

## Homework 2

Please complete the following questions based on the PyTorch tutorial.

<https://pytorch.org/docs/stable/nn.html>

1. Design a Linear layer using `nn.Linear()`.

`nn.Linear()` is used to implement fully connected layer functions. The feature is in  $B \times D$  format.  $B$  denotes `batch_size`,  $D$  denotes the dimension of expected features in the input. Input feature is  $32 \times 512$ . Please design the corresponding layer to output a tensor with  $32 \times 256$  dimension and print the dimension of the output. Fill in the blanks below to meet the requirements.

```
>>> input = torch.randn(32, 512)
>>> m = nn.Linear(_____)
>>> output = m(input)
```

2. Design a Convolutional Neural Networks using `nn.Conv2d()`.

`nn.Conv2d` is used to create two-dimensional convolutional layers, typically employed in Convolutional Neural Networks (CNNs). The feature is in  $B \times C \times H \times W$  format.  $B$  denotes `batch_size`,  $C$  denotes channel,  $H$  denotes height,  $W$  denotes width. Input feature is  $32 \times 36 \times 512 \times 256$ .

(a) You use conv with  $3 \times 3$  kernel size. Stride is 2. Please design the corresponding layer to output a tensor with  $32 \times 34 \times 255 \times 127$  dimension and print the dimension of the output. Fill in the blanks below to meet the requirements.

```
>>> input = torch.randn(32, 36, 512, 256)
>>> m = nn.Conv2d(_____)
>>> output = m(input)
```

(b) You use conv with  $2 \times 4$  kernel size. Strides are 1 and 2 respectively. Padding is 3 and 1 respectively. Please design the corresponding layer to output a tensor with  $32 \times 35 \times 517 \times 128$  dimension and print the dimension of the output. Fill in the blanks below to meet the requirements.

```
>>> m = nn.Conv2d(_____)
>>> output = m(input)
```

(c) You use conv with  $3 \times 5$  kernel size. Strides are 3 and 2 respectively. Padding is 3 and 1 respectively. Dilations are 2 and 1 respectively. Group is 2. Input feature is  $32 \times 16 \times 512 \times 256$ . Please design the corresponding layer to output a tensor with  $32 \times 32 \times 172 \times 127$  dimension and print the dimension of the output. Fill in the blanks below to meet the requirements.

```
>>> input = torch.randn(32, 16, 512, 256)
>>> m = nn.Conv2d(_____)
>>> output = m(input)
```

3. Design a RNN using `nn.RNN()`.

`nn.RNN()` is used to create one layer of a Recurrent Neural Network (RNN) model. The feature is

in  $L \times B \times D$  format.  $L$  denotes sequence length,  $B$  denotes batch\_size,  $D$  denotes the dimension of expected features in the input. Input feature is  $64 \times 8 \times 32$ . You want to design a 2 layers RNN. The hidden size is 64. Please design the corresponding layer to output a tensor with  $64 \times 8 \times 64$  dimension and print the dimension of the output. Fill in the blanks below to meet the requirements.

```
>>> input = torch.randn(64, 8, 32)
>>> rnn = nn.RNN(_____)
>>> h0 = torch.randn(_____)
>>> output, hn = rnn(input, h0)
```

4. Design a TransformerEncoderLayer using nn.TransformerEncoderLayer().

nn.TransformerEncoderLayer() is used to create the encoding layers of a Transformer model, which includes multi-head self-attention layers, feed-forward neural network layers and layer normalization. The feature is in  $B \times L \times D$  format.  $B$  denotes batch\_size,  $L$  denotes sequence length,  $D$  denotes the dimension of expected features in the input. Input feature is  $128 \times 16 \times 512$ . The head number of Transformer is 8. Please design the corresponding layer to output a tensor with  $128 \times 16 \times 512$  dimension and print the dimension of the output. Set batch\_first is True. Fill in the blanks below to meet the requirements.

```
>>> input = torch.rand(128, 16, 512)
>>> encoder_layer = nn.TransformerEncoderLayer(_____)
>>> out = encoder_layer(input)
```

5. Calculate the number of parameters of depthwise and  $1 \times 1$  convolution. Assume the feature dimension is in  $H \times W \times C$  format.

(1) Input feature is  $16 \times 16 \times 32$ . We use depthwise conv with  $3 \times 3$  kernel size. Calculate the number of parameters in the kernel. Assume there is no bias term.

(2) Input feature is  $24 \times 24 \times 64$ . We use 64  $1 \times 1$  conv kernels. Calculate the number of parameters in the kernel. Assume there is no bias term.