機器學習-作業三

609410162 彭郁翔

作業要求-1:

- 調整 epoch、batch size、learning rate

Epoch:20

Batch size:32

Learning rate:0.01

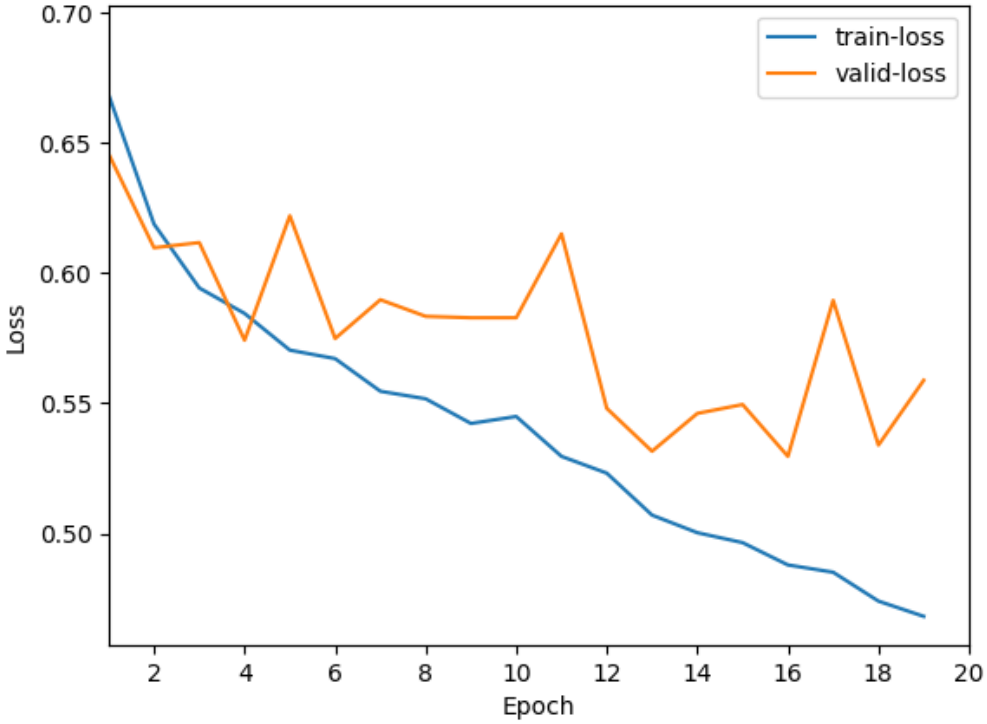
```
# you can modify batch size here
train_batch_size = 32
test_batch_size = 2
num_workers = 0
train_size_rate = 0.8   # split dataset into train and validation 8:2
```

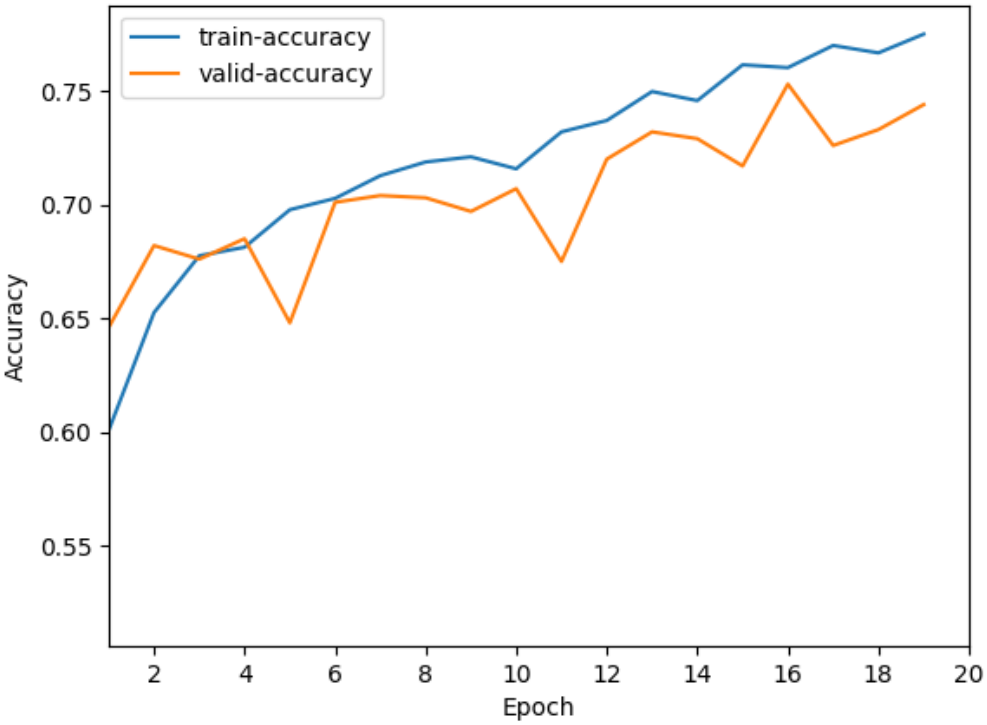
```
# training parameters
device = torch.device('cuda:0' if torch.cuda.is_available() else 'cpu')
epochs = 20
learning_rate = 0.01
```

訓練後結果:

```
Epoch: 20/20
------------
Training: 100%|
Validation: 100%|
Training loss: 0.4682, validation loss: 0.5588
Training accuracy: 0.7750, validation accuracy: 0.7440

Finished Training
```

觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.70
0.65
0.60
0.55
0.50
2
4
6
8
10
12
14
16
18
20


train-accuracy
valid-accuracy
Accuracy
Epoch
0.75
0.70
0.65
0.60
0.55
2
4
6
8
10
12
14
16
18
20

觀察在測試集上的結果:

```
(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%|
Test accuracy: 71.6000%
```

