```
In [1]: #join google-drive to the code
        from google.colab import drive #to connect google drive to the code
        drive.mount('/content/drive')
       Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force_remo
       unt=True).
In [2]: | #!/usr/bin/python3
        #encoding=utf8
        import tensorflow as tf
        from tensorflow import keras
        import numpy as np # linear algebra
        import xml.etree.ElementTree as ET # for parsing XML
        import matplotlib.pyplot as plt # to show images
        from PIL import Image
        import os
        import sys
        import pickle,time
        print(tf.__version__)
        #test, if size too large, then shrink it.
        IMAGE_SIZE=(192,192)
        IMAGE_SHAPE=(192,192,3)
        BATCH_SIZE=3000 #9000
       1.13.1
def showImg(img):
           plt.figure()
           plt.imshow(train_images[0])
           plt.colorbar()
           plt.grid(False)
           plt.show()
        def saveObj(obj,filename):#dump Object to Local
           output = open(filename, 'wb+')
           pickle.dump(obj,output)
           output.close()
        def loadObjsIfExist(filename):#Load objects at startup
           result= None
           if os.path.exists(filename):
               pkl_file = open(filename, 'rb')
               result = pickle.load(pkl_file)
               pkl_file.close()
           return result
LABELS = {"airplane":0, "car":1, "cat":2, "dog":3, "flower":4, "fruit":5, "motorbike":6, "person":7}
        LABELS_R = \{\}
        for itm in LABELS.keys():
           LABELS_R[LABELS[itm]] = itm
        def readSamples():
           objs=[]
           for c in os.listdir('/content/drive/My Drive/Assignment6/Data/natural images input/'):
               for m in os.listdir('/content/drive/My Drive/Assignment6/Data/natural_images_input/'+c):
                   picpath="/content/drive/My Drive/Assignment6/Data/natural_images_input/"+c+"/"+m
                   nodeInfo={"imgdir":picpath, "label":LABELS[c]}
                   objs.append(nodeInfo)
           np.random.shuffle(objs)
           testRange = int(len(objs)*0.20)
           actualTrainObjs = objs[testRange:]
           actualTestObjs = objs[:testRange]
           return actualTrainObjs, actualTestObjs
In [0]: | def readTrainSamples(actualTrainObjs):
           divider=20
           objTrain=[]
           objTest=[]
           for item in actualTrainObjs:
               _magic = np.random.choice(range(divider))
               if _magic==0: objTest.append(item)
               else: objTrain.append(item)
           np.random.shuffle(objTrain)
```

np.random.shuffle(objTest)
return objTrain, objTest

```
In [0]: | def loadRawData(actualTrainObjs):
            # if the data not been loaded. then load, and save as python objects.
            anfileTrain ="/content/drive/My Drive/Assignment6/Data/natural_images_output/annoObj.train.obj"
            anfileTest ="/content/drive/My Drive/Assignment6/Data/natural_images_output/annoObj.test.obj"
            annoObjTrain = loadObjsIfExist(anfileTrain)
            annoObjTest = loadObjsIfExist(anfileTest)
            if not annoObjTrain:
                print("raw data not exist, loading....")
                annoObjTrain, annoObjTest = readTrainSamples(actualTrainObjs)
                print("raw data loaded, saving as files: ",anfileTrain, anfileTest)
                saveObj(annoObjTrain,anfileTrain)
                saveObj(annoObjTest,anfileTest)
            print("raw data loaded. There are %d training samples and %d testing samples"%(len(annoObjTrain), len(annoObjTest
        )))
            return annoObjTrain, annoObjTest
In [0]: | def preProcessBatch(tag, annoObj):
            #if the data has not been pre-processed, the process the data.
            #1. generate the label sets.
            #2. save configure info.
            confFile ="/content/drive/My Drive/Assignment6/Data/natural_images_output/"+tag+"config.obj"
            confs= loadObjsIfExist(confFile)
            if not confs:
                confs = \{\}
            #3. generate batchs, 200 items each.
            # too many images, so we should not load them all at once, we need to load needed images as we training.
            batchs=[]
            bacthcnt=0
            objbatch=[]
            objcnt=0
            for pic in annoObj:
                objcnt+=1
                objbatch.append(pic)
                if (objcnt%BATCH_SIZE==0 or objcnt == len(anno0bj)):
                    batchfile="/content/drive/My Drive/Assignment6/Data/natural_images_output/objbatch_"+tag+str(bacthcnt)
                    batchs.append(batchfile)
                    saveObj(objbatch, batchfile)
                    print(objcnt, bacthcnt, len(objbatch))
                    objbatch=[]
                    bacthcnt+=1
            #3. save confs
            confs["objcnt"] = objcnt
            confs["batchs"] = batchs
            confs["bacthcnt"] = bacthcnt
            print(confs)
            saveObj(confs, confFile)
            pass
def readPic(pic):
            picdir = pic["imgdir"]
            #1. find picture
            if not picdir:
                return None
            if not os.path.exists(picdir):
                return None
            img = Image.open(picdir)
            imgobj= img.resize(IMAGE_SIZE)
            #4. normalnize the data between 0,1
            imgobj = np.array(imgobj)/ 255.0
            if (imgobj.ndim < 3) or (imgobj.shape != IMAGE_SHAPE):</pre>
                #exception: this picture is not a RGB picture.
                return None
            #5. split data set into different batch
            return imgobj
In [0]: | def loadImagesBatch(batchfile):
            #1.load images as numpy's ndarray
            objbatch =loadObjsIfExist(batchfile)
            imgarray = []
            labels = []
            for pic in objbatch:
                imgobj = readPic(pic)
                if imgobj is None:
                    continue # in case picture is wrong.
                imgarray.append(imgobj)
                labels.append(int(pic["label"]))##category for softmax should start with 0.
            imgarray = np.array(imgarray)
            labels=np.array(labels)
            return imgarray,labels
In [0]: | def loadConf(tag):
            confFile ="/content/drive/My Drive/Assignment6/Data/natural images output/"+tag+"config.obj"
            confs= loadObjsIfExist(confFile)
```

