

```
import glob
import os.path
import numpy as np
import tensorflow as tf
from tensorflow.python.platform import gfile
```

```
# 原始输入数据的目录，这个目录下有5个子目录，每个子目录下保存这属于该
# 类别的所有图片。
```

```
INPUT_DATA = './flowers/flower_photos'
```

```
# 输出文件地址。我们将整理后的图片数据通过numpy的格式保存。
```

```
OUTPUT_FILE = './flower_processed_data.npy'
```

```
# 测试数据和验证数据比例。
```

```
VALIDATION_PERCENTAGE = 10
```

```
TEST_PERCENTAGE = 10
```

```
def create_image_lists(sess, testing_percentage, validation_percentage):
```

```
    sub_dirs = [x[0] for x in os.walk(INPUT_DATA)]
```

```
    is_root_dir = True
```

```
# 初始化各个数据集。
```

```
training_images = []
```

```
training_labels = []
```

```
testing_images = []
```

```
testing_labels = []
```

```
validation_images = []
```

```
validation_labels = []
```

```
current_label = 0
```

```
# 读取所有的子目录。
```

```
for sub_dir in sub_dirs:
```

```
    if is_root_dir:
```

```
        is_root_dir = False
```

```
        continue
```

```
# 获取一个子目录中所有的图片文件。
```

```
extensions = ['jpg', 'jpeg', 'JPG', 'JPEG']
```

```
file_list = []
```

```
dir_name = os.path.basename(sub_dir)
```

```
for extension in extensions:
```

```
    file_glob = os.path.join(INPUT_DATA, dir_name, '*' + extension)
```

```
    file_list.extend(glob.glob(file_glob))
```

```
if not file_list: continue
```

```
print("processing:", dir_name)
```

```
i = 0
```

```

# 处理图片数据。
for file_name in file_list:
    i += 1
    image_raw_data = gfile.GFile(file_name, 'rb').read()
    image = tf.image.decode_jpeg(image_raw_data)
    if image.dtype != tf.float32:
        image = tf.image.convert_image_dtype(image, dtype=tf.float32)
    image = tf.image.resize_images(image, [224, 224])
    image_value = sess.run(image)

    # 随机划分数据聚。
    chance = np.random.randint(100)
    if chance < validation_percentage:
        validation_images.append(image_value)
        validation_labels.append(current_label)
    elif chance < (testing_percentage + validation_percentage):
        testing_images.append(image_value)
        testing_labels.append(current_label)
    else:
        training_images.append(image_value)
        training_labels.append(current_label)
    if i % 200 == 0:
        print (i, "images processed.")
    current_label += 1

# 将训练数据随机打乱以获得更好的训练效果。
state = np.random.get_state()
np.random.shuffle(training_images)
np.random.set_state(state)
np.random.shuffle(training_labels)

return np.asarray([training_images, training_labels,
                    validation_images, validation_labels,
                    testing_images, testing_labels])

```

```

with tf.Session() as sess:
    processed_data = create_image_lists(sess, TEST_PERCENTAGE, VALIDATION_PERCENTAGE)
    # 通过numpy格式保存处理后的数据。
    np.save(OUTPUT_FILE, processed_data)

