

Q1. Which of the following function cannot be used as activation function?

- $\max(0, x)$
- $1 / (1 + e^x)$
- $2 * x - 1$ [correct answer, activation function must be non-linear]
- $(e^x - 1) / (e^x + 1)$

Q2. Which of the following application should not use LSTM?

- Face detection in photos [correct answer, LSTM is for sequence data]
- Virtual assistant system, like Siri
- Surveillance system on road
- Document (text) understanding

Q3. Describe main difference between DNN, CNN and RNN.

广义上讲，CNN，RNN也都是DNN的一种，但是狭义上讲DNN指的是只有full connected layer的网络，CNN是有convolutional layer和pooling layer的，RNN是有时间这个维度的，不是单个输入。

从应用上讲，只有fully connected layer的DNN其实不常用，不过fully connected layer本身非常有用，CNN和RNN中也会用到fully connected layer。CNN用于图像相关的应用，RNN用于序列类型的数据，比如语音，文本和视频。

Q4. What's the benefit of designing a very deep network? What's the potential problem it bring? Any method to solve it?

理论上网络深度越深，表达问题的复杂度可以越高，学习的能力越强。但是同时训练的难度，对训练数据量的要求以及训练时间都增高。Dropout，transfer learning都是对应的方法。

Q5. Coding problem

Implement a DNN:

- 1) Input layer has 10 nodes, it also means the input is a vector with length 10
- 2) Followed by a FC (fully connected) layer with 20 nodes, activation function ReLu
- 3) Followed by a FC layer with 15 nodes, activation function ReLu
- 4) Output layer is also a FC layer with 5 nodes, activation function Sigmoid

Also calculate how many parameters in the DNN need to be trained.

Codes: [红色是答案]

```
model = Sequential()
# TODO: FC layer with 20 nodes, Relu
model.add(Dense(20, input_shape=(10,)))
model.add(Activation('relu'))
# TODO: FC layer with 15 nodes, Relu
```

```
model.add(Dense(15))
model.add(Activation('relu'))
# TODO: FC layer with 5 nodes, Sigmoid
model.add(Dense(5))
model.add(Activation('sigmoid'))
```

```
#params = 10 * 20 + 20 + 20 * 15 + 15 + 15 * 5 + 5
```

Activation function 只是迷惑，因为activation function其实没有需要训练的参数。

Q6. Coding problem

Implement a CNN:

- 1) Takes a 32x32 RGB image as input
- 2) Followed by a Convolutional layer with 10 5*5 kernels, activation function relu
- 3) Followed by a 2x2 max pooling layer
- 4) Followed by a fully-connected layer with 10 nodes, activation function softmax

Also calculate how many parameters in the CNN need to be trained.

Codes: [红色是答案]

```
model = Sequential()
# convolutional layer with 10 5x5 kernels, activation function relu, input image is 32x32x3
model.add(Conv2D(10, kernel_size=(5, 5),
                 activation='relu',
                 input_shape=(32, 32, 3)))
# max pooling
model.add(MaxPooling2D(pool_size=(2, 2)))
# flatten before connected with fully-connected layer.
model.add(Flatten()) # 3D -> 1D
# fully connected layer with 10 nodes, softmax
model.add(Dense(num_category, activation='softmax'))
```

Calculate #params

- 1) Convolutional layer, each kernel has $5 * 5 * 3 + 1 = 76$ params, 10 kernels in total 760
- 2) After conv layer, the image size change from 32x32x3 to 28x28x10, then after pooling layer it is 14x14x10
- 3) Flatten 14x14x10 to 1960d vector
- 4) Fully connected layer has $1960 \times 10 + 10 = 19610$ parameters

So in total $760 + 19610 = 20370$ params to train