return confs

```
def buildModel():
            #1. build model.
            #2. compile the model
            tfmodel = tf.keras.models.Sequential([
            #keras.layers.Flatten(input_shape=IMAGE_SHAPE),
            keras.layers.Conv2D(32, kernel_size=(5, 5), activation=tf.keras.activations.relu, input_shape=IMAGE_SHAPE),
            keras.layers.MaxPooling2D(pool_size=(2, 2)),
            keras.layers.BatchNormalization(axis = 1),
            keras.layers.Dropout(0.22),
            keras.layers.Conv2D(32, kernel_size=(5, 5), activation=tf.keras.activations.relu),
            keras.layers.AveragePooling2D(pool_size=(2, 2)),
            keras.layers.BatchNormalization(axis = 1),
            keras.layers.Dropout(0.25),
            keras.layers.Conv2D(32, kernel_size=(4, 4), activation=tf.keras.activations.relu),
            keras.layers.AveragePooling2D(pool_size=(2, 2)),
            keras.layers.BatchNormalization(axis = 1),
            keras.layers.Dropout(0.15),
            keras.layers.Conv2D(32, kernel_size=(3, 3), activation=tf.keras.activations.relu),
            keras.layers.AveragePooling2D(pool_size=(2, 2)),
            keras.layers.BatchNormalization(axis = 1),
            keras.layers.Dropout(0.15),
            keras.layers.Flatten(),
            keras.layers.Dense(256, activation=tf.keras.activations.relu,kernel_regularizer=keras.regularizers.l2(0.001)),
            #keras.layers.Dropout(0.25),
            keras.layers.Dense(64, activation=tf.keras.activations.relu,kernel_regularizer=keras.regularizers.l2(0.001)),
            #keras.layers.Dropout(0.1),
            keras.layers.Dense(len(LABELS), activation=tf.keras.activations.softmax)
            tfmodel.compile(optimizer=tf.keras.optimizers.Adam(),
                       loss=tf.keras.losses.sparse_categorical_crossentropy,
                       metrics=['accuracy'])
            return tfmodel
In [0]: | def loadWeights(tfmodel):
            checkpoint path="/content/drive/My Drive/Assignment6/Data/natural images output/chk/cp-{epoch:04d}.ckpt"
            if os.path.exists("/content/drive/My Drive/Assignment6/Data/natural_images_output/chk/checkpoint"):
                latest = tf.train.latest_checkpoint("/content/drive/My Drive/Assignment6/Data/natural_images_output/chk/")
                tfmodel.load_weights(latest)
                print("tfmodel loaded from: ",latest)
            return tfmodel
In [0]: def trainModel(tfmodel, train_images, train_labels, testX, testY, epochs=50):
            checkpoint path="/content/drive/My Drive/Assignment6/Data/natural images output/chk/cp-{epoch:04d}.ckpt"
            cp_callback = tf.keras.callbacks.ModelCheckpoint(checkpoint_path,
                                                        save_weights_only=True,
                                                        verbose=1,
                                                        period=10)
            result = tfmodel.fit(train_images, train_labels,
                  epochs = epochs, callbacks = [cp_callback],
                  validation_data=(testX, testY),
                  #validation_data = (test_images, test_labels),
                 verbose=1)
            # return the fit history.
            return result, tfmodel
In [0]: | def evaluteAccuracy(tfmodel, test_images, test_labels):
            loss, acc = tfmodel.evaluate(test_images, test_labels, verbose=1)
            return loss, acc
In [0]: def loadModel():
            tfmodel = buildModel()
            tfmodel = loadWeights(tfmodel)
            return tfmodel
        In [0]:
        def training(tfmodel):
            #2. Load config
            trainconf = loadConf("train")
            testconf = loadConf("test")
            trainBatchs = trainconf["batchs"]
            testBatchs = testconf["batchs"]
            #3. train model with each batch
            history =[]
            nBatch =0
            for batchfile in trainBatchs:
                imgarray,label = loadImagesBatch(batchfile)
                print("Load traing set:",imgarray.shape, label.shape, np.argmax(label), np.argmin(label))
                #4. evaluate the model with random test batch
                testbatch = np.random.choice(testBatchs)
                test_images,test_labels = loadImagesBatch(testbatch)
                print("Load test set:", test_images.shape, test_labels.shape)
                h1,tfmodel = trainModel(tfmodel,imgarray,label, test images, test labels, epochs=10)
                loss, acc = evaluteAccuracy(tfmodel, test_images,test_labels)
                #5. record the training history for further analysis.
                history.append((h1, loss, acc))
                nBatch+=1
                print(nBatch, "batch of training finished, loss and acc is:",loss, acc)
```

```
In [0]: | def evaluateResult():
             #1. Load model
            tfmodel = buildModel()
            tfmodel = loadWeights(tfmodel)
