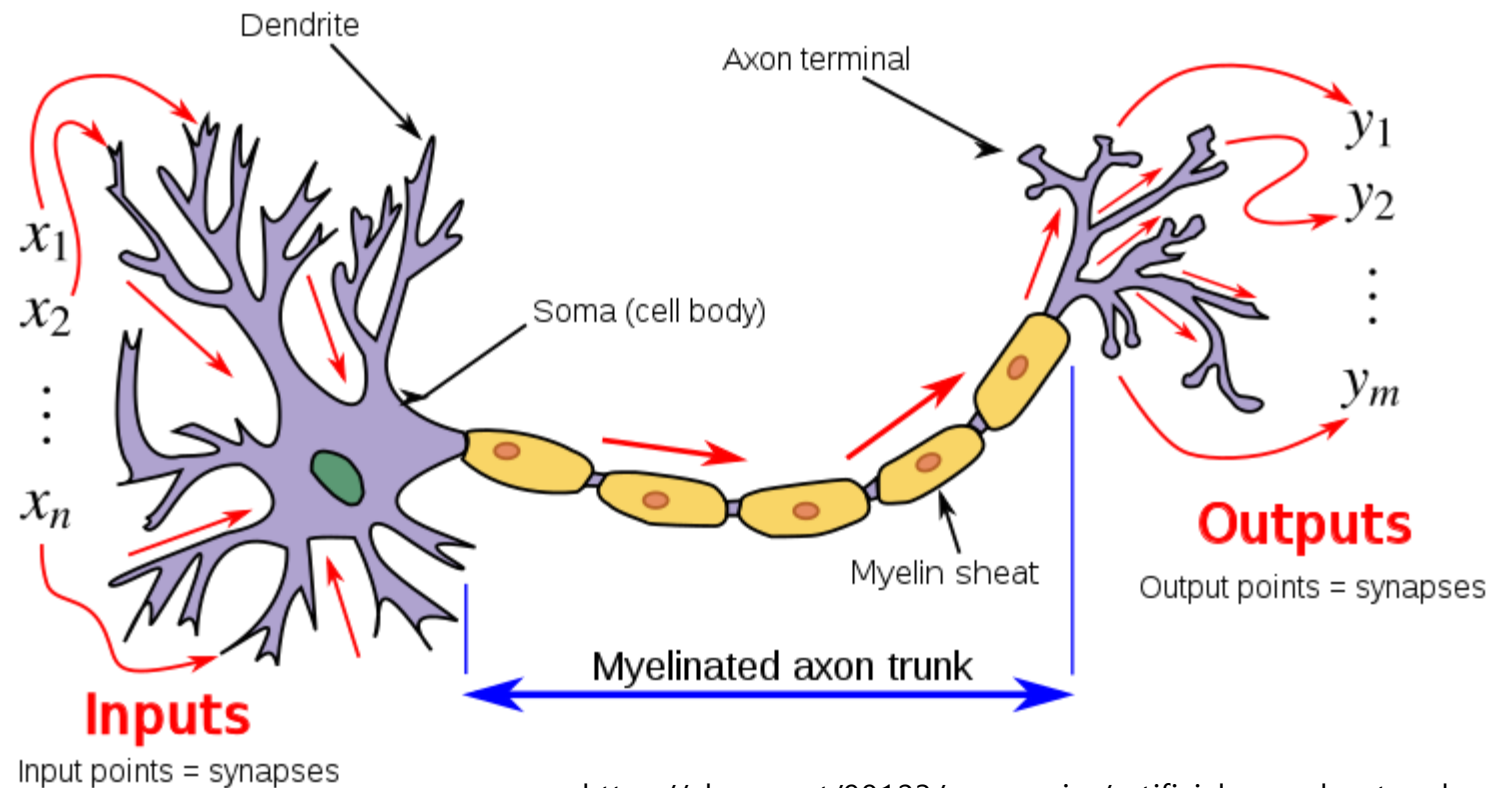




# Neural Network

# Neural Network



[https://ebrary.net/98123/economics/artificial\\_neural\\_networks](https://ebrary.net/98123/economics/artificial_neural_networks)

