

# 심층 신경망

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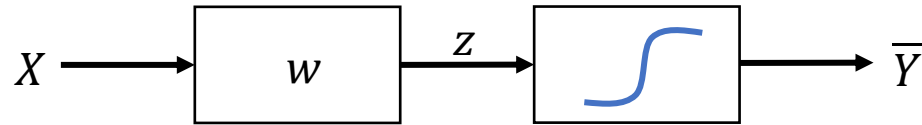
Deep Neural Network (DNN)

# Agenda

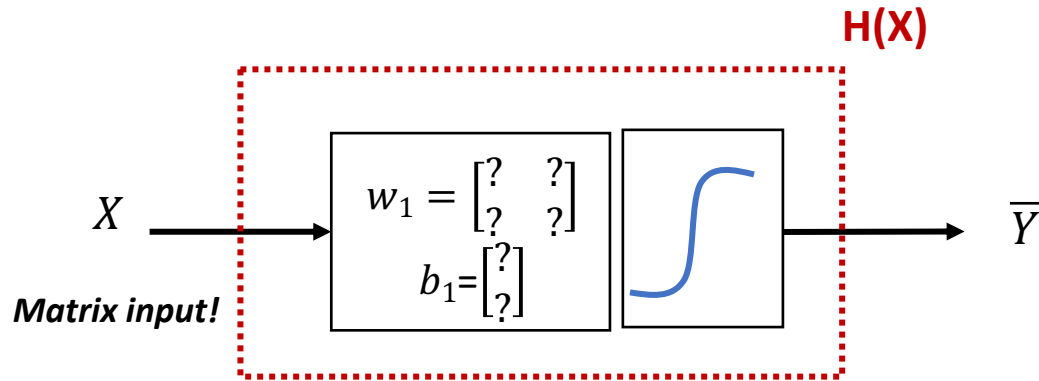
- History of MLP
- Neural Net(NN)
  - Perceptron
  - Multi-Layer Perceptron (MLP)
  - Backpropagation

# Problem: Perceptron

- One logistic regression unit cannot separate XOR



# [실습] Perceptron for XOR



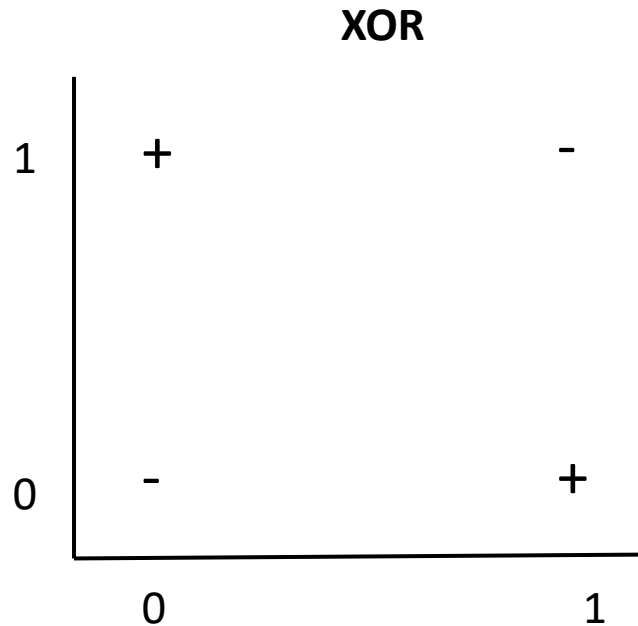
$$\bar{Y} = H(X) = \text{sigmoid}(X \cdot w_1 + b_1)$$

