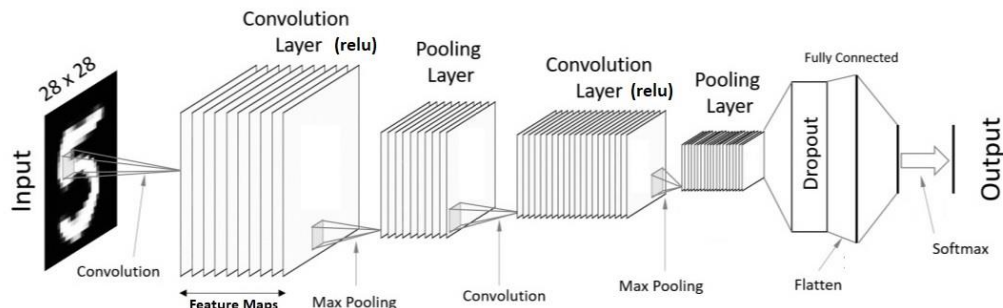


OASIS ML Group TRAINING 04

◆ CNN using PyTorch / from scratch

In this practice, you are going to build two CNN models which one is built from scratch and the other is built by using a useful framework called PyTorch. Please refer to the website which is in training slides for some useful tricks. The MNIST dataset is a common dataset for CNN. The original dataset is in a format that is difficult for beginners to use, so which I provided is used the work of Joseph Redmon to provide the MNIST dataset in a CSV format. **Shout out to Joseph Redmon!**

Follow the hints below to finish it.



□ Practice :

■ Analysis datasets :

The dataset consists of two files : mnist_train.csv, mnist_test.csv

The mnist_train.csv file contains the 60,000 training examples and labels. The mnist_test.csv contains 10,000 test examples and labels. Each row consists of 785 values: the first value is the label (a number from 0 to 9) and the remaining 784 values are the pixel values (a number from 0 to 255).

■ PyTorch :

- Please try to answer what's PyTorch?
- Why do we want to use it instead of using Python, Numpy ...only.

Hint 01 : Import library you needed.

For example : (*Below are frequently-used libraries*)

```
import os
import numpy as np
import pandas as pd
import torch
import torch.nn as nn
import torch.nn.functional as F
from torch.autograd import Variable
from sklearn.model_selection import train_test_split
import matplotlib.pyplot as plt
```



Hint 02 : Use pandas to read data. After that, I suggest to do datasets information analysis which show below.

```
Info of training dataset:
# of training samples: 60000, Shape: (60000, 785)
# of training pixels: 60000, Shape: (60000, 784)
# of classes: 10
# of labels: 60000, Shape: (60000,)

Info of testing dataset:
# of testing samples: 10000, Shape: (10000, 785)
# of testing pixels: 10000, Shape: (10000, 784)
# of labels: 10000, Shape: (10000,)
```

For hint 3 and hint 4, you are asked to visualize the datasets.

Hint 03 : Display some images in training datasets through code provided below.

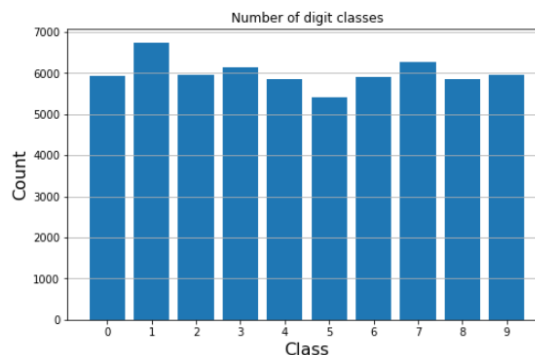
In the meantime, try to understand the code.

```
from torchvision.utils import make_grid

random_sel = np.random.randint(len(train), size=8)
print('random_sel index =', random_sel)

grid = make_grid(torch.Tensor((train.iloc[random_sel, 1:].values/255.).reshape((-1, 28, 28))).unsqueeze(1), nrow=8)
plt.rcParams['figure.figsize'] = (16, 2)
plt.imshow(grid.numpy().transpose((1,2,0)))
plt.axis('off')
print(*list(train.iloc[random_sel, 0].values), sep = ', ')
```

Hint 04 : Show the **histogram** of the classes through code provided below.



Hint 05 : Doing **normalization** through code provided below.

- Discuss why we need to do normalize?
- Discuss why we need to do “.astype(‘float32’)”?
- Discuss why divide 255?

```
X_train = X_train.astype('float32') / 255
X_test = X_test.astype('float32') / 255
```

Hint 06 : Split train datasets to “training” and “validation” by using train_test_split in sklearn. Remember to define test_size and random_state.

(Recommend test_size = 0.2~0.3)



Hint 07 : Use code below to convert datasets to Tensor and package into TensorDataset. Discuss why and what the code means~

(Remind : You will have three kinds of datasets after this step.)