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Blockchain @ SNU

# NEURAL NETWORK

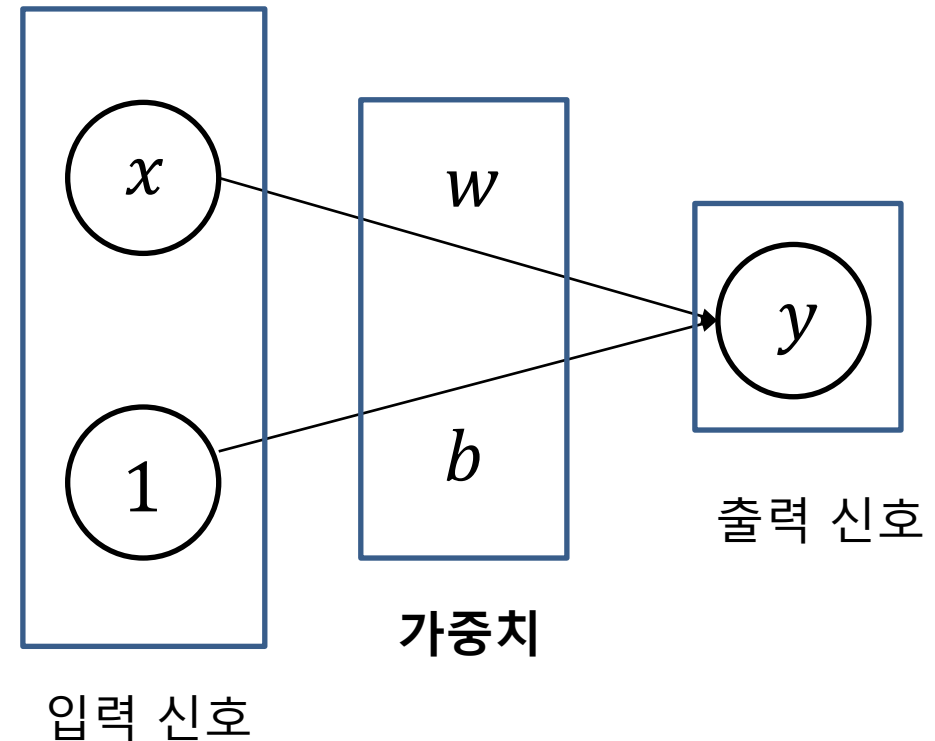
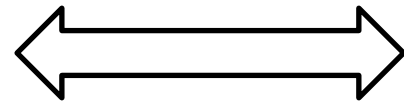
# 선형회귀와 신경망

Source: <https://blockchain.berkeley.edu/decal/>

## ■ 퍼셉트론

- 다수의 신호를 입력 받아 하나의 신호를 출력
- 선형회귀는 하나의 퍼셉트론으로 구현 가능

$$wx + b = y$$



# 역전파와 순전파

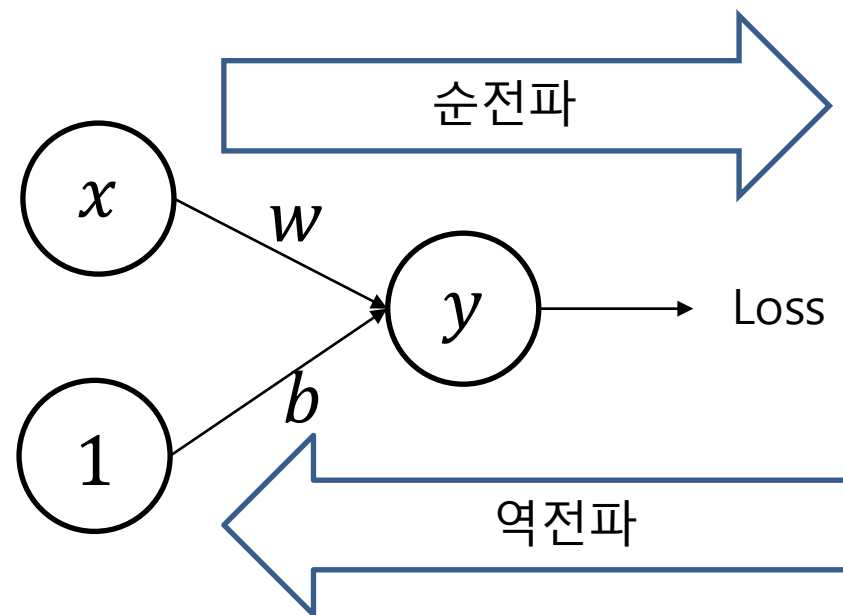
목표: 역전파를 통해 좋은 가중치를 찾자!