$x_1$	$x_2$	$\bar{Y}$
0	0	0
0	1	1
1	0	1
1	1	0

# Problem: Perceptron

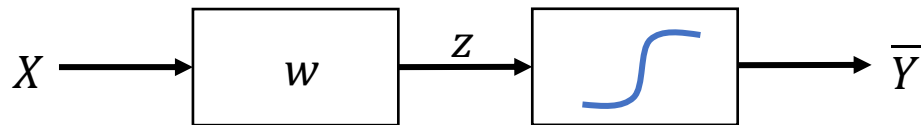
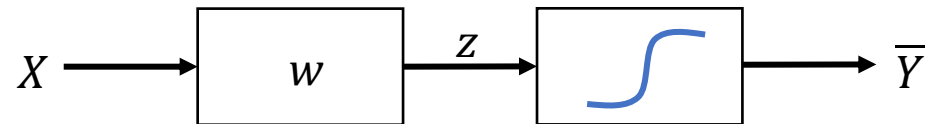
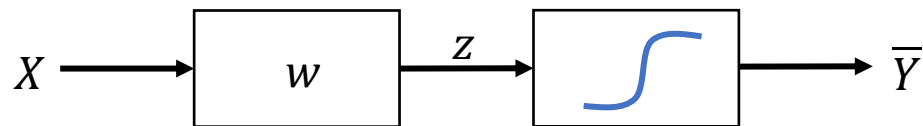
- XOR using NN

