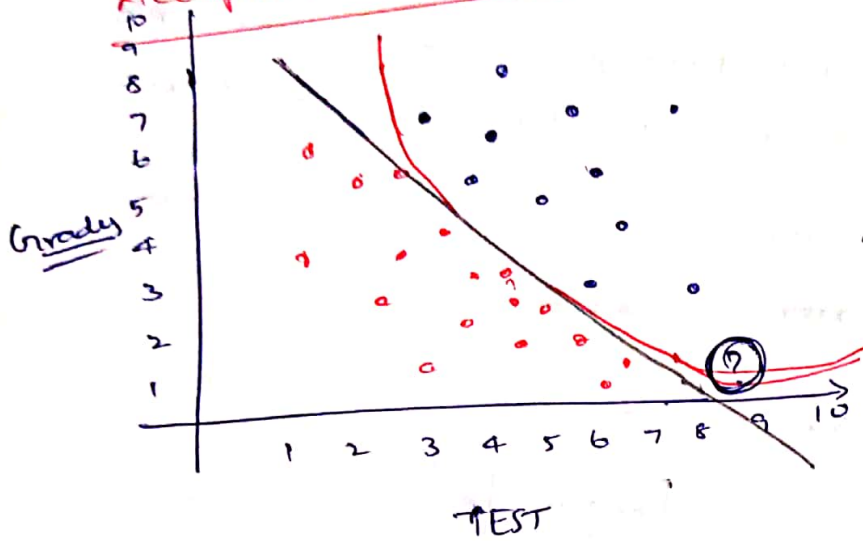


Day-3

## Non-linear regions

Acceptance at a uni!



- → Accepted.
- → not accepted.

Suppose if you're given a pt  
 $(9, 1) \Rightarrow$  Yes / It is accepted  
 test grades

BUT

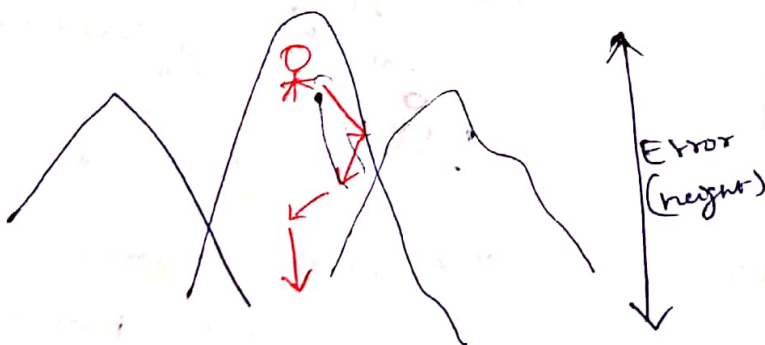
LOGICALLY SPEAKING  
 OUR GRADE IS 1 terrible  
 so we wanna discard that.

$\Rightarrow$  This

This explains that, perceptron algo doesn't work in this case.  
 we need to redefine the curve to make this happen  
 well a curve would do the whole process.

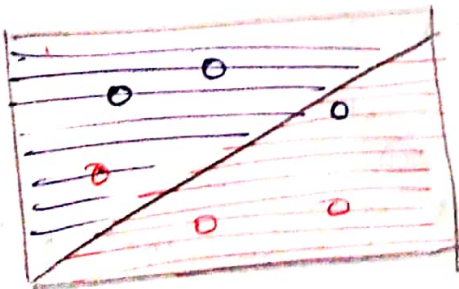
Error function:

goal  
 distance in which way it is minimum &  
 repeat the process until you reach the goal



Error → how badly we're  
 doing at the moment  
 & how far we are from  
 Ideal solution

we are descending to  
 make the error relatively  
 less.