## ■ 순전파

- 데이터처리 → 모델 구현 → 예측값 도출 → 손실함수 계산

## ■ 역전파

- 기울기계산 → 개선방향 구하기 → **가중치 개선**



# 역전파와 순전파

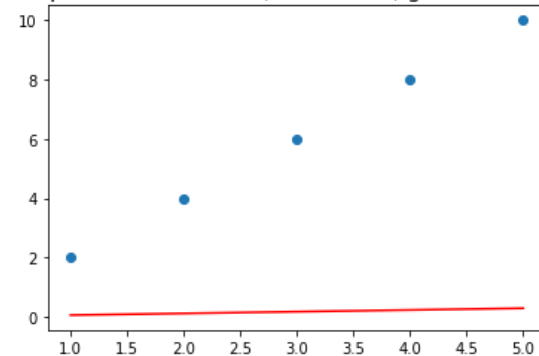
## ■ 실습 1

```
lr = 0.01

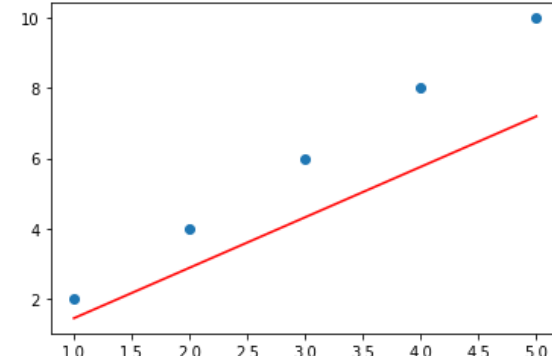
for step in range(20):
    pre = w*x
    cost = ((pre - y) ** 2).sum() / len(x)
    # (wx-y)^2 미분 시 2(wx-y)*x
    grad = 2*(pre-y).view(5).dot(x.view(5))/len(x)
    w -= lr*grad

    if step % 5 == 0:
        plt.scatter(x.numpy(), y.numpy())
        plt.plot(x.numpy(), pre.numpy(), 'r-')
        # w.size() = 1*1, grad.size() = 1
        plt.title('step %d : cost=%.4f, w=%.4f, grad=%.4f' % (step, cost.item(), w.item(), grad.item()))
        plt.show()
```

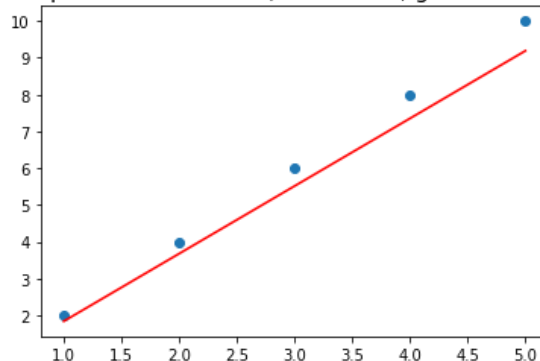
step 0 : cost=41.4864, w=0.4852, grad=-42.7247



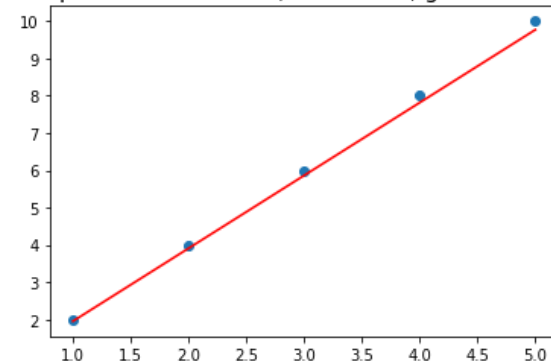
step 5 : cost=3.4582, w=1.5627, grad=-12.3354