X1	X2	XOR	
0	0	0	-
0	1	1	+
1	0	1	+
1	1	0	-



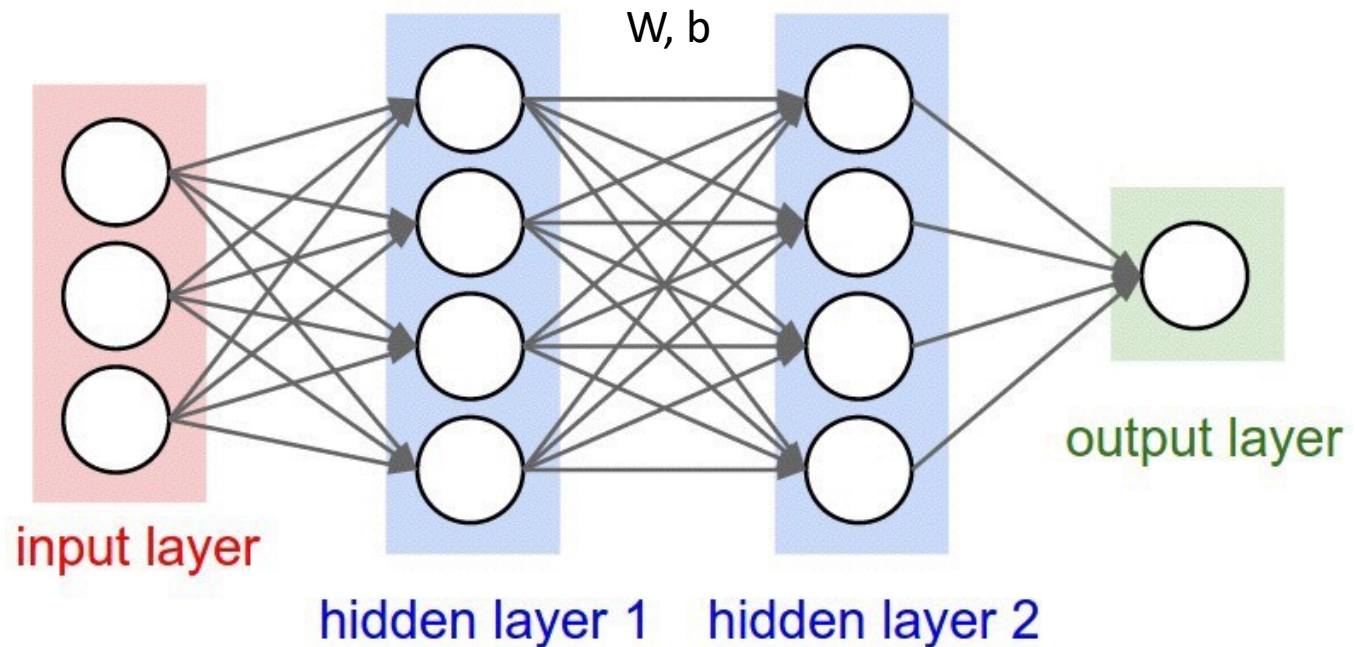
# Solution: MLP

- Multiple logistic regression units can separate XOR



# Solution: MLP

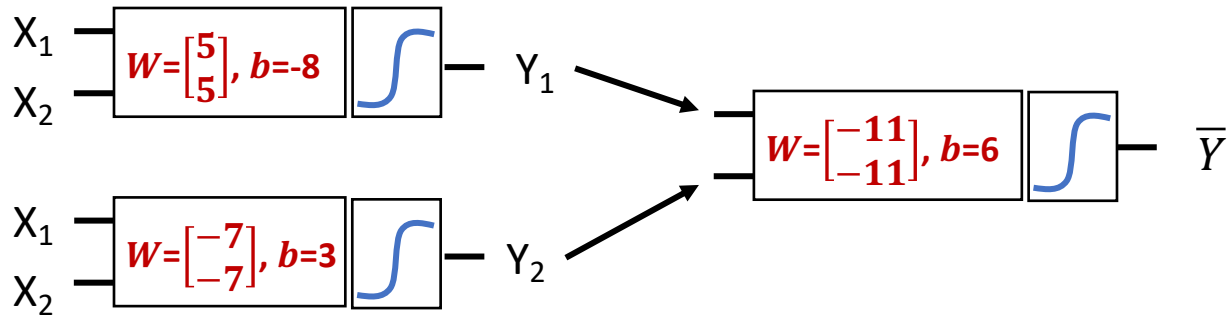
- Multiple logistic regression units can separate XOR
- But! "No one on earth had found a viable way to train"



