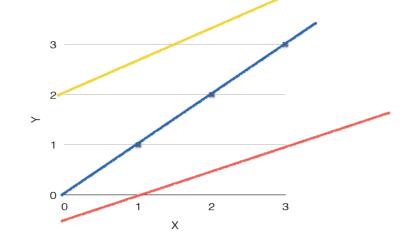
Machine Learning 1주차

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Lec2. Linear regression

► 어떤 선이 Data에 맞는 선일까? -> 학습을 통해 찾는 것



- ► Step1. H(x) = Wx+ b 로 Hypothesis
- ▶ Step2. cost function으로 최적 Linear찾기

Cost Function

- \triangleright Cost function basis form =>H(x) y
- ightharpoonup H(x)는 원하는 가설, y는 실제 값
- $ightharpoonup cost(W,b) = \frac{1}{m} \sum (H(x^i) y^i)^2$ 로 정리
- ▶ 목표: minimize cost(W, b)

```
import tensorflow as tf
# X and Y data
x_{train} = [1, 2, 3]
y train = [1, 2, 3]
W = tf.Variable(tf.random normal([1]), name='weight')
b = tf.Variable(tf.random normal([1]), name='bias')
# Our hypothesis XW+b
hypothesis = x train * W + b
# cost/loss function
cost = tf.reduce mean(tf.square(hypothesis - y train))
                             중복?
# Minimize
optimizer = tf.train.GradientDescentOptimizer(learning rate=0.01)
train = optimizer.minimize(cost)
# Launch the graph in a session.
sess = tf.Session()
# Initializes global variables in the graph.
sess.run(tf.global variables initializer())
# Fit the Line
for step in range(2001):
   sess.run(train)
   if step % 20 == 0:
       print(step, sess.run(cost), sess.run(W), sess.run(b))
```

Full code (less than 20 lines)

```
0 2.82329 [ 2.12867713] [-0.85235667]
20 0.190351 [ 1.53392804] [-1.05059612]
40 0.151357 [ 1.45725465] [-1.02391243]
...

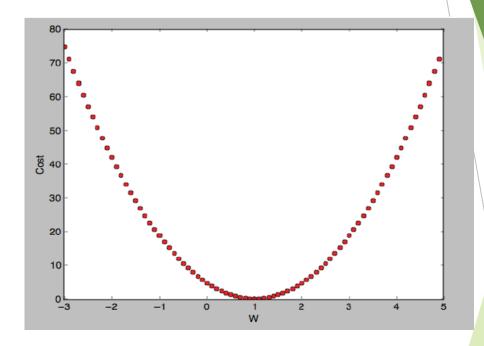
1920 1.77484e-05 [ 1.00489295] [-0.01112291]
1940 1.61197e-05 [ 1.00466311] [-0.01060018]
1960 1.46397e-05 [ 1.004444] [-0.01010205]
1980 1.32962e-05 [ 1.00423515] [-0.00962736]
2000 1.20761e-05 [ 1.00403607] [-0.00917497]
```

Lec3. How to minimize cost

▶ 우선 Simplified hypothesis

$$H(x) = Wx + b$$

$$cost(W) = \frac{1}{m} \sum (Wx^i - y^i)^2$$



Gradient descent algorithm

$$cost(W) = \frac{1}{m} \sum (Wx^i - y^i)^2$$



$$cost(W) = \frac{1}{2m} \sum (Wx^i - y^i)^2$$

중간에 사라지는 이유??

$$\blacktriangleright W := W - \alpha \frac{\partial}{\partial W} cost(W)$$

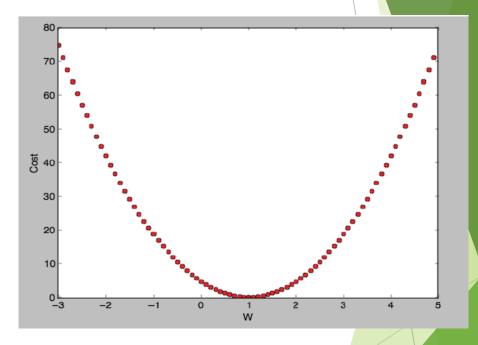
Formal definition

충분히 작지 않으면?

