return_sequence = True라면? • 모든 시점의 hidden state가 출력됨 [6] 1 cell = layers.SimpleRNNCell(units = hidden_size) 2 rnn = layers.RNN(cell, return_sequences=True, return_state=False) 3 hidden state = rnn(train X) 5 print('train_X : {} \t shape : {}'.format(train_X, train_X.shape)) 6 print('hidden_state : {} \t shape : {}'.format(hidden_state, hidden_state.shape)) 7 # tensor (1,4,3) 출력 8 # 입력(x data)의 크기는 (1,4,5)였고, 모든 시점의 hidden state값을 출력하기 때문에 (1,4,3)가 됨 (시점을 의미하는 값 4) train_X : [[[1. 2. 3. 4. 5.] [2. 4. 6. 8. 10.] [1. 3. 5. 7. 9.] [0. 2. 4. 6. 8.]]] shape: (1, 4, 5)hidden_state : [[[-0.9994465 -0.99996233 -0.37031716] -1. -0.90804714] [-1.[-1.-1. -0.8969634] [-0.99999756 -0.9999984 -0.84814155]]] shape : (1, 4, 3)ranturn_state = True라면? • return_sequence의 값이 True/False인지 관계없이 마지막 시점의 은닉상태를 출력 1 cell = layers.SimpleRNNCell(units = hidden size) [7] 2 rnn = layers.RNN(cell, return sequences=True, return state=True) 3 hidden state, last state = rnn(train X) 5 print('train_X : {} \t shape : {}'.format(train_X, train_X.shape)) 6 print('hidden state : {} \t shape : {}'.format(hidden state, hidden state.shape)) 7 print('last_state : {} \t shape : {}'.format(last_state, last_state.shape)) train_X : [[[1. 2. 3. 4. 5.] [2. 4. 6. 8. 10.] [1. 3. 5. 7. 9.] [0. 2. 4. 6. 8.]]] shape: (1, 4, 5) hidden_state : [[[-0.99792796 -0.95558643 -0.9975007] [-1.-0.993731 -0.99999946] [-0.99999946 -0.9938855 -0.9999858] [-0.9999985 -0.99388856 -0.9996284]]] shape: (1, 4, 3)last_state : [[-0.9999985 -0.99388856 -0.9996284]] shape : (1, 3) return_sequence = False인데 return_state = True인 경우는? 마지막 시점의 hidden state 출력 1 cell = layers.SimpleRNNCell(units = hidden_size) 2 rnn = layers.RNN(cell, return_sequences=False, return_state=True) 3 hidden state, last state = rnn(train X) 5 print('train X : {} \t shape : {}'.format(train X, train X.shape)) 6 print('hidden_state : {} \t shape : {}'.format(hidden_state, hidden_state.shape)) 7 print('last_state : {} \t shape : {}'.format(last_state, last_state.shape)) → train_X : [[[1. 2. 3. 4. 5.] [2. 4. 6. 8. 10.] [1. 3. 5. 7. 9.] [0. 2. 4. 6. 8.]]] shape: (1, 4, 5)hidden_state : [[0.9999937 -0.9999158 0.9999802]] shape: (1, 3)last_state : [[0.9999937 -0.9999158 0.9999802]] shape: (1, 3)

Q

{*x*}

<>

 \equiv

```
□ LSTM
```

{*x*}

RNN에서 중요한 파라미터인 return_sequences와 return_state에 대해 알아본것 처럼 LSTM의 경우에도 한번 확인해보자

- 두 파라미터의 default 값은 False이다
- return_sequences=False, return_state=True 인경우

last state : [[-1.3770610e-04 -7.3374641e-01 5.8478165e-02]]