\*Marvin Minsky

# Solution: MLP

- XOR using NNs
  - toy-examples

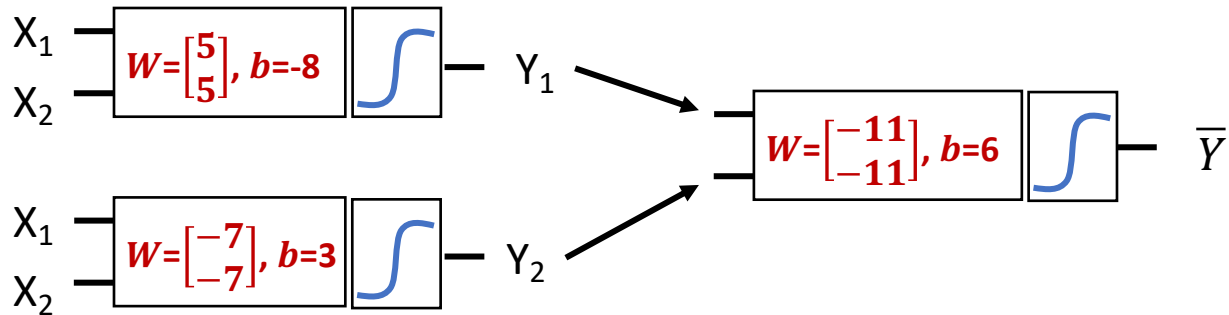


$X_1$	$X_2$	$Y_1$	$Y_2$	$\bar{Y}$	XOR
0	0				0
0	1				1
1	0				1
1	1				0



# Solution: MLP

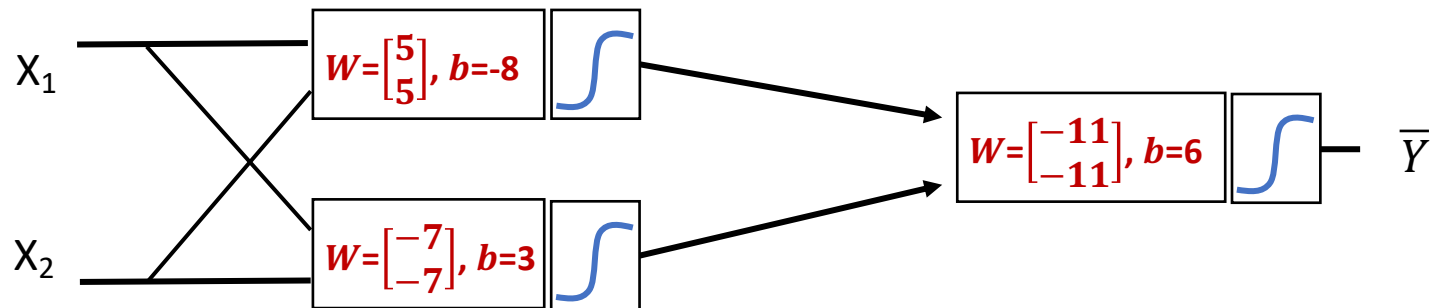
- XOR using NNs



$X_1$	$X_2$	$Y_1$	$Y_2$	$\bar{Y}$	XOR
0	0	0	1	0	0
0	1	0	0	1	1
1	0	0	0	1	1
1	1	1	0	0	0

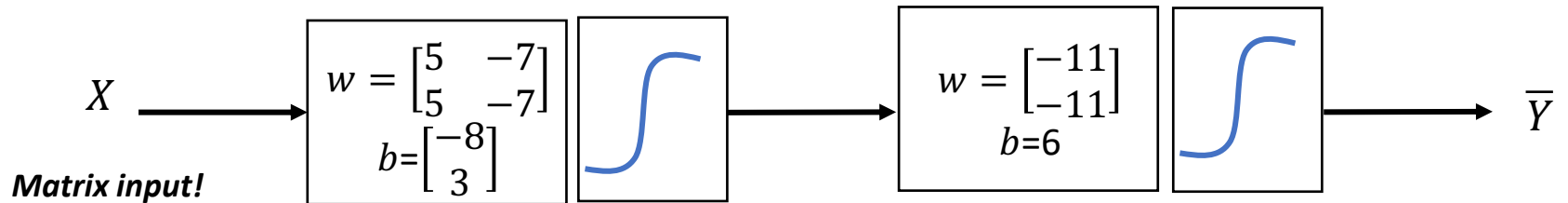
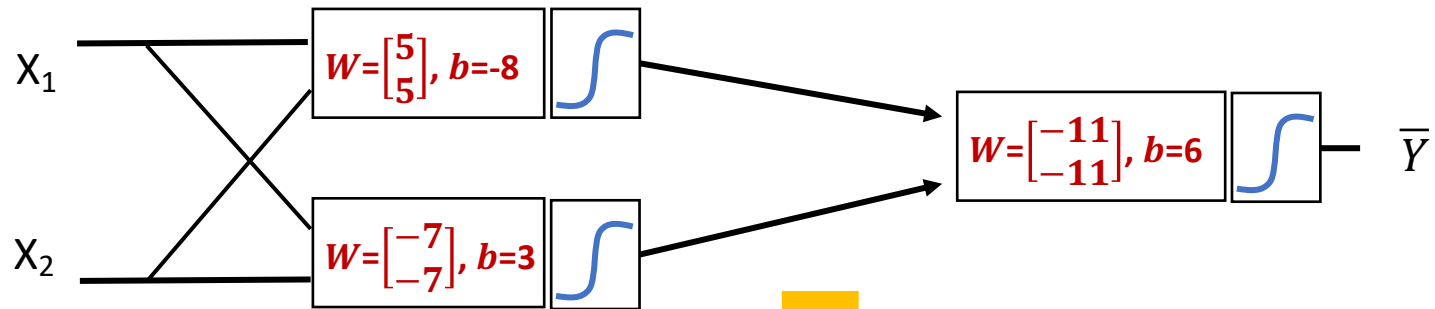
# Solution: MLP