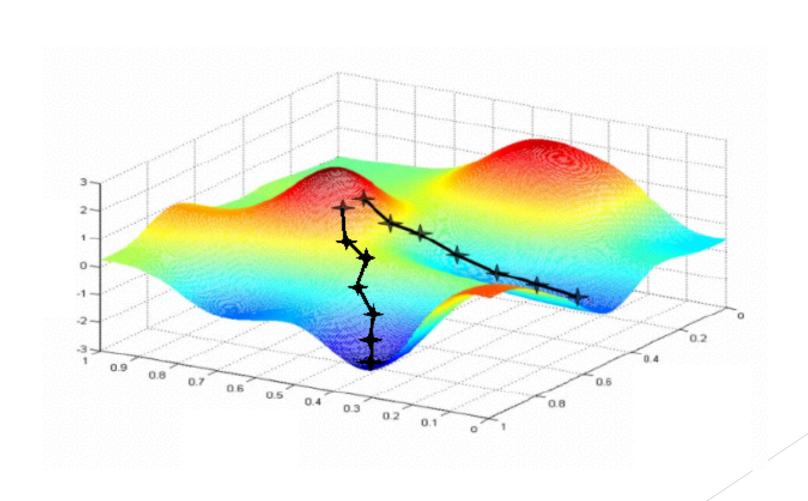
$$W := W - \alpha \frac{\partial}{\partial W} \frac{1}{2m} \sum_{i=1}^{m} (Wx^{(i)} - y^{(i)})^2$$

$$W := W - \alpha \frac{1}{2m} \sum_{i=1}^{m} 2(Wx^{(i)} - y^{(i)})x^{(i)}$$

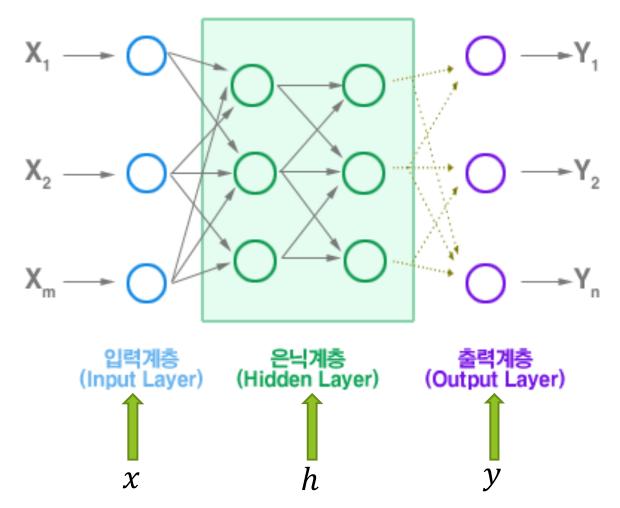
$$W := W - \alpha \frac{1}{m} \sum_{i=1}^{m} (Wx^{(i)} - y^{(i)})x^{(i)}$$