Epoch:40

Batch size:32

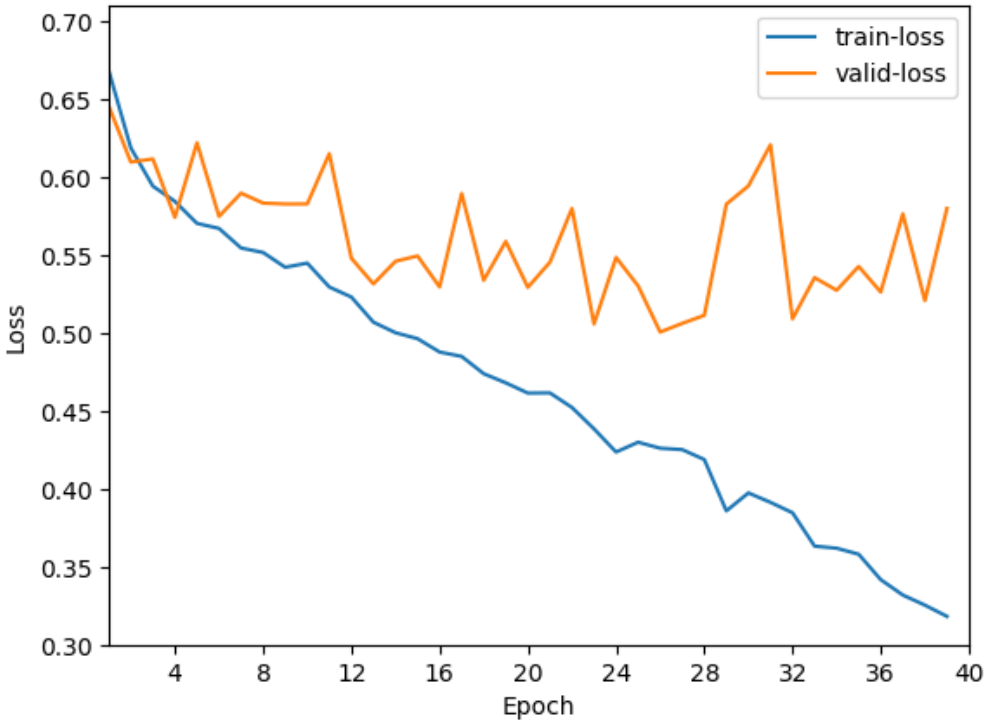
Learning rate:0.01

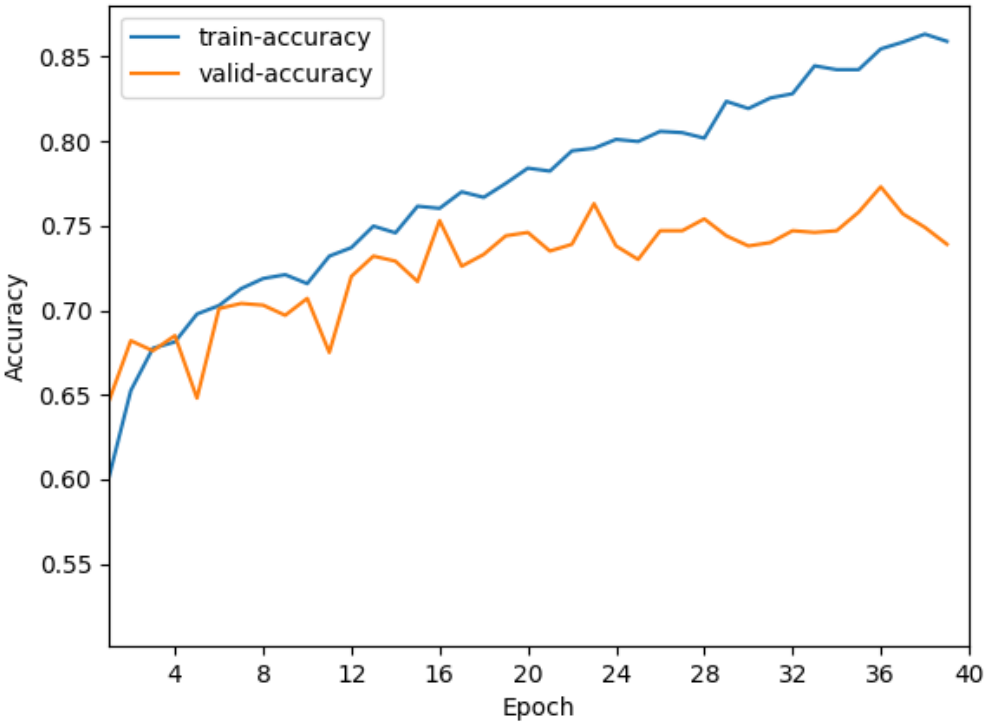
```
20    # training parameters
21    device = torch.device('cuda:0' if torch.cuda.is_available() else 'cpu')
22    epochs = 40
23    learning_rate = 0.01
```

訓練後的結果:

```
Epoch: 40/40
------------
Training: 100%|
Validation: 100%|
Training loss: 0.3185, validation loss: 0.5800
Training accuracy: 0.8590, validation accuracy: 0.7390

Finished Training
```

觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.70
0.65
0.60
0.55
0.50
0.45
0.40
0.35
0.30
4
8
12
16
20
24
28
32
36
40


train-accuracy
valid-accuracy
Accuracy
Epoch
0.85
0.80
0.75
0.70
0.65
0.60
0.55
4
8
12
16
20
24
28
32
36
40

觀察在測試集上的結果:

```
(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%|
Test accuracy: 74.2000%
```