- Forward Propagation을 통한 XOR 문제 풀이 가능 검증 완료

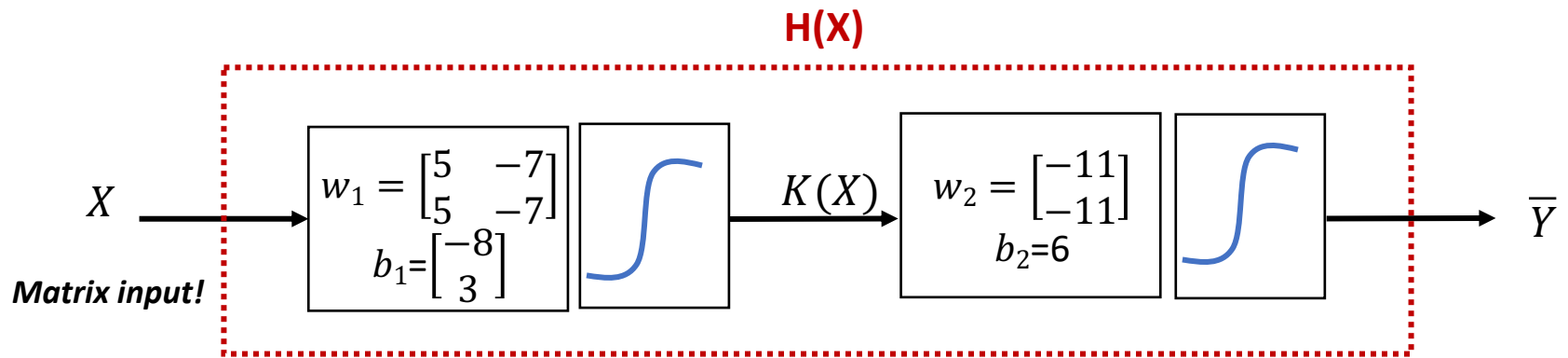


# Solution: MLP

- Forward Propagation을 통한 XOR 문제 풀이 가능 검증 완료



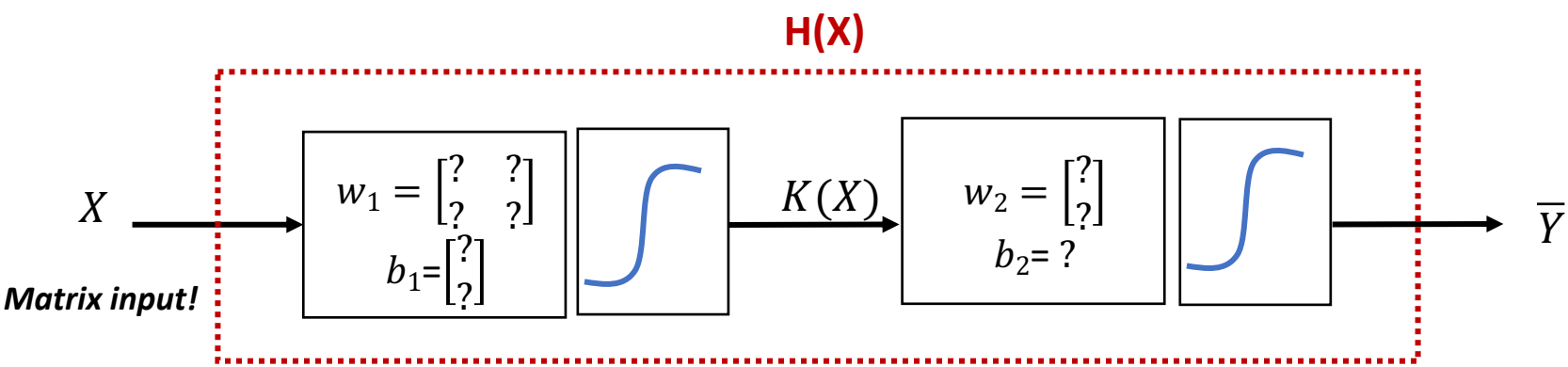
# Solution: MLP for XOR



$$K(X) = \text{sigmoid}(X \cdot W_1 + b_1)$$

$$\bar{Y} = H(X) = \text{sigmoid}(K(x) \cdot w_2 + b_2)$$

How can we learn W1, W2, B1, B2 from training data?