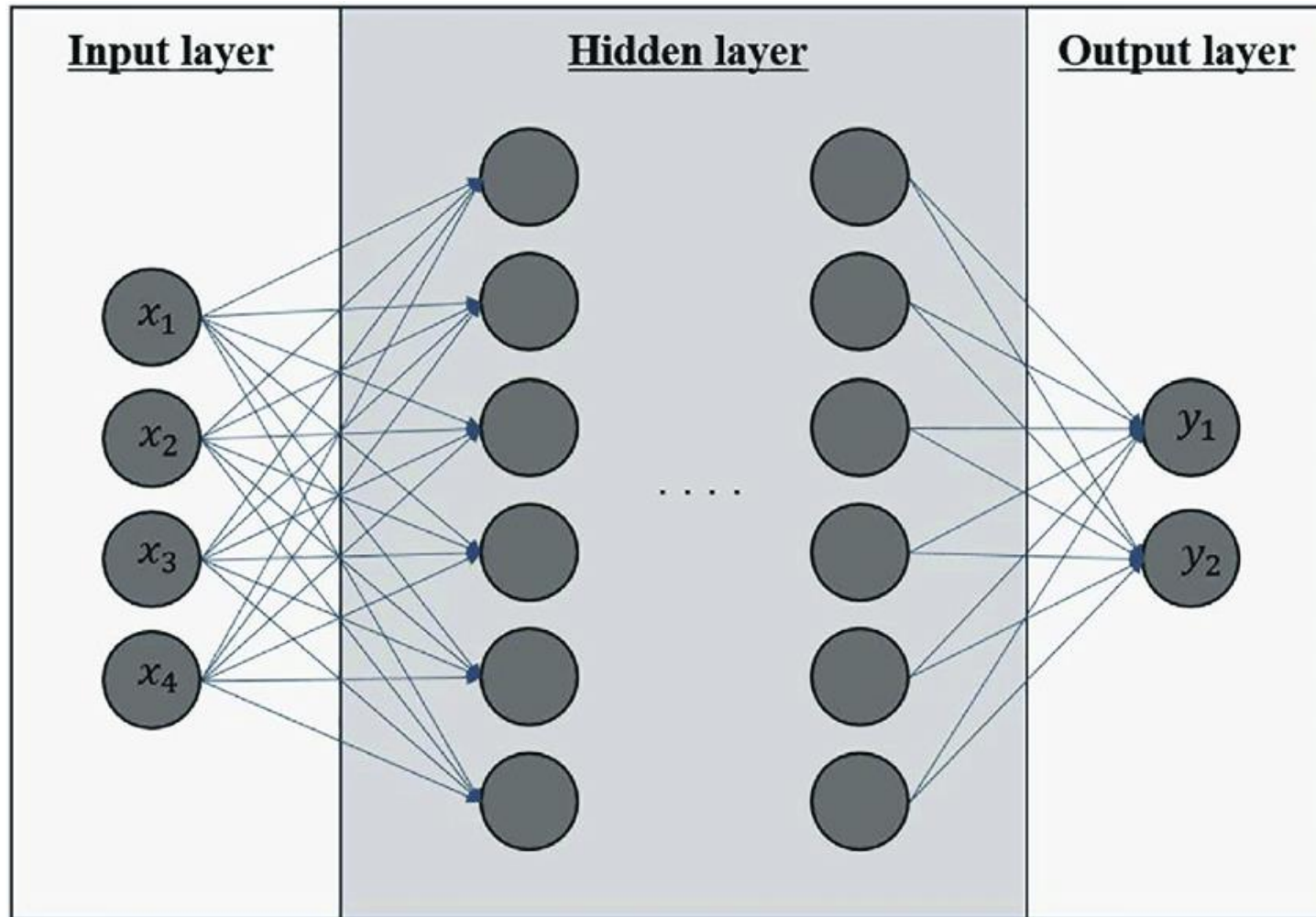
step 10 : cost=0.2883, w=1.8737, grad=-3.5614



