load_img('/content/gretit.JPG',target_size=(120,120))
img1 = image.img_to_array(img1)
img1 = np.expand_dims(img1,axis=0)
pred = np.argmax(model.predict(img1))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
   1/1 [======= ] - 0s 18ms/step
   cbrtsh
                                                                                           # Testing 2
img2 = image.load_img('/content/hsparo.JPG',target_size=(120,120))
img2 = image.img_to_array(img2)
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
   hsparo
# Testing 3
img2 = image.load_img('/content/bonegl.jpg',target_size=(120,120))
img2 = image.img to array(img2)
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
   1
   bonegl
# Testing 4
img2 = image.load_img('/content/brhkyt.JPG',target_size=(120,120))
img2 = image.img_to_array(img2)
```

```
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
    1/1 [=======] - 0s 19ms/step
    wcrsrt
# Testing 5
img2 = image.load_img('/content/himgri.jpg',target_size=(120,120))
img2 = image.img_to_array(img2)
img2 = np.expand_dims(img2,axis=0)
pred = np.argmax(model.predict(img2))
print(pred)
output = ['blasti','bonegl','brhkyt','cbrtsh','cmnmyn','gretit','hilpig','himbul','himgri','hsparo','indvul','jglowl','lbicrw','mgprob','rebi
print(output[pred])
    1/1 [======= ] - 0s 25ms/step
    himgri
Transfer Learning
from tensorflow.keras.layers import Dense,Flatten,Input
from tensorflow.keras.models import Model
from tensorflow.keras.preprocessing import image
from tensorflow.keras.preprocessing.image import ImageDataGenerator, load_img
import numpy as np
from tensorflow.keras.applications.vgg16 import VGG16, preprocess_input
# Adding the preprocessing layer to the front of vgg
vgg = VGG16(include_top=False,weights='imagenet',input_shape=(224,224,3))
     Downloading data from https://storage.googleapis.com/tensorflow/keras-applications/vgg16/vgg16 weights tf dim ordering tf kernels notop.
    #Train model with existing weights
for layer in vgg.layers:
  print(layer)
     <keras.engine.input layer.InputLayer object at 0x7f4ef5a2b6a0>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b1ea9b0>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b1eba90>
     <keras.layers.pooling.max_pooling2d.MaxPooling2D object at 0x7f4e6b2b0af0>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b1ebee0>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b2b1db0>
     <keras.layers.pooling.max_pooling2d.MaxPooling2D object at 0x7f4e6b2b2fb0>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b2b3af0>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b2b30a0>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b2b15a0>
     <keras.layers.pooling.max_pooling2d.MaxPooling2D object at 0x7f4e6b2b0430>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e6b2b2d70>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e68101f00>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e68102f50>
     <keras.layers.pooling.max_pooling2d.MaxPooling2D object at 0x7f4e68103f10>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e68101060>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e68102860>
     <keras.layers.convolutional.conv2d.Conv2D object at 0x7f4e68111c60>
     <keras.layers.pooling.max_pooling2d.MaxPooling2D object at 0x7f4e68112590>
# Train model with existing weights
for layer in vgg.layers:
 layer.trainable=False
x = Flatten()(vgg.output)
```

```
# output layer
prediction = Dense(4,activation='softmax')(x)

# Create Vgg16 model
model = Model(inputs=vgg.input,outputs=prediction)
```

model.summary()

Model: "model"

Layer (type)	Output Shape	Param #
input_1 (InputLayer)	[(None, 224, 224, 3)]	0
block1_conv1 (Conv2D)	(None, 224, 224, 64)	1792
block1_conv2 (Conv2D)	(None, 224, 224, 64)	36928
<pre>block1_pool (MaxPooling2D)</pre>	(None, 112, 112, 64)	0
block2_conv1 (Conv2D)	(None, 112, 112, 128)	73856
block2_conv2 (Conv2D)	(None, 112, 112, 128)	147584
block2_pool (MaxPooling2D)	(None, 56, 56, 128)	0
block3_conv1 (Conv2D)	(None, 56, 56, 256)	295168
block3_conv2 (Conv2D)	(None, 56, 56, 256)	590080
block3_conv3 (Conv2D)	(None, 56, 56, 256)	590080
block3_pool (MaxPooling2D)	(None, 28, 28, 256)	0
block4_conv1 (Conv2D)	(None, 28, 28, 512)	1180160
block4_conv2 (Conv2D)	(None, 28, 28, 512)	2359808
block4_conv3 (Conv2D)	(None, 28, 28, 512)	2359808
block4_pool (MaxPooling2D)	(None, 14, 14, 512)	0
block5_conv1 (Conv2D)	(None, 14, 14, 512)	2359808
block5_conv2 (Conv2D)	(None, 14, 14, 512)	2359808
block5_conv3 (Conv2D)	(None, 14, 14, 512)	2359808
block5_pool (MaxPooling2D)	(None, 7, 7, 512)	0
flatten (Flatten)	(None, 25088)	0
dense (Dense)	(None, 4)	100356
		.======

Total params: 14,815,044
Trainable params: 100,356

Non-trainable params: 14,714,688

```
model.compile(loss='categorical_crossentropy',optimizer='adam',metrics=['accuracy'])
```

```
\verb|model.fit_generator(train,validation_data=test,epochs=4,steps_per_epoch=len(train),validation_steps=len(test)||
```

```
<ipython-input-24-9596add3a7e4>:1: UserWarning: `Model.fit_generator` is deprecated and will be removed in a future version. Please use
model.fit_generator(train,validation_data=test,epochs=4,steps_per_epoch=len(train),validation_steps=len(test))
```

X