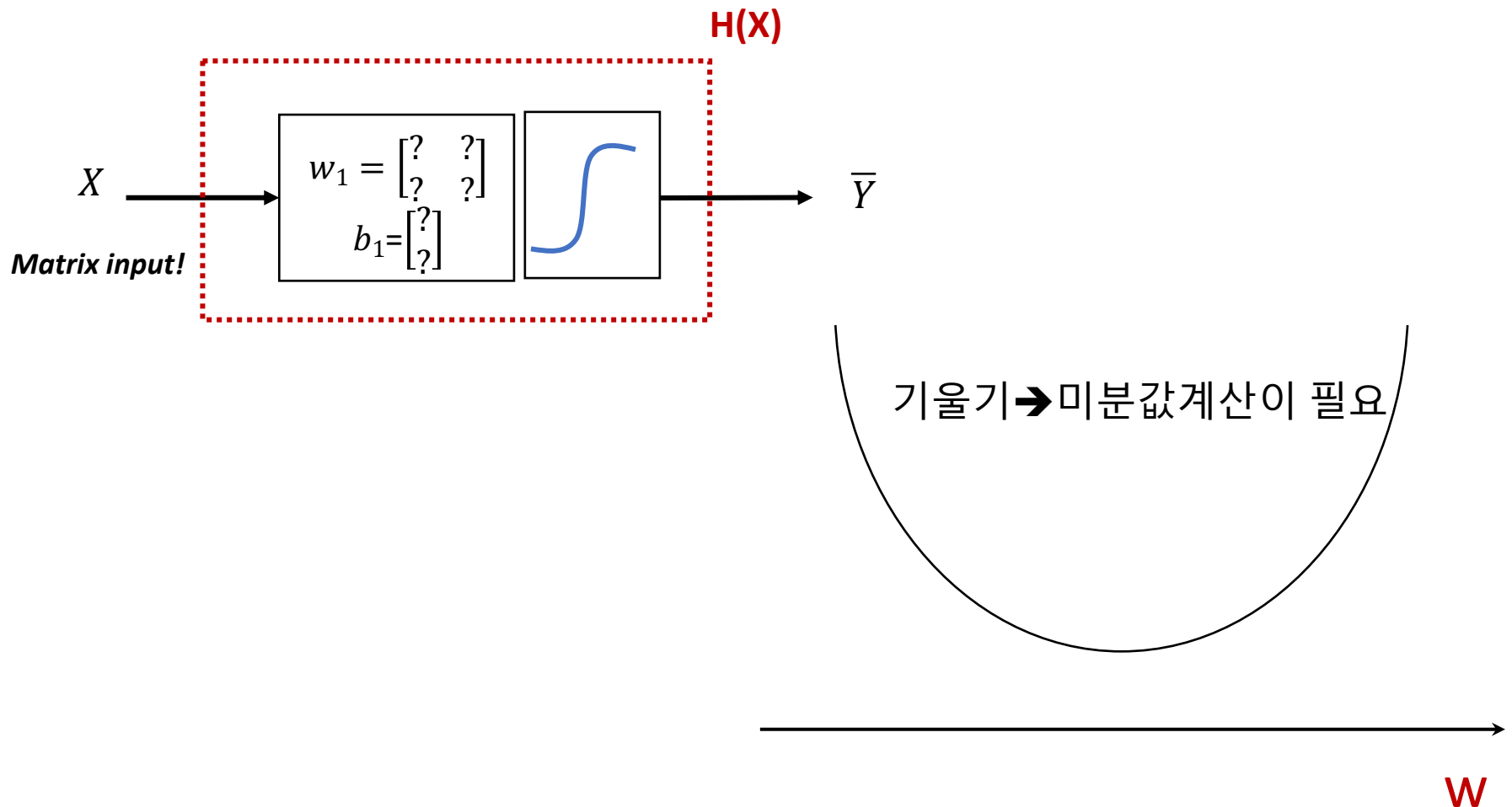
$$K(X) = \text{sigmoid}(X \cdot W_1 + b_1)$$