Non-convex



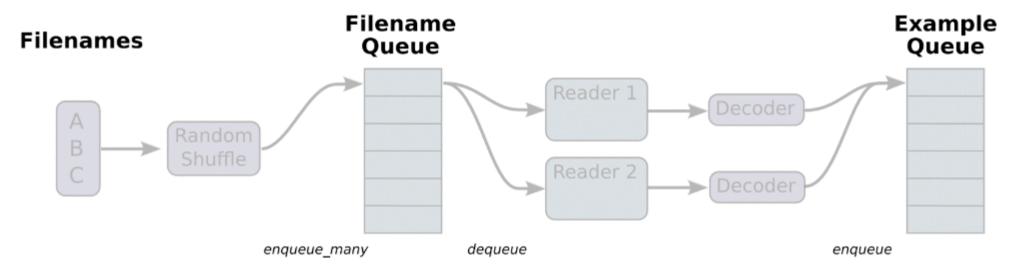
Lec4. 종합 정리



 $h_1 = f(w_1x_1 + w_2x_2 + w_3x_3 + b)$; (b는 bias, 평행이동)

```
or: data-01-test-score.csv not found.
           [14]: xy = np.loadtxt('c:\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Users\\Undomno\Users\\Users\\Undomno\Undomno\Users\\Users\\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undomno\Undo
             [15]: x_data = xy[:, 0:-1]
         [16]: y_data = xy[:, [-1]]
               88. 93.]
91. 90.]
                           98. 100.]
66. 70.]
                                              55.]] 6
                                   print(y_data.shape, y_data)
(6, 1) [[152.]
[185.]
[180.]
           [19]: X = tf.placeholder(tf.float32, shape=[None, 3])
             [20]: Y = tf.placeholder(tf.float32, shape=[None, 1])
            [21]: W = tf.Variable(tf.random_normal([3, 1]), name='weight')
           [22]: b = tf.Variable(tf.random_normal([1]), name='bias')
             [23]: hypothesis = tf.matmul(X, W) + b
            [24]: cost = tf.reduce_mean(tf.square(hypothesis - Y))
             [25]: optimizer = tf.train.GradientDescentOptimizer(learning_rate=1e-5)
             [26] train = optimizer.minimize(cost)
 In [27]: sess = tf.Session()
2018-03-14 17:50:52.023087: | C:\tf_jenkins\workspace\morkspace\morkspace\morkspace\morkspace\more\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\more\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\morkspace\mor
              [28]: sess.run(tf.global_variables_initializer())
             [29]: for step in range(2001):
                                                  cost_val, hy_val, _ = sess.run([cost, hypothesis, train],feed_dict={X: x_data, Y: y_data})
                                  if step % 10 == 0:
                                                           print(step, "Cost: ", cost_val,"\nPrediction:\n", hy_val)
 2000 Cost: 2.7586195
      rediction:
             154.27278 ]
                                    print("Your_score will_be ", sess.run(hypothesis,feed_dict={X: [[100, 70, 101]]}))
 Your score will be [[171.15341]]
```

- filename_queue = tf.train.string_input_producer(
 ['data-01-test-score.csv', 'data-02-test-score.csv', ...],
 shuffle=False, name='filename_queue')
 - record_defaults = [[0.], [0.], [0.], [0.]]
 xy = tf.decode_csv(value, record_defaults=record_defaults)



reader = tf.TextLineReader()
key, value = reader.read(filename_queue)

Generalized expression?(irls)

Iteratively reweighted least squares

From Wikipedia, the free encyclopedia

For iterated weighted least squares, see Feasible generalized least squares.

The method of iteratively reweighted least squares (IRLS) is used to solve certain optimization problems with objective functions of the form:

$$rg\min_{oldsymbol{eta}} \sum_{i=1}^n ig| y_i - f_i(oldsymbol{eta}) ig|^p,$$

by an iterative method in which each step involves solving a weighted least squares problem of the form:[1]

$$oldsymbol{eta}^{(t+1)} = rg\min_{oldsymbol{eta}} \sum_{i=1}^n w_i(oldsymbol{eta}^{(t)}) ig| y_i - f_i(oldsymbol{eta}) ig|^2.$$

Intro(수업x)

Types of Machine Learning

Machine Learning

Supervised

Task driven (Regression / Classification)

Unsupervised

Data driven (Clustering)

Reinforcement

Algorithm learns to react to an environment

수업 정리

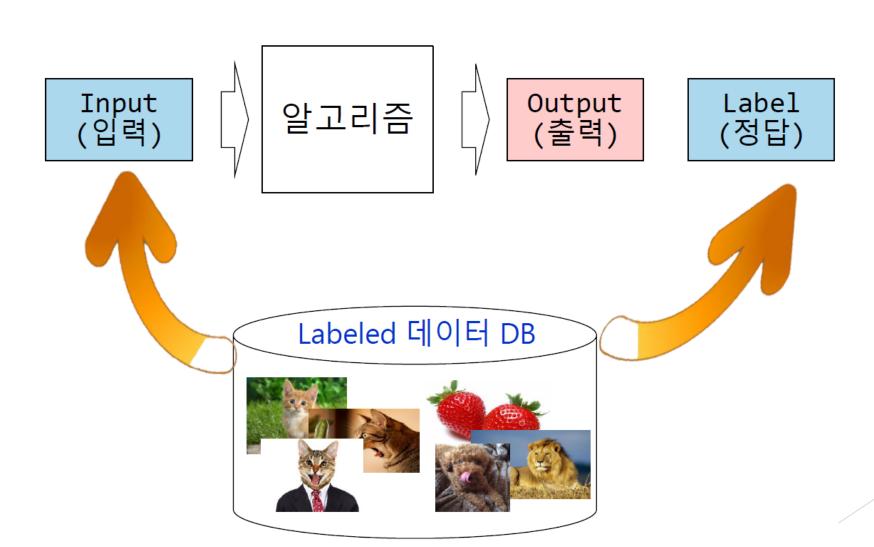
- ▶ 보통은 fully connected : 이전 단계 모든 뉴런과 연결
- ▶ CNN은 fully connected 하지 않다.
- ▶ DNN은 더 복잡한 함수 표현 가능하다.
- ► (chain rule??)
- ▶ (nonlinear 함수를 복잡하게)