Epoch:60

Batch size:32

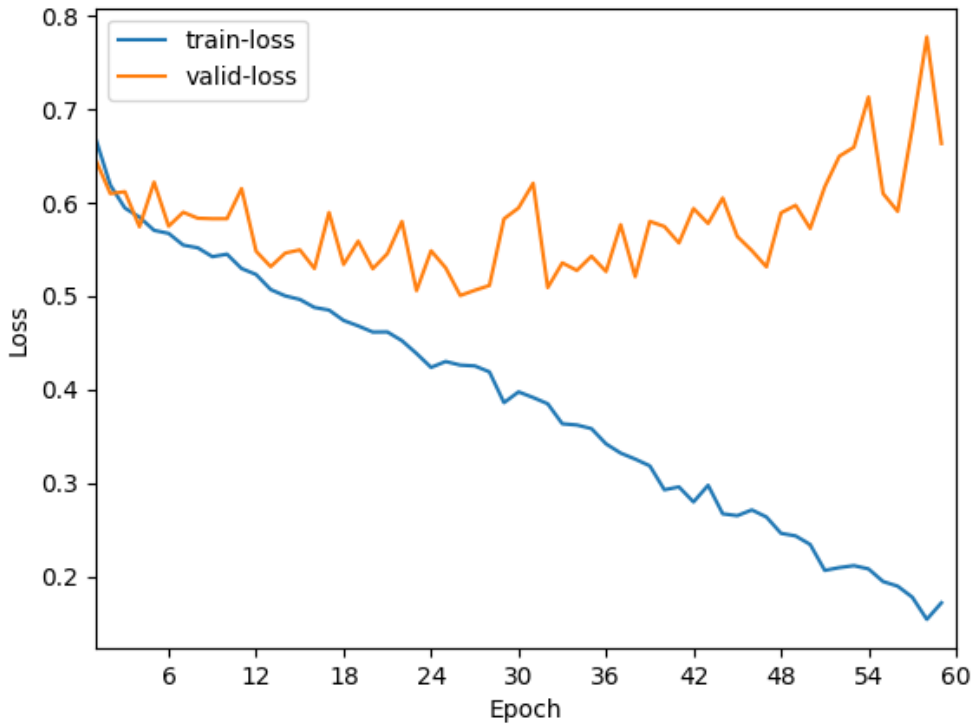
Learning rate:0.01

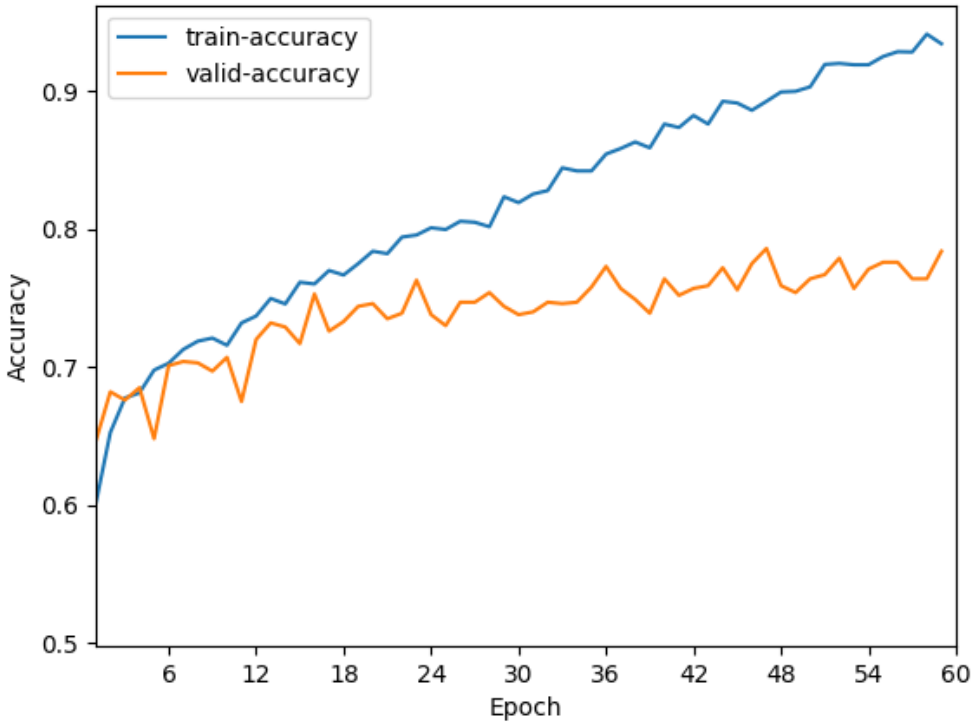
```
20    # training parameters
21    device = torch.device('cuda:0' if torch.cuda.is_available() else 'cpu')
22    epochs = 60
23    learning_rate = 0.01
```

訓練後的結果:

```
Epoch: 60/60
------------
Training: 100%|
Validation: 100%|
Training loss: 0.1720, validation loss: 0.6633
Training accuracy: 0.9345, validation accuracy: 0.7840

Finished Training
```

觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.8
0.7
0.6
0.5
0.4
0.3
0.2
6
12
18
24
30
36
42
48
54
60


train-accuracy
valid-accuracy
Accuracy
Epoch
0.9
0.8
0.7
0.6
0.5
6
12
18
24
30
36
42
48
54
60

觀察在測試集上的結果:

```
(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%|
Test accuracy: 74.2000%
```