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1	1	0

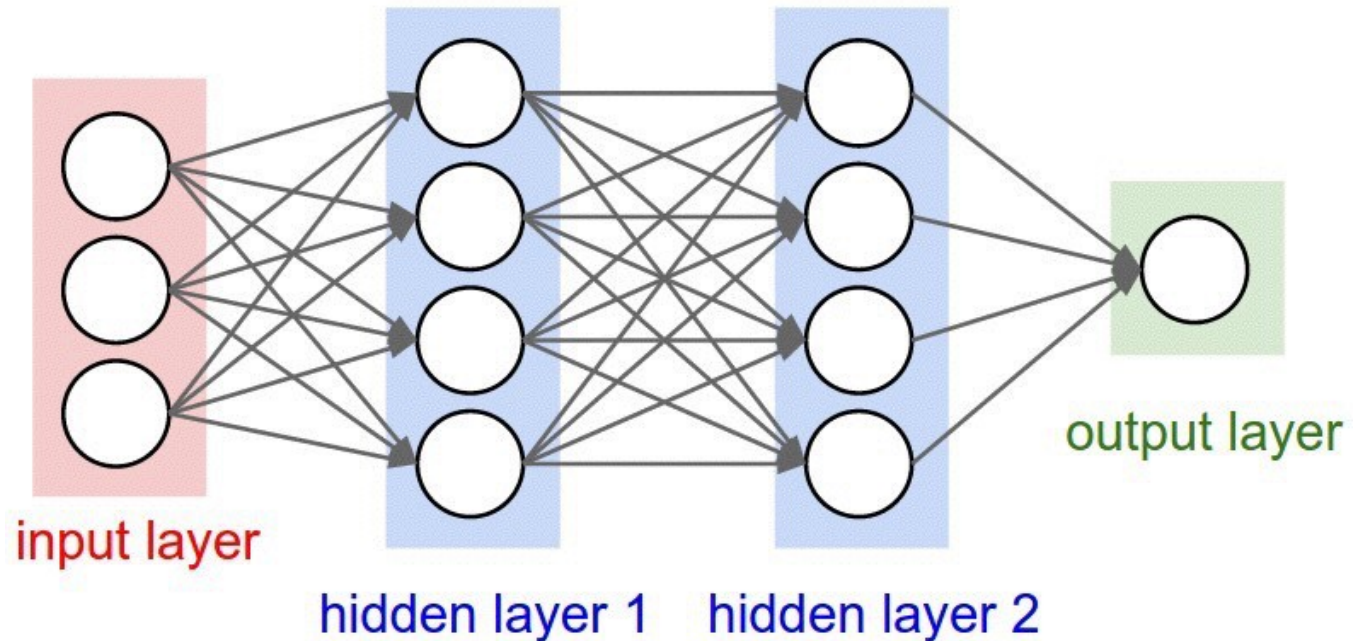
# Remind

- We try to find a minimum value using a gradient descent method.



