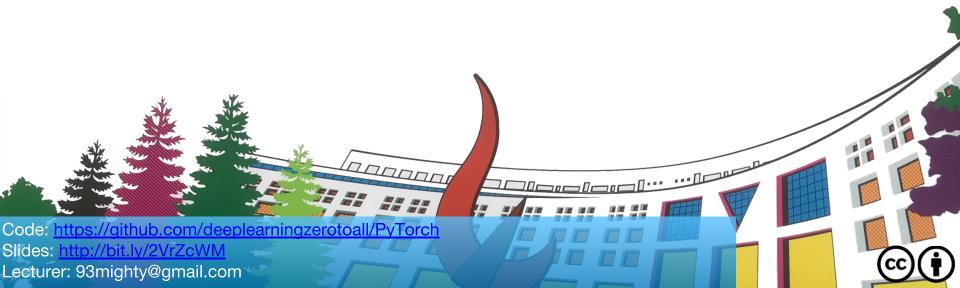
ML/DL for Everyone Season2

with PYTORCH

RNN - hihello / charseq



'Hihello' example

- 'Hihello' problem
- Data setting
 - One hot encoding
- Cross entropy loss
- Code run through

'hihello' problem

- 'h', 'i', 'h', 'e', 'l', 'l', 'o'
- We will predict the next character!
- How can we represent characters in PyTorch?

How can we represent characters?

We can represent them by index

```
○ 'h' -> 0
```

```
# list of available characters
char_set = ['h', 'i', 'e', 'l', 'o']
```

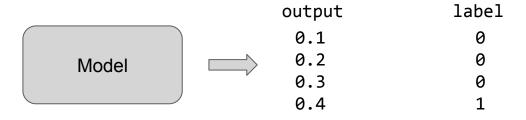
One-hot encoding

We need to encode using one-hot encoding!

```
# list of available characters
char set = ['h', 'i', 'e', 'l', 'o']
x data = [[0, 1, 0, 2, 3, 3]]
x_{one}hot = [[[1, 0, 0, 0, 0],
             [0, 1, 0, 0, 0],
             [1, 0, 0, 0, 0],
             [0, 0, 1, 0, 0],
             [0, 0, 0, 1, 0],
             [0, 0, 0, 1, 0]]
y data = [[1, 0, 2, 3, 3, 4]]
```

Cross Entropy Loss

Loss for categorical output (usually interpreted as probability)



```
# loss & optimizer setting
criterion = torch.nn.CrossEntropyLoss()
...
loss = criterion(outputs.view(-1, input size), Y.view(-1))
```

Code run through (hihello)

```
char_set = ['h', 'i', 'e', 'l', 'o']
# hyper parameters
input size = len(char set)
hidden_size = len(char_set)
learning_rate = 0.1
# data setting
x_{data} = [[0, 1, 0, 2, 3, 3]]
x_{one}hot = [[[1, 0, 0, 0, 0],
             [0, 1, 0, 0, 0],
             [1, 0, 0, 0, 0],
             [0, 0, 1, 0, 0],
             [0, 0, 0, 1, 0],
             [0, 0, 0, 1, 0]]]
y data = [[1, 0, 2, 3, 3, 4]]
```

```
# transform as torch tensor variable
X = torch.FloatTensor(x_one_hot)
Y = torch.LongTensor(y data)
```

Code run through (charseq)

```
sample = " if you want you"
# make dictionary
char set = list(set(sample))
char dic = {c: i for i, c in enumerate(char set)}
# hyper parameters
dic size = len(char dic)
hidden_size = len(char_dic)
learning rate = 0.1
# data setting
                                                            # transform as torch tensor variable
sample_idx = [char_dic[c] for c in sample]
                                                            X = torch.FloatTensor(x_one_hot)
x_{data} = [sample_idx[:-1]]
                                                            Y = torch.LongTensor(y data)
x_one_hot = [np.eye(dic_size)[x] for x in x_data]
y data = [sample idx[1:]]
```

Code run through

```
# declare RNN
rnn = torch.nn.RNN(input_size, hidden_size, batch_first=True) # batch_first guarantees the order of output = (B, S, F)
# loss & optimizer setting
criterion = torch.nn.CrossEntropyLoss()
optimizer = optim.Adam(rnn.parameters(), learning rate)
# start training
for i in range(100):
   optimizer.zero grad()
  outputs, status = rnn(X)
  loss = criterion(outputs.view(-1, input size), Y.view(-1))
  loss.backward()
  optimizer.step()
  result = outputs.data.numpy().argmax(axis=2)
  result str = ''.join([char set[c] for c in np.squeeze(result)])
   print(i, "loss: ", loss.item(), "prediction: ", result, "true Y: ", y data, "prediction str: ", result str)
```

What's Next?

- More complicated examples
 - Longer character sequence
 - Seq2seq (used in machine translation)