Epoch:20

Batch size:8

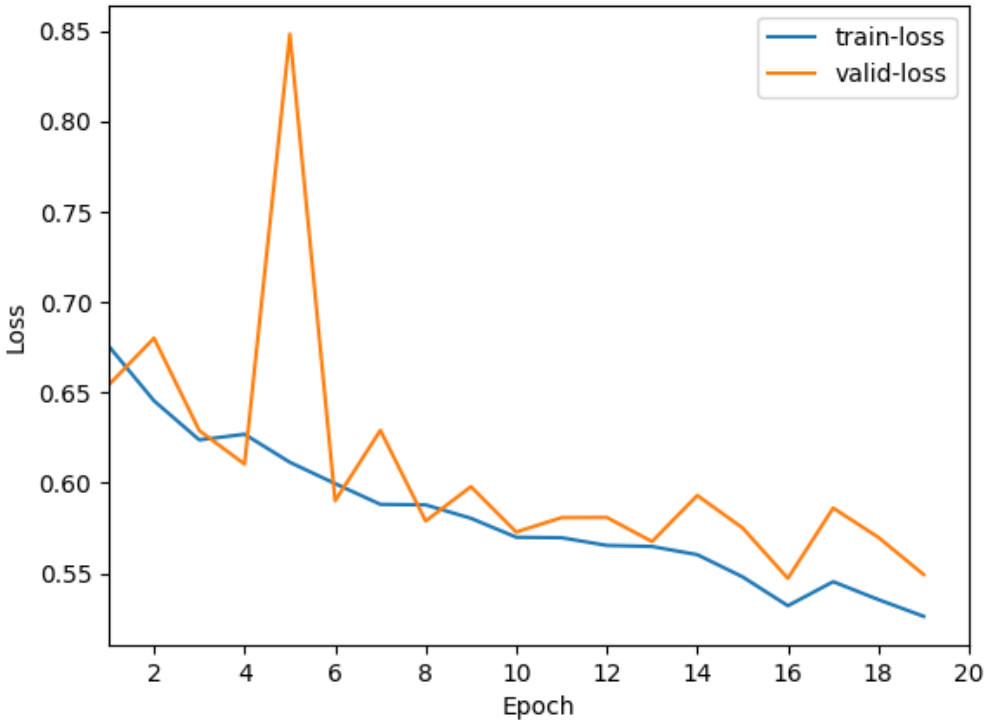
Learning rate:0.01

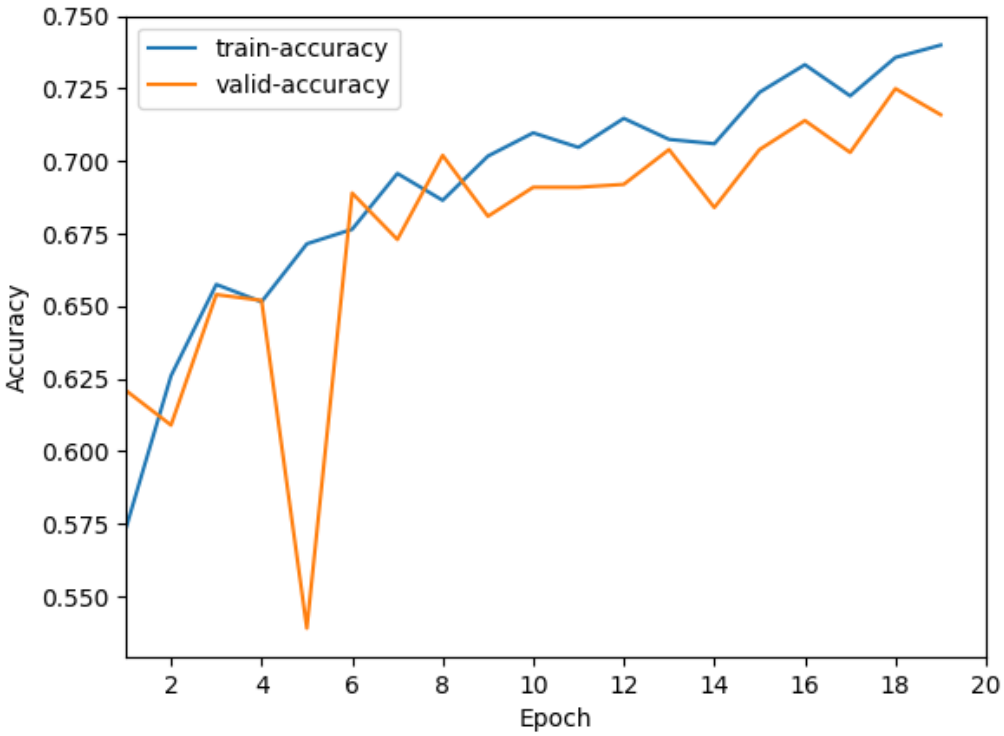
```
8   # you can modify batch size here
9   train_batch_size = 8
10  test_batch_size = 2
11  num_workers = 0
12  train_size_rate = 0.8   # split dataset into train and validation 8:2
```

訓練後的結果:

```
Epoch: 20/20
------------
Training: 100%|
Validation: 100%|
Training loss: 0.5262, validation loss: 0.5493
Training accuracy: 0.7400, validation accuracy: 0.7160

Finished Training
```

觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.85
0.80
0.75
0.70
0.65
0.60
0.55
2
4
6
8
10
12
14
16
18
20


train-accuracy
valid-accuracy
Accuracy
Epoch
0.750
0.725
0.700
0.675
0.650
0.625
0.600
0.575
0.550
2
4
6
8
10
12
14
16
18
20

觀察在測試集上的結果:

```
(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%|
Test accuracy: 70.0000%
```