            tfmodel.summary()
            #2. Load config
            testconf = loadConf("test")
            testBatchs = testconf["batchs"]
            history =[]
            nBatch =0
            #4. evaluate the model with random test batch
            testbatch = np.random.choice(testBatchs)
            test_images,test_labels = loadImagesBatch(testbatch)
            print(test_images.shape, test_labels.shape)
            loss, acc = evaluteAccuracy(tfmodel, test_images,test_labels)
            print("loss and acc is:",loss, acc)
In [0]: def predict(imgdir):
```

```
tfmodel = buildModel()
tfmodel = loadWeights(tfmodel)
tfmodel.summary()
test_images =[]
figplot = plt.figure(figsize=(15, 15))
imgs = os.listdir(imgdir)
for imgpath in imgs:
    #1. Read data. 3. Make prediction.
    img = Image.open(imgdir+ imgpath)
    #2. resize into fixed size
    imgobj= img.resize(IMAGE_SIZE)
    #3. normalnize the data between 0,1
    imgobj = np.array(imgobj)/ 255.0
    test_images.append(imgobj)
test_images = np.array(test_images)
predictions = tfmodel.predict(test_images,verbose=1)
print(LABELS_R)
for i in range(len(predictions)):
    img = test_images[i]
    pre = predictions[i]*100
    print(pre)
    mostlikely = np.argmax(pre)
    txt = LABELS_R[mostlikely]
    chance = pre[mostlikely]
    plt.subplot(331 + i) # showing 9 random images
    plt.imshow(img) # displays photo
    plt.text(0, 0, txt+":"+str(chance)+"%", bbox={'ec': None}) # printing breed
figplot.savefig("/content/drive/My Drive/Assignment6/Data/natural_images_output/001.png",format='png')
```

```
In [0]: def getTestLinksAndLabels(actualTestObjs):
    testImageLinks = []
    testImageLabels = []
    for item in actualTestObjs:
        link = list(item.values())[0]
        label = list(item.values())[1]
        testImageLinks.append(link)
        testImageLabels.append(label)
    return testImageLinks, testImageLabels
```

```
In [0]: | def predictActualTest(testImageLinks):
             tfmodel = buildModel()
             tfmodel = loadWeights(tfmodel)
             #tfmodel.summary()
             test_images =[]
             figplot = plt.figure(figsize=(15, 15))
             for imgpath in testImageLinks:
                 #1. Read data. 3. Make prediction.
                 img = Image.open(imgpath)
                 #2. resize into fixed size
                 imgobj= img.resize(IMAGE_SIZE)
                 #3. normalnize the data between 0,1
                 imgobj = np.array(imgobj)/ 255.0
                 test_images.append(imgobj)
             test_images = np.array(test_images)
             predictions = tfmodel.predict(test_images,verbose=1)
             print(LABELS_R)
             #print(predictions,"\n\n")
             prediction_list = []
             prediction_label = []
             for i in range(len(predictions)):
                 img = test_images[i]
                 pre = predictions[i]*100
                 mostlikely = np.argmax(pre)
                 txt = LABELS_R[mostlikely]
                 if(txt == 'airplane'): labelVal = 0
                 elif(txt == 'car'): labelVal = 1
                 elif(txt == 'cat'): labelVal = 2
                 elif(txt == 'dog'): labelVal = 3
                 elif(txt == 'flower'): labelVal = 4
                 elif(txt == 'fruit'): labelVal = 5
                 elif(txt == 'motorbike'): labelVal = 6
                 else: labelVal = 7
                 prediction list.append(txt)
                 prediction_label.append(labelVal)
             # showing 9 random images
             for i in range(9):
                 img = test_images[i]
                 pre = predictions[i]*100
                 mostlikely = np.argmax(pre)
                 txt = LABELS_R[mostlikely]
                 chance = pre[mostlikely]
                 plt.subplot(331 + i) # showing 9 random images
                 plt.imshow(img) # displays photo
                 plt.text(0, 0, txt+":"+str(chance)+"%", bbox={'ec': None}) # printing breed
             return prediction_list, prediction_label
In [22]:
         actualTrainObjs, actualTestObjs = readSamples()
         annoObjTrain, annoObjTest = loadRawData(actualTrainObjs)
         raw data not exist, loading....
         raw data loaded, saving as files: /content/drive/My Drive/Assignment6/Data/natural_images_output/annoObj.train.obj /c
         ontent/drive/My Drive/Assignment6/Data/natural_images_output/annoObj.test.obj
         raw data loaded. There are 5257 training samples and 260 testing samples
In [23]: | preProcessBatch("train", annoObjTrain)
         preProcessBatch("test", annoObjTest)
         3000 0 3000
         5257 1 2257
         {'objcnt': 5257, 'batchs': ['/content/drive/My Drive/Assignment6/Data/natural_images_output/objbatch_train0', '/conten
         t/drive/My Drive/Assignment6/Data/natural_images_output/objbatch_train1'], 'bacthcnt': 2}
```