For example :

```
ImgTrain = torch.from_numpy(img_train.values)
TargetTrain = torch.from_numpy(target_train.values).type(torch.LongTensor)

train = torch.utils.data.TensorDataset(ImgTrain, TargetTrain)
```

Hint 08 : Define Hyper-parameters by yourself.

Recommend initial parameters :

learning_rate = 0.01

batch_size = 100

n_iters = 10000

```
# Hyper Parameters
learning_rate = ???
batch_size = ???
n_iters = ???

num_epochs = int(n_iters / (len(img_train) / batch_size) ) <-- ???
```

(You can tune by yourself.)

Hint 09 : Construct **Dataloader** through code below.

- Discuss what's dataloader?

(Remind : You will have three dataloaders after this step.)

For example :

```
train_loader = torch.utils.data.DataLoader(train, batch_size = batch_size, shuffle = True)
```

Hint 10 : Construct CNN model.

You will construct a CNN model with Pytorch, and there are the actions of each layer. You should follow these SPEC to finish your CNN model.

```
# Convolution 1
self.cnn1 = nn.Conv2d(in_channels=1, out_channels=16, kernel_size=3, stride=1, padding=1)
self.batchnormalize1 = nn.BatchNorm2d(16)
self.relu1 = nn.ReLU()
self.maxpool1 = nn.MaxPool2d(kernel_size=2)

# Convolution 2
self.cnn2 = nn.Conv2d(in_channels=16, out_channels=32, kernel_size=3, stride=1, padding=2)
self.batchnormalize2 = nn.BatchNorm2d(32)
self.relu2 = nn.ReLU()
self.maxpool2 = nn.MaxPool2d(kernel_size=2)

# Fully connected
self.fc1 = nn.Linear(32 * 8 * 8, 10)
```

Hint 11 : Set the optimizer and loss_func.

```
optimizer = torch.optim.Adam(model.parameters(), lr=learning_rate)
loss_func = nn.CrossEntropyLoss()
input_shape = (-1, 1, 28, 28)
```



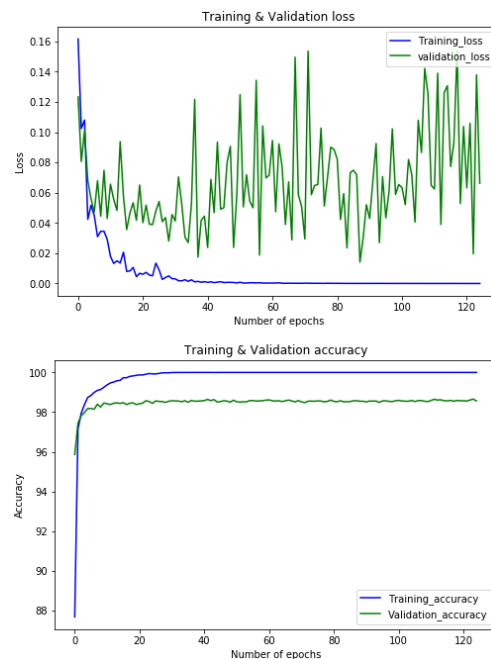
Hint 12 : Define train, evaluation, fit_model,...functions.

You can define functions to make the training or inference more easily.

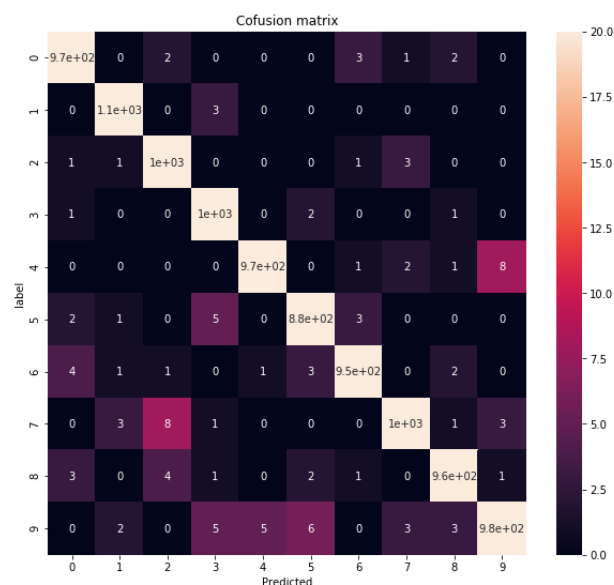
For example :

```
def train_model(model, loss_func, optimizer, input_shape, epoch, num_epochs, train_loader, .....):  
    ...  
    ...  
    ...  
    return ...
```

Hint 13 : After training, please show the testing result by using testing dataset. At the same time, please plot “Training & Validation loss curve” and “Training & Validation accuracy curve”.



Hint 14 : Plot the confusion matrix based on testing data and also print the accuracy of each digits.



Hint 15 :

After finishing the CNN model which is built with PyTorch, you have to implement it again **without using Tensor or Torch packages**. You should finish another CNN model **from scratch** which means you can **only use Numpy and other basic packages**. You also have to print the information above and discuss **what is the difference** between these two CNN models.