Epoch:20

Batch size:16

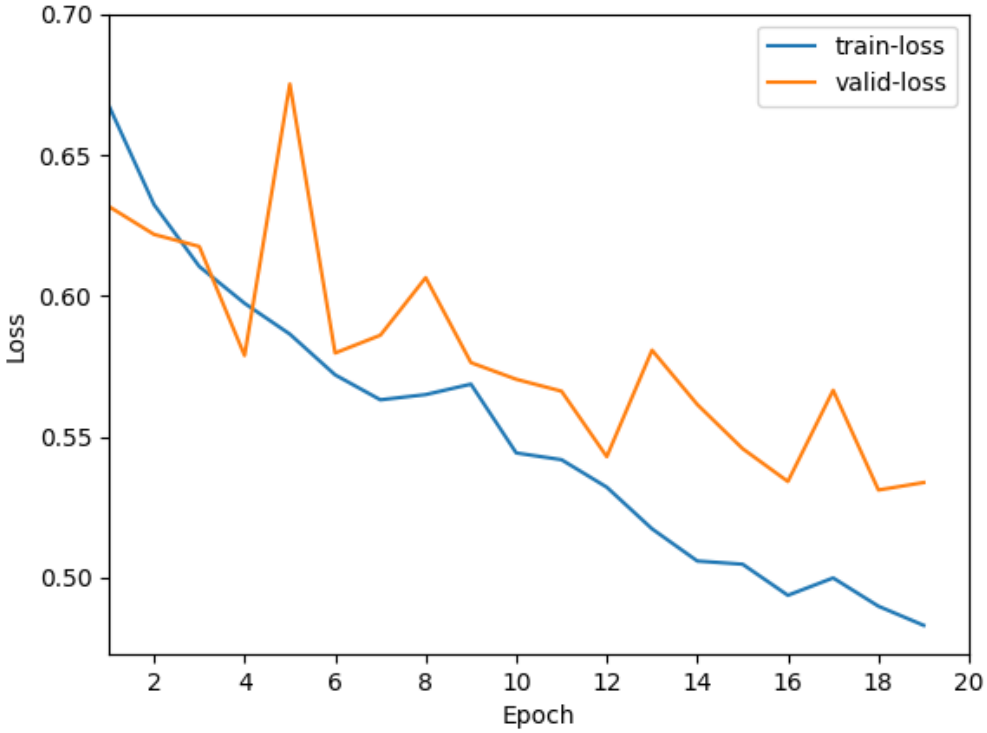
Learning rate:0.01

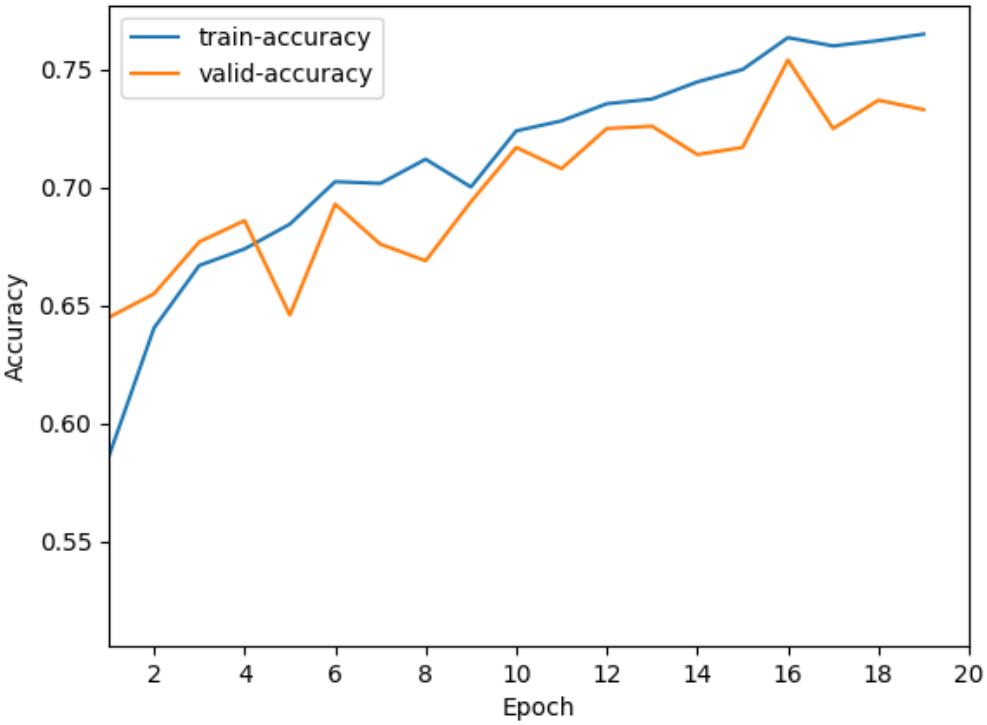
```
8   # you can modify batch size here
9   train_batch_size = 16
10  test_batch_size = 2
11  num_workers = 0
12  train_size_rate = 0.8   # split dataset into train and validation 8:2
```

訓練後的結果:

```
Epoch: 20/20
------------
Training: 100%|
Validation: 100%|
Training loss: 0.4831, validation loss: 0.5338
Training accuracy: 0.7650, validation accuracy: 0.7330

Finished Training
```

觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.70
0.65
0.60
0.55
0.50
2
4
6
8
10
12
14
16
18
20


train-accuracy
valid-accuracy
Accuracy
Epoch
0.75
0.70
0.65
0.60
0.55
2
4
6
8
10
12
14
16
18
20

觀察在測試集上的結果:

```
(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%|
Test accuracy: 74.1000%
```