{'objcnt': 260, 'batchs': ['/content/drive/My Drive/Assignment6/Data/natural_images_output/objbatch_test0'], 'bacthcn

260 0 260

t': 1}

In [24]: tfmodel = loadModel()
tfmodel.summary()

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/tensorflow/python/ops/resource_variable_ops.py:435: col ocate_with (from tensorflow.python.framework.ops) is deprecated and will be removed in a future version. Instructions for updating:

Colocations handled automatically by placer.

WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/tensorflow/python/keras/layers/core.py:143: calling dro pout (from tensorflow.python.ops.nn_ops) with keep_prob is deprecated and will be removed in a future version. Instructions for updating:

Please use `rate` instead of `keep_prob`. Rate should be set to `rate = 1 - keep_prob`.

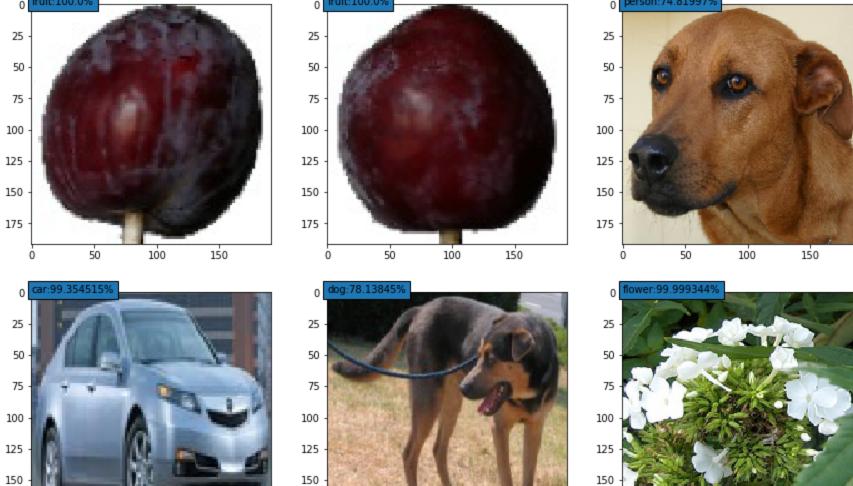
Layer (type)	Output	Shape	Param #
conv2d (Conv2D)	(None,	188, 188, 32)	2432
max_pooling2d (MaxPooling2D)	(None,	94, 94, 32)	0
batch_normalization_v1 (Batc	(None,	94, 94, 32)	376
dropout (Dropout)	(None,	94, 94, 32)	0
conv2d_1 (Conv2D)	(None,	90, 90, 32)	25632
average_pooling2d (AveragePo	(None,	45, 45, 32)	0
batch_normalization_v1_1 (Ba	(None,	45, 45, 32)	180
dropout_1 (Dropout)	(None,	45, 45, 32)	0
conv2d_2 (Conv2D)	(None,	42, 42, 32)	16416
average_pooling2d_1 (Average	(None,	21, 21, 32)	0
batch_normalization_v1_2 (Ba	(None,	21, 21, 32)	84
dropout_2 (Dropout)	(None,	21, 21, 32)	0
conv2d_3 (Conv2D)	(None,	19, 19, 32)	9248
average_pooling2d_2 (Average	(None,	9, 9, 32)	0
batch_normalization_v1_3 (Ba	(None,	9, 9, 32)	36
dropout_3 (Dropout)	(None,	9, 9, 32)	0
flatten (Flatten)	(None,	2592)	0
dense (Dense)	(None,	256)	663808
dense_1 (Dense)	(None,	64)	16448
dense_2 (Dense)	(None,	8)	520