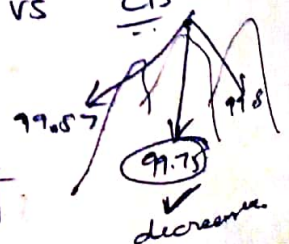
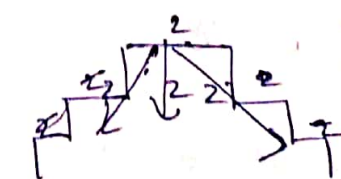


no. of  
 errors

2

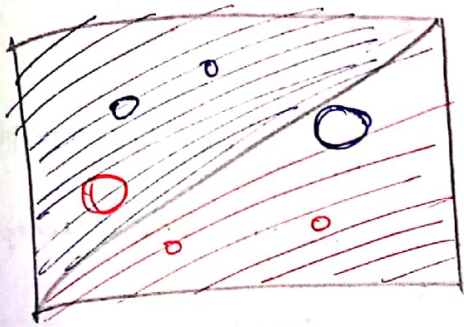
whatever  
 we do in  
 perceptron the  
 error persists  
 bcoz of Discrete fn

Discrete vs cts



Error fn is continuous  $\rightarrow$  differentiable

LOW-LOSS ERROR FN:



$\rightarrow$  going to penalize the 2 incorrect pts.  
 $\rightarrow$  Small penalties for 4 correct pts

$$\text{Error} = 0 + 0 + 0 + 0 + 0 + 0$$



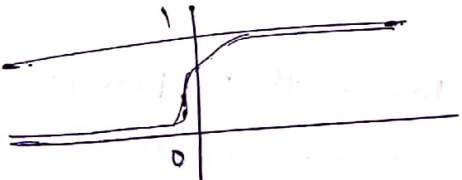
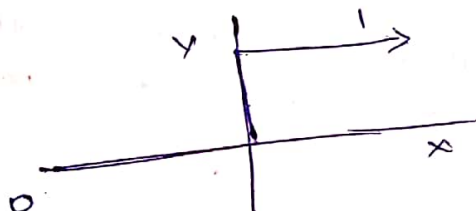
Discrete

VS

Continuous

Yes	1
No	0

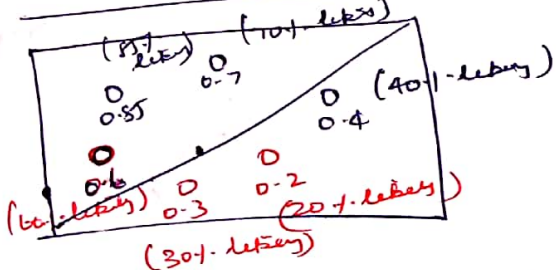
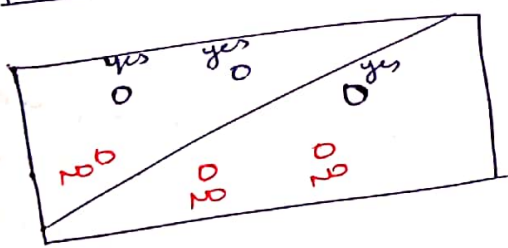
63.8%
likely



SIGMOID FN:

$$y = \begin{cases} 1 & \text{if } x > 0 \\ 0 & \text{if } x < 0 \end{cases}$$

large +ve number  $\approx 1$   
 -ve number  $\approx 0$   
 number  $\approx 0 \Rightarrow \approx 0.5$



whether the person is accepted or not?

The person is accepted with  $x\%$  probability

WHAT IF WE HAVE MORE CLASSES?

Say you are receiving a gift  
 duck beaver walrus.

Based on the features of animals such that if the animal has beaker, feather, hair/no-hair linear scores are  
 $p(\text{duck}) = \frac{2}{3}$   $p(\text{beaver}) = \frac{1}{3}$   $p(\text{walrus}) = 0$



$$\begin{aligned}
 P(\text{duck}) &= \frac{2}{2+1+0} = 0.67 \\
 P(\text{beaver}) &= \frac{1}{2+1+0} = 0.24 \\
 P(\text{walrus}) &= \frac{0}{2+1+0} = 0.09
 \end{aligned}$$

How do we turn these scores into probabilities?