Epoch:20

Batch size:32

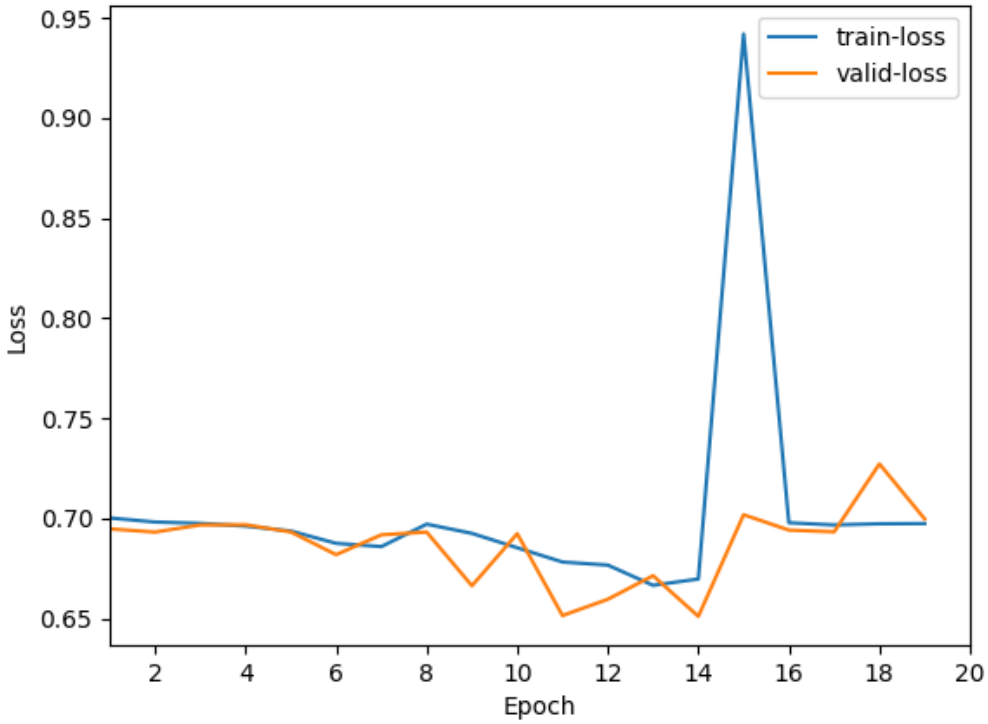
Learning rate:0.1

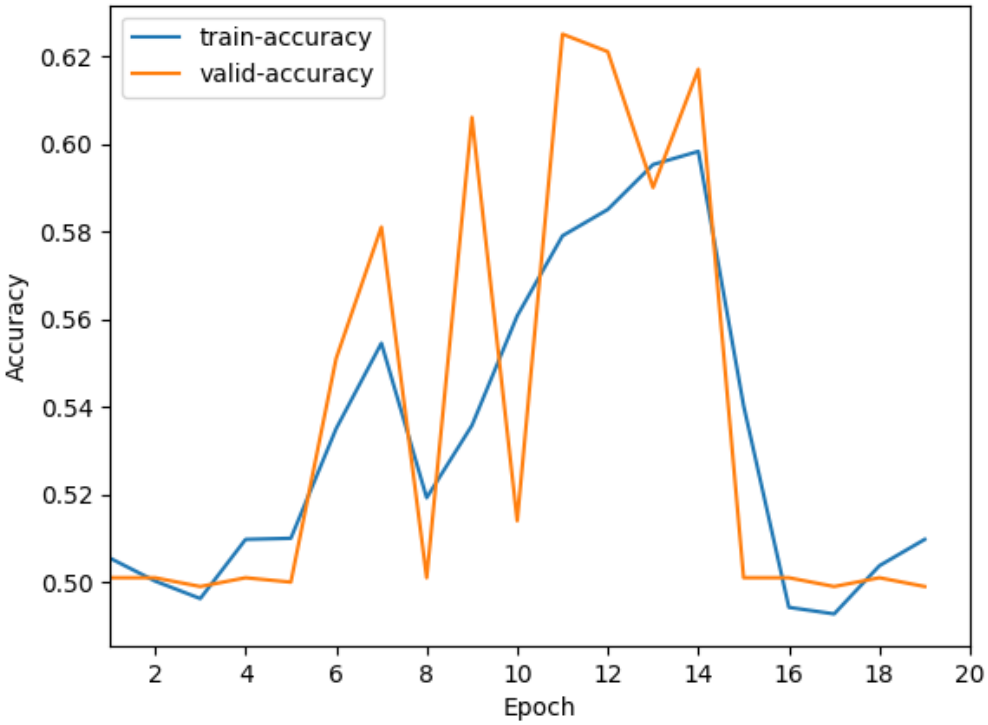
```
20   # training parameters
21   device = torch.device('cuda:0' if torch.cuda.is_available() else 'cpu')
22   epochs = 20
23   learning_rate = 0.1
```

訓練後的結果:

```
Epoch: 20/20
------------
Training: 100%|
Validation: 100%|
Training loss: 0.6974, validation loss: 0.6997
Training accuracy: 0.5098, validation accuracy: 0.4990

Finished Training
```

觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.95
0.90
0.85
0.80
0.75
0.70
0.65
2
4
6
8
10
12
14
16
18
20


train-accuracy
valid-accuracy
Accuracy
Epoch
0.62
0.60
0.58
0.56
0.54
0.52
0.50
2
4
6
8
10
12
14
16
18
20

觀察在測試集上的結果:

```
(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%|
Test accuracy: 60.9000%
```