last cell state : [[-0.00638166 -2.6925592 1.0004491]]

```
1 from keras.layers import LSTM
      3 # 우선 hidden size는 임의로 3으로 정한다.
      4 hidden size = 3 # hidden state 차원수
      5 lstm = LSTM(units=hidden_size, return_sequences=False, return_state=True)
      6 hidden_state, last_state, last_cell_state = lstm(train_X)
      8 print('train_X : {} \t shape : {}'.format(train_X, train_X.shape))
      9 print('hidden state : {} \t shape : {}'.format(hidden state, hidden state.shape))
     10 print('last_state : {} \t shape : {}'.format(last_state, last_state.shape))
     11 print('last cell state : {} \t shape : {}'.format(last cell state, last cell state.shape))
     12 # return sequence가 False일때는 마지막 hidden state가 출력되므로 hidden state = last cell state의 결과값이 같다
     13 # RNN과 LSTM의 차이점은 LSTM의 경우 return_state = True인 경우 last_cell_state까지 출력해준다는 것이 다른다
     train_X : [[[ 1. 2. 3. 4. 5.]
       [ 2. 4. 6. 8. 10.]
       [ 1. 3. 5. 7. 9.]
       [ 0. 2. 4. 6. 8.]]]
                                     shape: (1, 4, 5)
     hidden state: [[ 0.20272215 -0.0699851 -0.5315128 ]] shape: (1, 3)
     last_state : [[ 0.20272215 -0.0699851 -0.5315128 ]]
                                                            shape: (1, 3)
     last_cell_state : [[ 3.3949492 -1.0960821 -0.9628552]] shape : (1, 3)

    return_sequences=True, return_state=True 인경우

[10] 1 # 우선 hidden size는 임의로 3으로 정한다.
      2 hidden size = 3 # hidden state 차원수
      3 lstm = LSTM(units=hidden size, return sequences=True, return state=True)
      4 hidden state, last state, last cell state = lstm(train X)
      6 print('train_X : {} \t shape : {}'.format(train_X, train_X.shape))
      7 print('hidden state : {} \t shape : {}'.format(hidden state, hidden state.shape))
      8 print('last_state : {} \t shape : {}'.format(last_state, last_state.shape))
      9 print('last cell state : {} \t shape : {}'.format(last cell state, last cell state.shape))
     10 # return sequence가 True인 경우 모든 hidden state값이 출력되므로 4개 값에대한 hidden state가 모두 출력되었다.
     train_X : [[[ 1. 2. 3. 4. 5.]
       [ 2. 4. 6. 8. 10.]
       [ 1. 3. 5. 7. 9.]
       [ 0. 2. 4. 6. 8.]]]
                                     shape: (1, 4, 5)
     hidden state : [[[-9.0078515e-04 -5.3682184e-01 1.3619630e-01]
       [-1.8837634e-05 -8.1220323e-01 3.7216518e-02]
       [-3.3685516e-05 -7.8859210e-01 4.6560906e-02]
       [-1.3770610e-04 -7.3374641e-01 5.8478165e-02]]]
                                                            shape: (1, 4, 3)
```

shape : (1, 3)

shape: (1, 3)

```
¬ GRU
```

```
{x}
           1 from keras.layers import GRU
      [11]
3 # 우선 hidden size는 임의로 3으로 정한다.
            4 hidden size = 3 # hidden state 차원수
            5 gru = GRU(units=hidden size, return sequences=False, return state=True)
            6 hidden state, last state, last_cell_state = lstm(train_X)
            7
            8 print('train X : {} \t shape : {}'.format(train X, train X.shape))
            9 print('hidden state : {} \t shape : {}'.format(hidden state, hidden state.shape))
           10 print('last state : {} \t shape : {}'.format(last state, last state.shape))
           11 print('last cell state : {} \t shape : {}'.format(last cell state, last cell state.shape))
           train X : [[[ 1. 2. 3. 4. 5.]
            [ 2. 4. 6. 8. 10.]
            [ 1. 3. 5. 7. 9.]
             [ 0. 2. 4. 6. 8.]]]
                                           shape: (1, 4, 5)
           hidden state : [[[-9.0078515e-04 -5.3682184e-01 1.3619630e-01]
             [-1.8837634e-05 -8.1220323e-01 3.7216518e-02]
            [-3.3685516e-05 -7.8859210e-01 4.6560906e-02]
             [-1.3770610e-04 -7.3374641e-01 5.8478165e-02]]]
                                                                   shape: (1, 4, 3)
           last_state : [[-1.3770610e-04 -7.3374641e-01 5.8478165e-02]]
                                                                          shape: (1, 3)
           last cell state : [[-0.00638166 -2.6925592 1.0004491 ]]
                                                                          shape: (1, 3)
   0章 [12]
           1 gru = GRU(units=hidden_size, return_sequences=True, return_state=True)
            2 hidden state, last state, last cell state = lstm(train X)
            3
            4 print('train X : {} \t shape : {}'.format(train X, train X.shape))
            5 print('hidden state : {} \t shape : {}'.format(hidden state, hidden state.shape))
            6 print('last state : {} \t shape : {}'.format(last state, last state.shape))
            7 print('last cell state : {} \t shape : {}'.format(last cell state, last cell state.shape))
           train X : [[[ 1. 2. 3. 4. 5.]
            [ 2. 4. 6. 8. 10.]
            [ 1. 3. 5. 7. 9.]
             [ 0. 2. 4. 6. 8.]]]
                                           shape: (1, 4, 5)
           hidden state : [[[-9.0078515e-04 -5.3682184e-01 1.3619630e-01]
             [-1.8837634e-05 -8.1220323e-01 3.7216518e-02]
            [-3.3685516e-05 -7.8859210e-01 4.6560906e-02]
                                                                   shape: (1, 4, 3)
             [-1.3770610e-04 -7.3374641e-01 5.8478165e-02]]]
           last state : [[-1.3770610e-04 -7.3374641e-01 5.8478165e-02]]
                                                                          shape : (1, 3)
           last cell state : [[-0.00638166 -2.6925592 1.0004491 ]]
                                                                          shape: (1, 3)
```