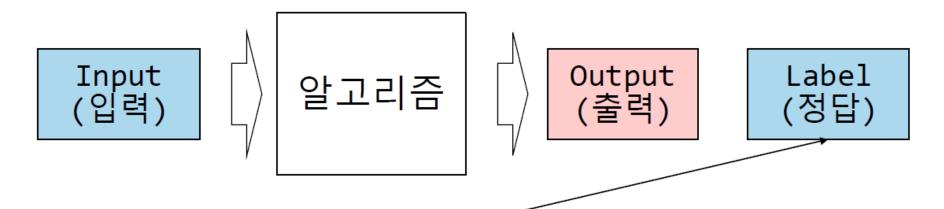
수업 정리

- Supervised learning
 - ▶ 데이터가 충분히 필요하다.(labeling또한 필요)
 - ▶ 정답도 같이 수집(high cost)

- Unsupervised learning
 - ▶ 데이터 label이 없는 것(feature 입력 x)
 - ▶ 데이터 축약(feature)->데이터 복원
 - ▶ data driven approach->딥러닝이 feature expression (특징추출)

Supervised Learning(지도 학습)

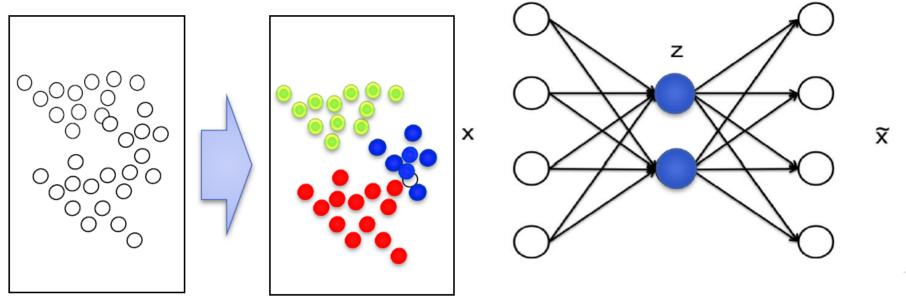




- ♥ Label은 대개 정확한 해답이나 정확한 분류(class)를 말함
- ♥ Classification : 정확한 class
 - + 예) 0~9이미지 분류시 label은 0~9
- ♥ Regression : 정확한 수치
 - + 환율 예측시 환율이 label

Unsupervised Learning (비지도 학습)

- ♥ 데이터의 label이 없는 데, 패턴을 알고 싶을 때
- Clustering 등
- ♥ 데이터 압축



Clustering

Reconstruction Error

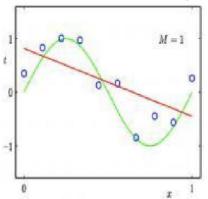
수업 정리

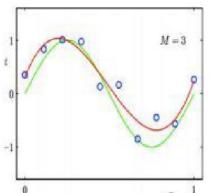
- ▶ 1) overfitting-> 너무 크게 잡는 것,
- ▶ (이미 뭐든 데이터 샘플을 암기)
- ▶ training sample작을 때 overfitting일어난다.
- ▶ 2) <u>underfitting</u>-> network가 충분히 깊고 크기 않아서 혹은 데이터가 작아서
- ▶ Deep learning인 경우 충분히 layer가 깊어야 효율UP (bottleneck 제거)

Under- and Over-fitting examples

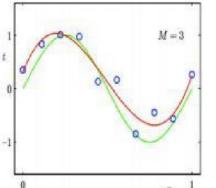
underfitting

Regression:

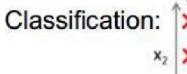


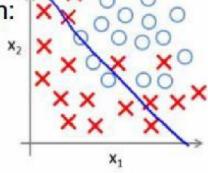


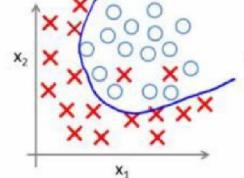
predictor too inflexible: cannot capture pattern

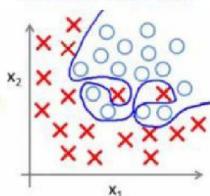


predictor too flexible: fits noise in the data









overfitting

M = 9