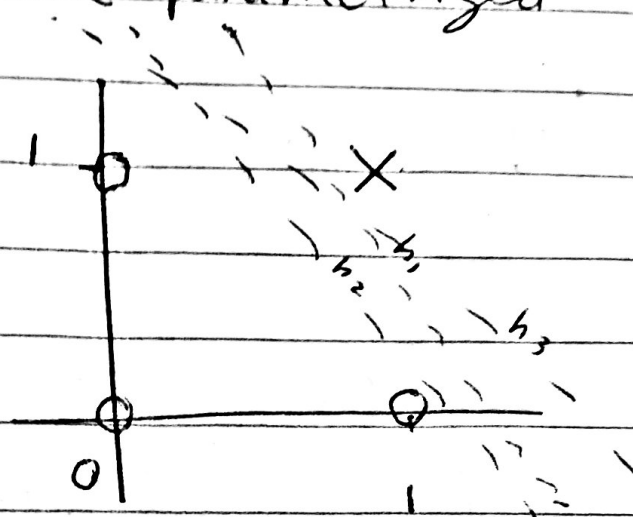


## AND:

Since AND problem is linearly separable and since a perceptron splits data based on a hyperplane parametrized by  $\theta$  and  $b$ .

(here I assume input  $x_1, x_2 \in \{0, 1\}$ )

There are infinite solutions.



as  
~~one solution.~~

The general way of finding a solution is to as follows:

In order to construct a decision boundary we need:

condition 1):  $\theta^T x + b > 0$  when  $x = [1 \ 1 \ \dots \ 1]^T$

condition 2):  $\theta^T x + b < 0$  otherwise

let  $\theta = [1 \ 1 \ \dots \ 1]^T$

condition ①:

$$\theta^T x + b = [1 \ 1 \ \dots \ 1] [1 \ 1 \ \dots \ 1]^T + b > 0$$

$$N + b > 0 \Rightarrow b > -N \quad \text{--- (1)}$$

Where  $N$  is the dimension

for condition (2), we have many choices for  $x$ . Let  $x \in \{[011\dots 1], [1011\dots 1], \dots, [111\dots 0]\}$

$$\text{then } \theta^T x + b = N - 1 + b < 0$$

$$b < -N + 1 \quad \text{--- (2)}$$

when taking other choices for  $x$  it will yield  $b < -N + m$ ,  $m > 1$  which is implied by (2) [(2) is the smallest upper bound]

~~(1)~~

combine (1) and (2)

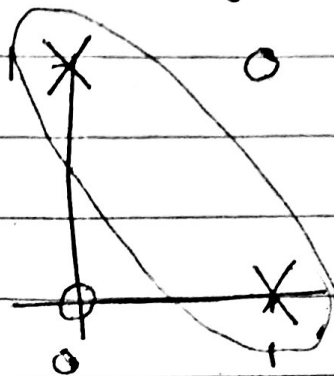
$$-N < b < -N + 1$$

[we can construct other solutions when selecting  $\theta$  other than all-one vector]

# XOR:

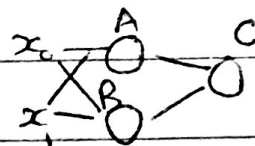
XOR depends on the parity of the input

There is no way to split X and O using a hyperplane

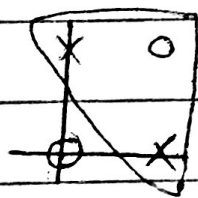


⇒ a perceptron can't solve the XOR problem

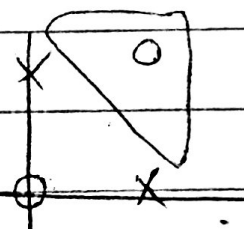
We need multi-stages



stage 1



perceptron A



perceptron B

stage 2



perceptron C

perceptron A:  $\theta = [1 \ 1]$   $b = -\frac{1}{2}$  (OR gate)

perceptron B:  $\theta = [1 \ 1]$   $b = -\frac{3}{2}$  (AND gate)

using sign activation, i.e. output = -1 or 1

perceptron C:  $\theta = [-1 \ 1]$   $b = +\frac{1}{2}$

$\theta = [-1 \ 1]$   $b = +\frac{1}{2}$