```

```
processing: roses
200 images processed.
400 images processed.
600 images processed.
processing: sunflowers
200 images processed.
400 images processed.
600 images processed.
processing: tulips
200 images processed.
400 images processed.
600 images processed.
processing: daisy
200 images processed.
400 images processed.
600 images processed.
processing: dandelion
200 images processed.
400 images processed.
600 images processed.
800 images processed.
```

```
import glob
import os.path
import numpy as np
import tensorflow as tf
from tensorflow.python.platform import gfile
import tensorflow.contrib.slim as slim
import tensorflow.contrib.slim.python.slim.nets.resnet_v1 as resnet_v1
# 处理好之后的数据文件。
INPUT_DATA = './flower_processed_data.npy'
# 保存训练好的模型的路径。
TRAIN_FILE = './model/'
# 谷歌提供的训练好的模型文件地址。因为GitHub无法保存大于100M的文件，所以
CKPT_FILE = './resnet_v1_50.ckpt'

# 定义训练中使用的参数。
LEARNING_RATE = 0.0001
STEPS = 300
BATCH = 32
N_CLASSES = 5

# 不需要从谷歌训练好的模型中加载的参数。
CHECKPOINT_EXCLUDE_SCOPES = 'Logits'
# 需要训练的网络层参数名称，在fine-tuning的过程中就是最后的全联接层。
TRAINABLE_SCOPES='Logits'
```

```
def get_tuned_variables():
    exclusions = CHECKPOINT_EXCLUDE_SCOPES

    variables_to_restore = []
    # 枚举resnet50模型中所有的参数，然后判断是否需要从加载列表中移除。
    for var in slim.get_model_variables():
        excluded = False
        for exclusion in exclusions:
            if var.op.name.startswith(exclusion):
                excluded = True
                break
        if not excluded:
            variables_to_restore.append(var)
    return variables_to_restore
```

```
def get_trainable_variables():
    scopes = TRAINABLE_SCOPES
    variables_to_train = []

    # 枚举所有需要训练的参数前缀，并通过这些前缀找到所有需要训练的参数。
    for scope in scopes:
        variables = tf.get_collection(tf.GraphKeys.TRAINABLE_VARIABLES, scope)
        variables_to_train.extend(variables)
    return variables_to_train
```

```
def main():
    # 加载预处理好的数据。
    processed_data = np.load(INPUT_DATA)
    training_images = processed_data[0]
    n_training_example = len(training_images)
    training_labels = processed_data[1]

    validation_images = processed_data[2]
    validation_labels = processed_data[3]

    testing_images = processed_data[4]
    testing_labels = processed_data[5]
    resnet_model_path = CKPT_FILE
    model_save_path = TRAIN_FILE
    num_classes = 5
    batch_size = 64
    num_steps = 80
    print("%d training examples, %d validation examples and %d testing examples."
          % (
              n_training_example, len(validation_labels), len(testing_labels)))

    # 定义resnet50的输入，images为输入图片，labels为每一张图片对应的标签。
```

```

inputs = tf.placeholder(tf.float32, shape=[None, 224, 224, 3], name='inputs')
labels = tf.placeholder(tf.int32, shape=[None], name='labels')
is_training = tf.placeholder(tf.bool, name='is_training')

with slim.arg_scope(resnet_v1.resnet_arg_scope()):
    net, endpoints = resnet_v1.resnet_v1_50(inputs, num_classes=None, is_training=is_training)

with tf.variable_scope('Logits'):
    net = tf.squeeze(net, axis=[1, 2])
    net = slim.dropout(net, keep_prob=0.5, scope='scope')
    logits = slim.fully_connected(net, num_outputs=num_classes,
                                   activation_fn=None, scope='fc')

checkpoint_exclude_scopes = 'Logits'
exclusions = None

if checkpoint_exclude_scopes:
    exclusions = [
        scope.strip() for scope in checkpoint_exclude_scopes.split(',')
    ]
variables_to_restore = []
for var in slim.get_model_variables():
    excluded = False
    for exclusion in exclusions:
        if var.op.name.startswith(exclusion):
            excluded = True
    if not excluded:
        variables_to_restore.append(var)

losses = tf.nn.sparse_softmax_cross_entropy_with_logits(
    labels=labels, logits=logits)
loss = tf.reduce_mean(losses)

logits = tf.nn.softmax(logits)
with tf.name_scope('evaluation'):
    correct_prediction = tf.equal(tf.cast(tf.argmax(logits, 1), dtype=tf.int32), labels)
    evaluation_step = tf.reduce_mean(tf.cast(correct_prediction, tf.float32))

classes = tf.argmax(logits, axis=1, name='classes')
accuracy = tf.reduce_mean(tf.cast(
    tf.equal(tf.cast(classes, dtype=tf.int32), labels), dtype=tf.float32))

optimizer = tf.train.AdamOptimizer(learning_rate=0.0001)
train_step = optimizer.minimize(loss)

```

```

init = tf.global_variables_initializer()

saver_restore = tf.train.Saver(var_list=variables_to_restore)
saver = tf.train.Saver(tf.global_variables())

# 计算正确率。

with tf.Session() as sess:
    sess.run(init)

    # Load the pretrained checkpoint file xxx.ckpt
    saver_restore.restore(sess, resnet_model_path)

    start = 0
    end = batch_size
    for i in range(num_steps):
        #images, groundtruth_lists = get_next_batch(batch_size, ...)
        train_dict = {inputs: training_images[start:end],
                      labels: training_labels[start:end],
                      is_training: True}

        sess.run(train_step, feed_dict=train_dict)

        loss_, acc_ = sess.run([loss, accuracy], feed_dict=train_dict)

        start = end
        if start == n_training_example:
            start = 0

        end = start + batch_size
        if end > n_training_example:
            end = n_training_example

        if (i+1) % 5 == 0 or i + 1 == STEPS:
            train_text = 'Step: {}, Loss: {:.4f}, Accuracy: {:.4f}'.format(i+1
, loss_, acc_)
            print(train_text)
            saver.save(sess, model_save_path, global_step=i+1)
            print('save mode to {}'.format(model_save_path))
            test_accuracy = sess.run(evaluation_step, feed_dict={inputs: testing_image
s, labels: testing_labels, is_training: False})
            print('Final test accuracy = %.1f%%' % (test_accuracy * 100))

if __name__ == '__main__':
    main()

```

2941 training examples, 376 validation examples and 353 testing examples.

INFO:tensorflow:Restoring parameters from ./resnet\_v1\_50.ckpt

Step: 5, Loss: 1.1779, Accuracy: 0.4844

save mode to ./model/

Step: 10, Loss: 0.4245, Accuracy: 0.8750

save mode to ./model/

Step: 15, Loss: 0.3478, Accuracy: 0.8750

save mode to ./model/

Step: 20, Loss: 0.2472, Accuracy: 0.9375

save mode to ./model/

Step: 25, Loss: 0.2444, Accuracy: 0.8906

save mode to ./model/

Step: 30, Loss: 0.3396, Accuracy: 0.8594

save mode to ./model/

Step: 35, Loss: 0.2773, Accuracy: 0.9062

save mode to ./model/

Step: 40, Loss: 0.2443, Accuracy: 0.8906

save mode to ./model/

Step: 45, Loss: 0.1210, Accuracy: 0.9531

save mode to ./model/

Step: 50, Loss: 0.1438, Accuracy: 0.9219

save mode to ./model/

Step: 55, Loss: 0.0591, Accuracy: 0.9844

save mode to ./model/

Step: 60, Loss: 0.0337, Accuracy: 0.9844

save mode to ./model/

Step: 65, Loss: 0.0375, Accuracy: 1.0000

save mode to ./model/

Step: 70, Loss: 0.0242, Accuracy: 1.0000

save mode to ./model/

Step: 75, Loss: 0.0400, Accuracy: 1.0000

save mode to ./model/

Step: 80, Loss: 0.0089, Accuracy: 1.0000

save mode to ./model/

Final test accuracy = 93.8%