

6000B project2

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Description:

Using the labeled training data to build a deep model to predict different classes of flowers according to the pictures.

The deep model: VGGNet-16

Feature extraction:

```
def add_cnn_layers(name, input_shape, stride):
    with tf.variable_scope(name):
        conv_weights = tf.get_variable('weight', shape=input_shape, initializer=tf.truncated_normal_initializer(stddev=0.1))
        conv_biases = tf.get_variable('bias', [shape[3]], initializer=tf.constant_initializer(0.0))
        conv = tf.nn.conv2d(input, conv_weights, strides=stride, padding='SAME')
        relu = tf.nn.relu(tf.nn.bias_add(conv, conv_biases))
    return relu

def add_pooling_layers(name, input):
    with tf.name_scope(name):
        pool = tf.nn.max_pool(input, ksize=[1, 2, 2, 1], strides=[1, 2, 2, 1], padding='VALID')
    return pool
```

```
#conv1
conv1_1 = add_cnn_layers('conv1.1', x, [3, 3, 3, 64], [1, 1, 1, 1])
conv1_2 = add_cnn_layers('conv1.2', conv1_1, [3, 3, 64, 64], [1, 1, 1, 1])
pool1 = add_pooling_layers('pool1', conv1_2)

#conv2
conv2_1 = add_cnn_layers('conv2.1', pool1, [3, 3, 64, 128], [1, 1, 1, 1])
conv2_2 = add_cnn_layers('conv2.2', conv2_1, [3, 3, 128, 128], [1, 1, 1, 1])
pool2 = add_pooling_layers('pool2', conv2_2)

#conv3
conv3_1 = add_cnn_layers('conv3.1', pool2, [3, 3, 128, 256], [1, 1, 1, 1])
conv3_2 = add_cnn_layers('conv3.2', conv3_1, [3, 3, 256, 256], [1, 1, 1, 1])
conv3_3 = add_cnn_layers('conv3.3', conv3_2, [3, 3, 256, 256], [1, 1, 1, 1])
pool3 = add_pooling_layers('pool3', conv3_3)

#conv4
conv4_1 = add_cnn_layers('conv4.1', pool3, [3, 3, 256, 512], [1, 1, 1, 1])
conv4_2 = add_cnn_layers('conv4.2', conv4_1, [3, 3, 512, 512], [1, 1, 1, 1])
conv4_3 = add_cnn_layers('conv4.3', conv4_2, [3, 3, 512, 512], [1, 1, 1, 1])
pool4 = add_pooling_layers('pool4', conv4_3)

#conv5
conv5_1 = add_cnn_layers('conv5.1', pool4, [3, 3, 512, 512], [1, 1, 1, 1])
conv5_2 = add_cnn_layers('conv5.2', conv5_1, [3, 3, 512, 512], [1, 1, 1, 1])
conv5_3 = add_cnn_layers('conv5.3', conv5_2, [3, 3, 512, 512], [1, 1, 1, 1])
pool5 = add_pooling_layers('pool5', conv5_3)
```

By using 13 convolution layers and 5 max pooling layers to do feature extraction, and all the convolution matrix is 3×3 .

Label prediction :

The use 3 full connection layers to predict the label of each picture.

```
def ful_con_layers(name,input,input_size,output_size):
    with tf.variable_scope(name):
        weights = tf.get_variable('weight', [input_size, output_size], initializer=tf.truncated_normal_initializer(stddev=0.1))
        biases = tf.get_variable('bias', [output_size], initializer=tf.constant_initializer(0.1))
        f = tf.nn.relu(tf.matmul(input, weights) + biases)
        # f = tf.nn.dropout(f, 0.5)
        return f,weights

def ful_con_layer(name,input,input_size,output_size):
    with tf.variable_scope(name):
        weights = tf.get_variable('weight', [input_size, output_size], initializer=tf.truncated_normal_initializer(stddev=0.1))
        biases = tf.get_variable('bias', [output_size], initializer=tf.constant_initializer(0.1))
        f = tf.matmul(input, weights) + biases
        # if train: f = tf.nn.dropout(f, 0.5)
        return f,weights

nodes = 7*7*512
input_data = tf.reshape(pool5,[-1,nodes])
ful1,weights1 = ful_con_layers('ful1',input_data,nodes,1024)
ful2,weights2 = ful_con_layers('ful2',ful1,1024,1024)
ful3,weights3 = ful_con_layer('ful3',ful2,1024,5)
```

Loss function: Cross-entropy

```
loss=tf.nn.sparse_softmax_cross_entropy_with_logits(logits=ful3, labels=y)+0.001*(tf.nn.l2_loss(weights1)+tf.nn.l2_loss(weights2))
```

Mini—batch:

Using mini-batch to update the parameter and calculate the training accuracy and test accuracy.

```
def minibatches(inputs=None, targets=None, batch_size=None, shuffle=False):
    assert len(inputs) == len(targets)
    if shuffle:
        indices = np.arange(len(inputs))
        np.random.shuffle(indices)
    for start_idx in range(0, len(inputs) - batch_size + 1, batch_size):
        if shuffle:
            excerpt = indices[start_idx:start_idx + batch_size]
        else:
            excerpt = slice(start_idx, start_idx + batch_size)
        yield inputs[excerpt], targets[excerpt]
```

Data processing:

Randomly choose 80% raw data as training data and 20% as test data.

```
num_example=data.shape[0]
arr=np.arange(num_example)
np.random.shuffle(arr)
data=data[arr]
label=label[arr]

ratio=0.8
s=np.int(num_example*ratio)
x_train=data[:s]
y_train=label[:s]
x_val=data[s:]
y_val=label[s:]
```

Set each image as a 224×224×3 matrix.

```
width = 224
high = 224
color = 3
data, label = read_img(datapath,width,high)
```

```
def read_img(path,width,height):
    flower_cat = [path + x for x in os.listdir(path) if os.path.isdir(path + x)]
    del flower_cat[1]
    imgs = []
    labels = []
    for index, folder in enumerate(flower_cat):
        print index
        print folder
        for pic in glob.glob(folder + '/*.jpg'):
            img = io.imread(pic)
            img = transform.resize(img,(width,height))
            imgs.append(img)
            labels.append(index)
    print len(labels)
    return np.asarray(imgs,np.float32),np.asarray(labels,np.int32)
```