step 15 : cost=0.0240, w=1.9635, grad=-1.0282



# 선형 신경망

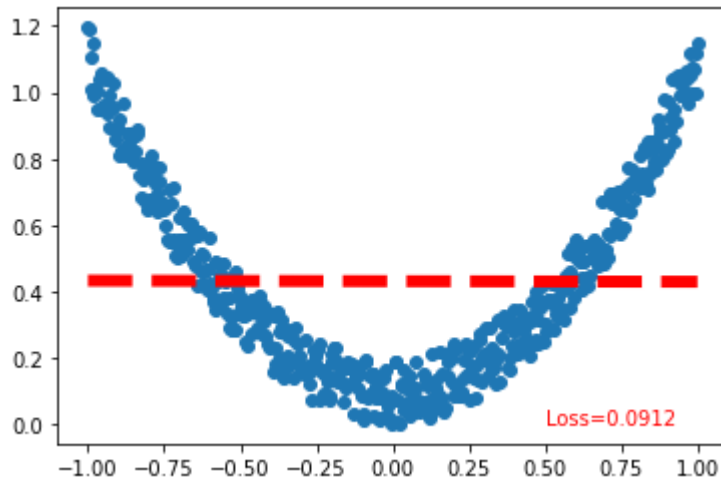


모든 퍼셉트론이 선형이라면?

# 선형 신경망

## ■ 실습 2

- $y = x^2$  그래프를 linear layer 2개를 사용한 모델로 예측하면?



→ Linear layer를 여러 개 쌓는 것은 의미가 없다!