Epoch:20

Batch size:32

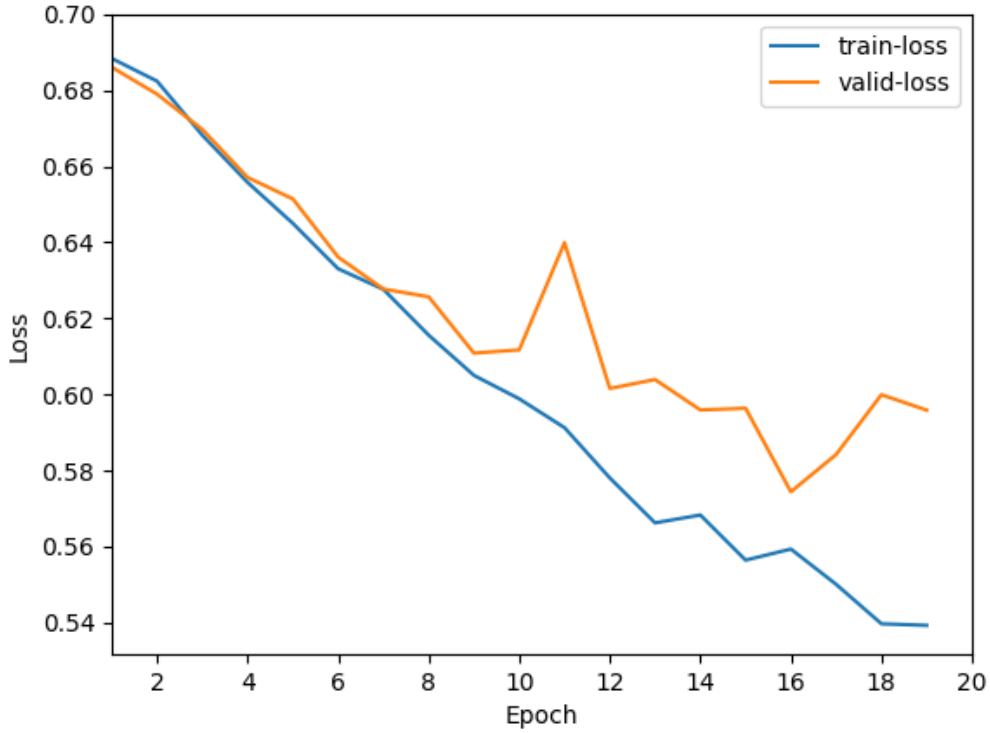
Learning rate:0.001

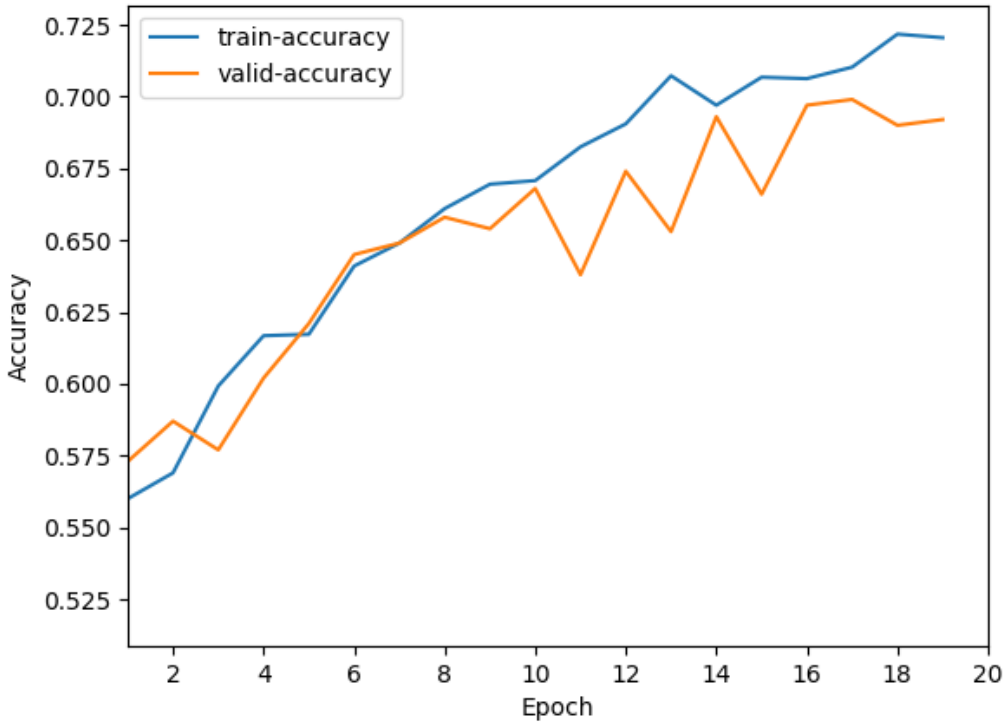
```
20    # training parameters
21    device = torch.device('cuda:0' if torch.cuda.is_available() else 'cpu')
22    epochs = 20
23    learning_rate = 0.001
```

訓練後的結果:

```
Epoch: 20/20
------------
Training: 100%|
Validation: 100%|
Training loss: 0.5393, validation loss: 0.5959
Training accuracy: 0.7205, validation accuracy: 0.6920

Finished Training
```

觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.70
0.68
0.66
0.64
0.62
0.60
0.58
0.56
0.54
2
4
6
8
10
12
14
16
18
20


train-accuracy
valid-accuracy
Accuracy
Epoch
0.725
0.700
0.675
0.650
0.625
0.600
0.575
0.550
0.525
2
4
6
8
10
12
14
16
18
20

觀察在測試集上的結果:

```
(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%|
Test accuracy: 66.4000%
```

作業要求-2

- 修改提供的 CNN model(修改 MyCNN model)

  參數調整:

  Epoch:60

  Batch size:32

  Learning rate:0.01

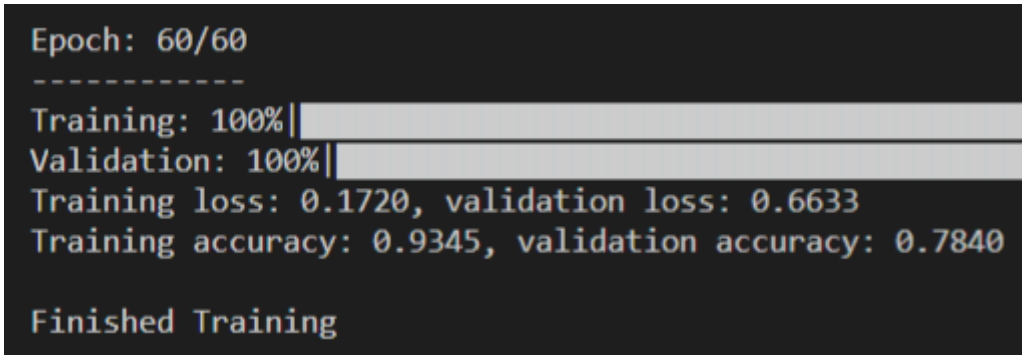
  增加一層 convolution layer。

```python
class MyCNN(nn.Module):
    def __init__(self):
        super(MyCNN, self).__init__()

        ############################### you need to modify the cnn model here ###################

        # after convolutoin, the feature map size = ((origin + padding*2 - kernel_size) / stride) +
        # input_shape=(3,224,224)
        self.cnn1 = nn.Conv2d(in_channels=3, out_channels=64, kernel_size=3, stride=1, padding=1)
        self.relu1 = nn.ReLU()
        self.maxpool1 = nn.MaxPool2d(kernel_size=2, stride=2)   # output_shape=(64,112,112) # (224),

        self.cnn2 = nn.Conv2d(in_channels=64, out_channels=64, kernel_size=3, stride=1, padding=1)
        self.relu2 = nn.ReLU()
        self.maxpool2 = nn.MaxPool2d(kernel_size=2)    # output_shape=(64,56,56)

        self.cnn3 = nn.Conv2d(in_channels=64, out_channels=64, kernel_size=3, stride=1, padding=1)
        self.relu3 = nn.ReLU()
        self.maxpool3 = nn.MaxPool2d(kernel_size=2)    # output_shape=(64,28,28)

        self.cnn4 = nn.Conv2d(in_channels=64, out_channels=64, kernel_size=3, stride=1, padding=1)
        self.relu4 = nn.ReLU()
        self.maxpool4 = nn.MaxPool2d(kernel_size=2)
```