Total params: 735,180 Trainable params: 734,842 Non-trainable params: 338

```
In [25]: training(tfmodel)
    Load traing set: (3000, 192, 192, 3) (3000,) 11 4
    Load test set: (260, 192, 192, 3) (260,)
    Train on 3000 samples, validate on 260 samples
    Epoch 1/10
    0.1231
    Epoch 2/10
    0.1192
    Epoch 3/10
    0.1385
    Epoch 4/10
    0.3846
    Epoch 5/10
    0.4846
    Epoch 6/10
    0.8346
    Epoch 7/10
    0.8731
    Epoch 8/10
    0.9000
    Epoch 9/10
    0.9000
    Epoch 10/10
    Epoch 00010: saving model to /content/drive/My Drive/Assignment6/Data/natural_images_output/chk/cp-0010.ckpt
    WARNING: tensorflow: This model was compiled with a Keras optimizer (<tensorflow.python.keras.optimizers.Adam object at
    0x7fb26450f908>) but is being saved in TensorFlow format with `save_weights`. The model's weights will be saved, but u
    nlike with TensorFlow optimizers in the TensorFlow format the optimizer's state will not be saved.
    Consider using a TensorFlow optimizer from `tf.train`.
    WARNING:tensorflow:From /usr/local/lib/python3.6/dist-packages/tensorflow/python/keras/engine/network.py:1436: update_
    checkpoint_state (from tensorflow.python.training.checkpoint_management) is deprecated and will be removed in a future
    version.
    Instructions for updating:
    Use tf.train.CheckpointManager to manage checkpoints rather than manually editing the Checkpoint proto.
    0.8923
    1 batch of training finished, loss and acc is: 0.6418434739112854 0.8923077
    Load traing set: (2257, 192, 192, 3) (2257,) 1 9
    Load test set: (260, 192, 192, 3) (260,)
    Train on 2257 samples, validate on 260 samples
    Epoch 1/10
    0.8423
    Epoch 2/10
    0.8846
    Epoch 3/10
    0.8731
    Epoch 4/10
    0.9192
    Epoch 5/10
    0.9269
    Epoch 6/10
    0.9115
    Epoch 7/10
    0.9308
    Epoch 8/10
    0.9231
    Epoch 9/10
    Epoch 10/10
    Epoch 00010: saving model to /content/drive/My Drive/Assignment6/Data/natural_images_output/chk/cp-0010.ckpt
    WARNING:tensorflow:This model was compiled with a Keras optimizer (<tensorflow.python.keras.optimizers.Adam object at
    0x7fb26450f908>) but is being saved in TensorFlow format with `save_weights`. The model's weights will be saved, but u
    nlike with TensorFlow optimizers in the TensorFlow format the optimizer's state will not be saved.
    Consider using a TensorFlow optimizer from `tf.train`.
    0.8962
```

2 batch of training finished, loss and acc is: 0.424499367750608 0.89615387

In [56]: | testImageLinks, testImageLabels = getTestLinksAndLabels(actualTestObjs) prediction_list, prediction_label = predictActualTest(testImageLinks) tfmodel loaded from: /content/drive/My Drive/Assignment6/Data/natural_images_output/chk/cp-0010.ckpt 1379/1379 [==========] - 2s 2ms/sample {0: 'airplane', 1: 'car', 2: 'cat', 3: 'dog', 4: 'flower', 5: 'fruit', 6: 'motorbike', 7: 'person'} Ó fruit:100.0% person:74.81997%



Number of testImage labels : 1379 Number of predicted labels : 1379

total_match: 1235

Ó

prediction accuracy: 89.55765047135606 %