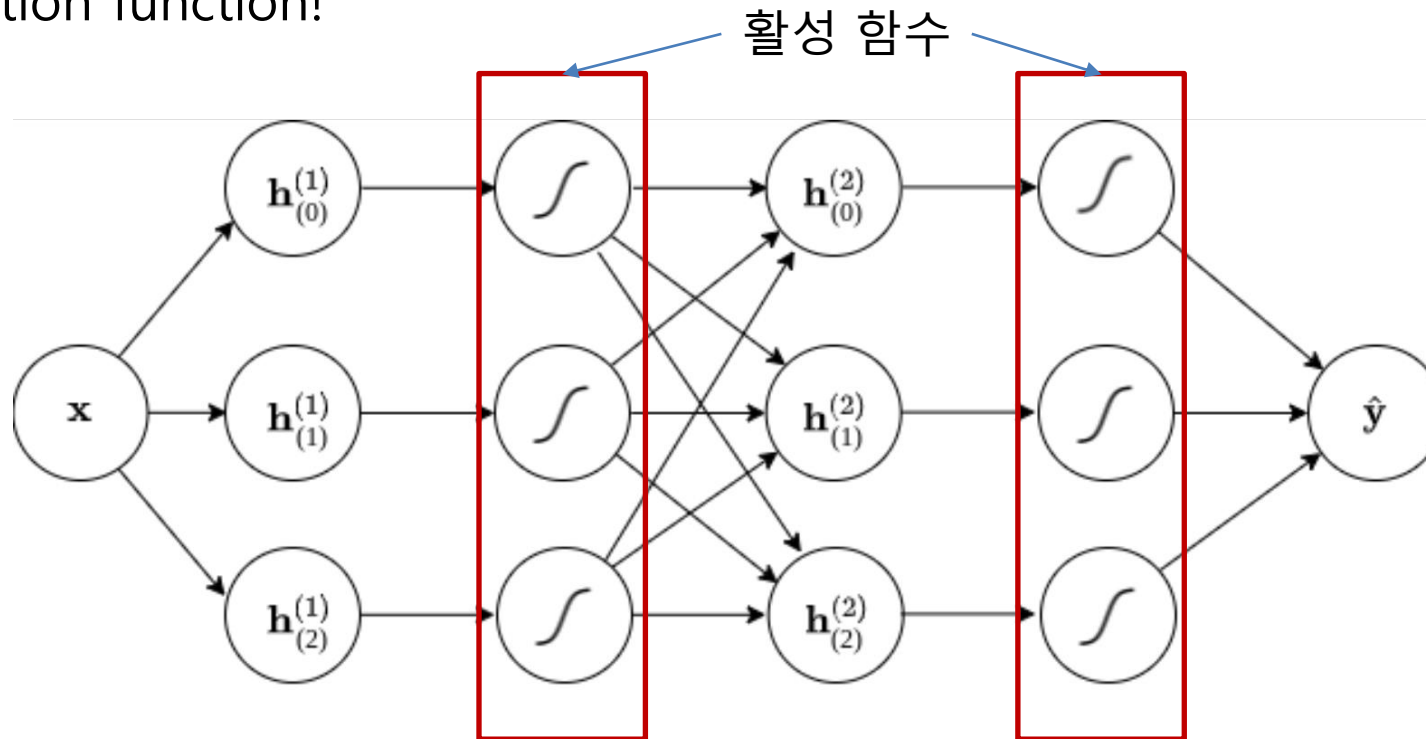


# 활성함수

## ■ 비선형성

- 선형결합의 선형결합은 선형결합이기 때문에, linear layer를 여러 번 쌓은 것은 의미가 없음
- 즉, 비선형성을 갖는 함수가 필요함

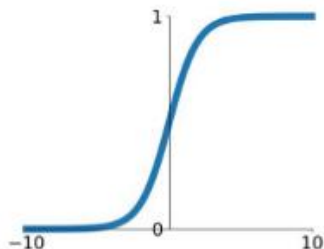
➔ Activation function!



# 활성함수

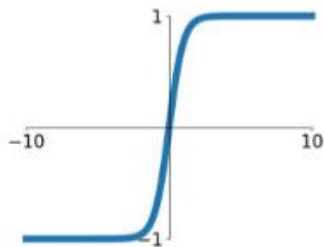
## Sigmoid

$$\sigma(x) = \frac{1}{1+e^{-x}}$$



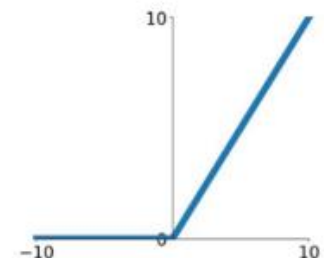
## tanh

$$\tanh(x)$$



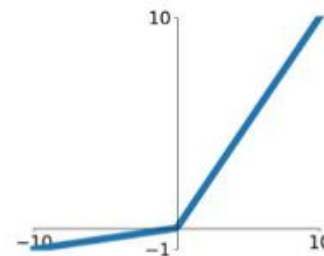
## ReLU

$$\max(0, x)$$



## Leaky ReLU

$$\max(0.1x, x)$$

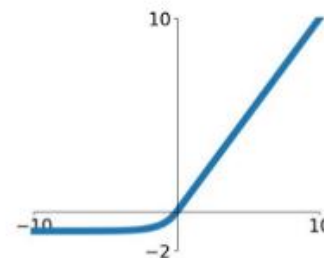


## Maxout

$$\max(w_1^T x + b_1, w_2^T x + b_2)$$

## ELU

$$\begin{cases} x & x \geq 0 \\ \alpha(e^x - 1) & x < 0 \end{cases}$$

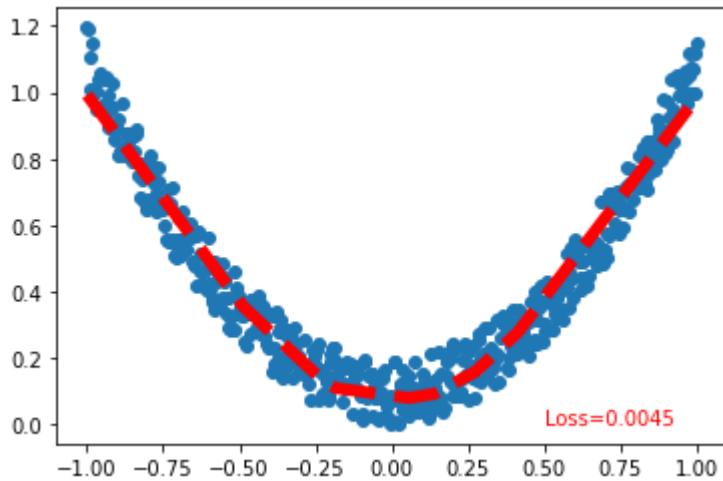


일반적으로 ReLU를 많이 사용함

# 활성함수

## ■ 실습 3

- Linear layer와 activation function을 사용해서  $y = x^2$  그래프를 예측



→ Activation function을 사용하면 비선형성을 나타낼 수 있다.

실습