# Remind

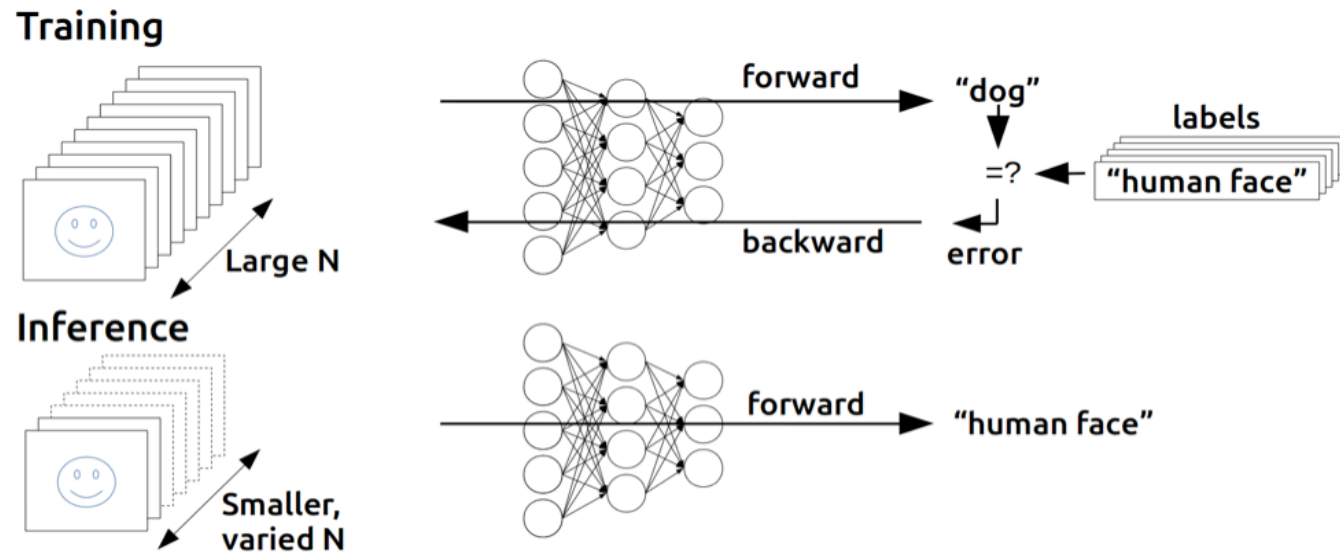
- But, **MLP** is too complex to apply gradient descent method for finding optimal parameters.



입력과 출력에 영향을 미치는 각각의  $w$ ,  $b$  값을 구하는게 어렵다.

# Remind

- **Backpropagation** (1974, 1982 by Paul Werbos, 1986 by Hinton)

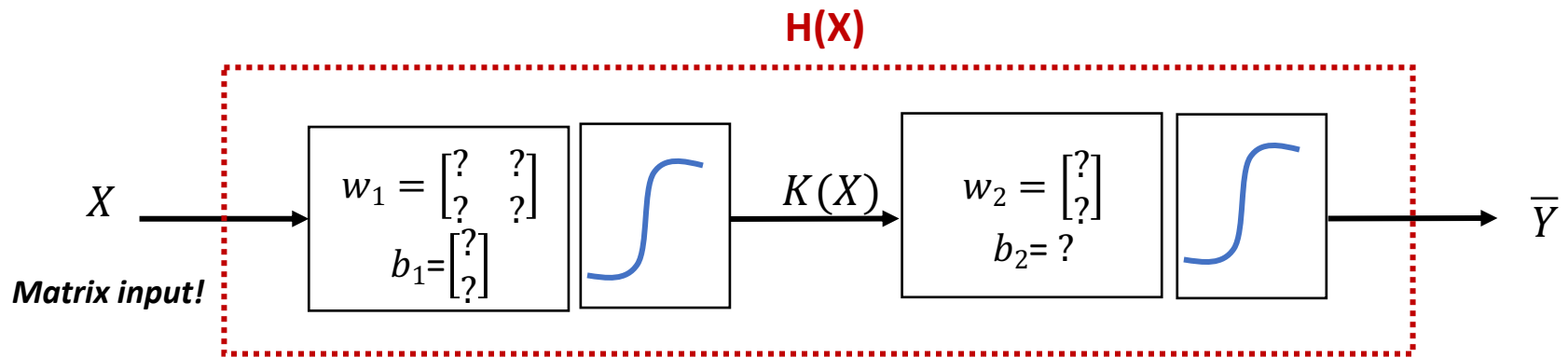


- 1)  $W, b$  초기화
- 2) Forward 계산 & Error 측정
- 3) **Error 값을 Backward 하면서  $w, b$  업데이트**



# [실습] MLP for XOR

How can we learn  $W_1, W_2, B_1, B_2$  from training data?



$$K(X) = \text{sigmoid}(X \cdot W_1 + b_1)$$

$$\bar{Y} = H(X) = \text{sigmoid}(K(x) \cdot w_2 + b_2)$$

$x_1$	$x_2$	$\bar{Y}$
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**END**

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