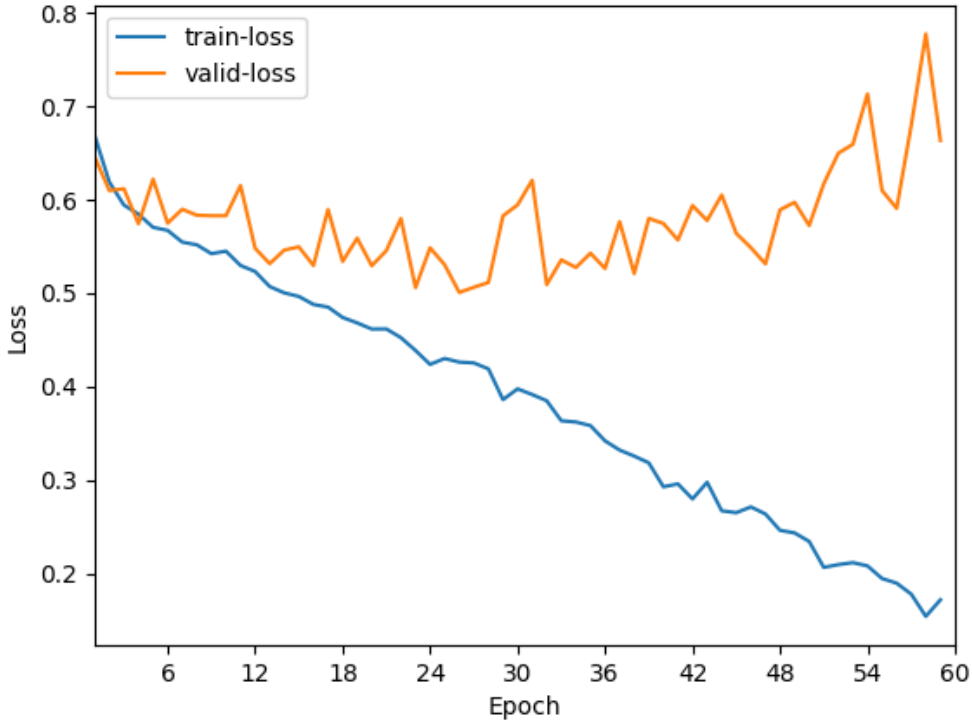
```
34          self.fc1 = nn.Linear(64*28*28, 512)
35          self.relu5 = nn.ReLU()
36          self.fc2 = nn.Linear(512, 512)
37          self.relu6 = nn.ReLU()
38          self.fc3 = nn.Linear(512, 512)
39          self.relu7 = nn.ReLU()
40          self.fc4 = nn.Linear(512, 2)
```

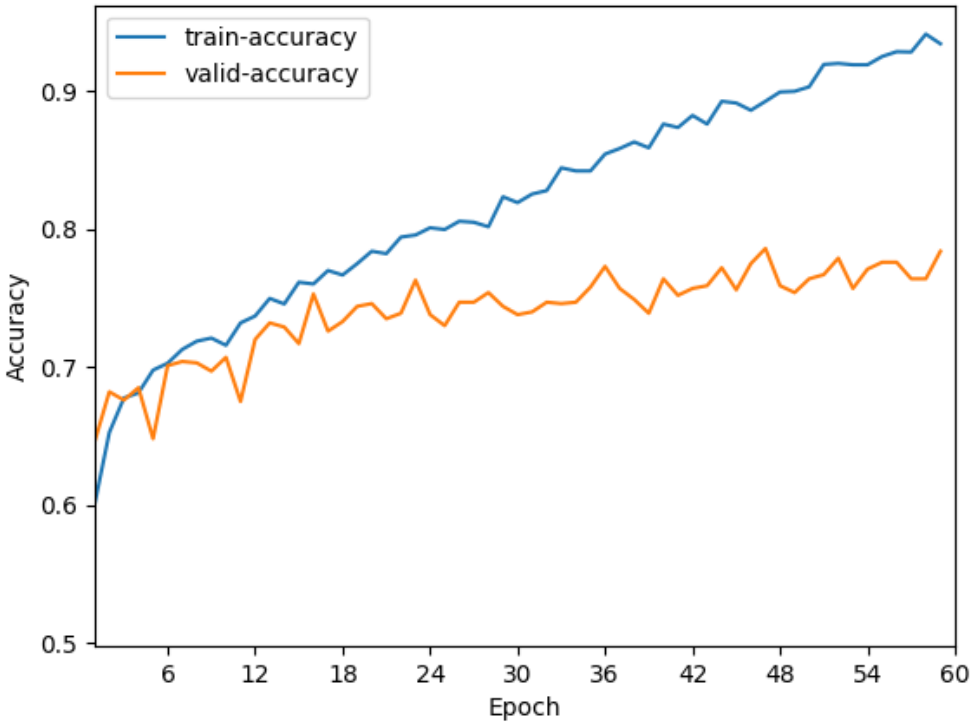
```
44      def forward(self, x):
45
46          ##############################
47          out = self.cnn1(x)
48          out = self.relu1(out)
49          out = self.maxpool1(out)
50          out = self.cnn2(out)
51          out = self.relu2(out)
52          out = self.maxpool2(out)
53          out = self.cnn3(out)
54          out = self.relu3(out)
55          out = self.maxpool3(out)
56          out = self.cnn4(out)
57          out = self.relu4(out)
58          out = self.maxpool4(out)
59
60          out = torch.flatten(out, 1)
61          out = self.fc1(out)
62          out = self.relu5(out)
63          out = self.fc2(out)
64          out = self.relu6(out)
65          out = self.fc3(out)
66          out = self.relu7(out)
67          out = self.fc4(out)
```

訓練後的結果:

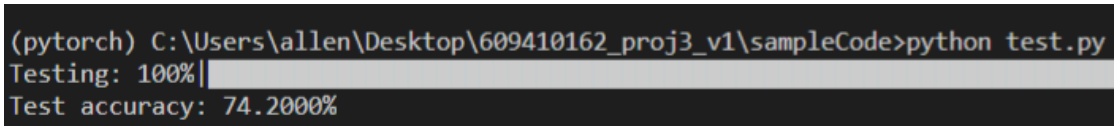


觀察並說明參數調整對損失函數及準確率的變化:


train-loss
valid-loss
Loss
Epoch
0.8
0.7
0.6
0.5
0.4
0.3
0.2
6
12
18
24
30
36
42
48
54
60


train-accuracy
valid-accuracy
Accuracy
Epoch
0.9
0.8
0.7
0.6
0.5
6
12
18
24
30
36
42
48
54
60

觀察在測試集上的結果:


(pytorch) C:\Users\allen\Desktop\609410162_proj3_v1\sampleCode>python test.py
Testing: 100%
Test accuracy: 74.2000%