There is an Exponential function

$(e^x) \Rightarrow$  turns to zero

$$e^2 \Rightarrow \frac{e^2}{e^2 + e^1 + e^0} = 0.67$$

SOLN

Good Idea!

but what happens if we have a negative number  
-1, 0, 1

$$\Rightarrow \frac{x}{-1+0+1} = \frac{x}{0} \text{ (Error)}$$

## ONE-HOT ENCODING:

The data always may not be numerical at a time. we need to transfer at a time.

Say  $P(\text{gift}/\text{no gift}) = 1/0$

$$\begin{aligned}
 P(\text{gift}) &= 1 \\
 P(\text{no gift}) &= 0
 \end{aligned}$$

if gift classes are this

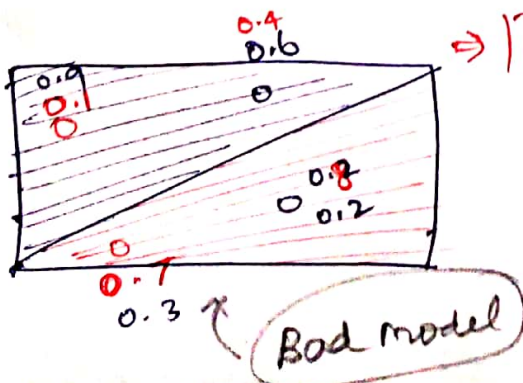
	duck?	beaver?	walrus?
$P(\text{duck})$	1	0	0
$P(\text{beaver})$	0	1	0
$P(\text{walrus})$	0	0	1

MAX LIKELIHOOD  $\Rightarrow$  PICK THE MODELS THAT GIVES EXISTING LABELS WITH HIGHEST PROBABILITY!

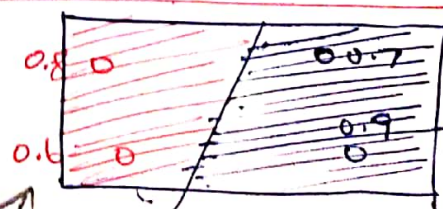
Calculate for actual colors

- 0.6 x
- 0.1 x
- 0.2 x
- 0.7

$$0.0084$$



$\Rightarrow$  max-probability  $\equiv$  Best model



$$\begin{aligned}
 &0.7 \times 0.9 \times 0.6 \times 0.8 \\
 &= 30.1 \approx 0.3024
 \end{aligned}$$

# MAX PROBABILITY:

max prob  $\uparrow$  min Error find

$$0.6 \times 0.2 \times 0.1 \times 0.7$$

$$\Rightarrow 0.0084$$

$$0.7 \times 0.9 \times 0.8 \times 0.6$$

$$\Rightarrow 0.3024$$

What happens if we are given a 1000's of datas of all comprising  $0 < x < 1$

- ① when we perform ~~sum~~ product  $\Rightarrow$  it would be very tiny
- ② what happens if I change one of those values?  
It would be a drastic change.

so  $\Rightarrow$  Products  $\Rightarrow$  Bad  
Sums  $\Rightarrow$  Good

prod  $\rightarrow$  log  $\rightarrow$  sums

$$\ln(0.6) + \ln(0.2) + \ln(0.1) + \ln(0.7)$$

$$-0.51 \quad -1.61 \quad -2.3 \quad -0.36$$

$$\ln(0.7) + \ln(0.9) + \ln(0.8) + \ln(0.6)$$

$$-0.36 \quad -0.1 \quad -0.22 \quad -0.51$$

Note all are -ve

since  $\ln(1) = 0$

no take  $-\log$

$$-\ln(0.6) + (-\ln(0.2) - \ln(0.1) - \ln(0.7)) \quad -\ln(0.7) - \ln(0.9) - \ln(0.8) - \ln(0.6)$$

$$0.51 + 1.61 + 2.3 + 0.36$$

$$0.36 + 0.1 + 0.22 + 0.51$$

SUM OF NEGATIVE LOGARITHMS OF PROBABILITIES  
CROSS ENTROPY

4.8

Bad model

1.2

Good model  
low CE



# CROSS ENTROPY:

Independent events  
Pick large value from each column

DOOR 1  
 $P(\text{gift}) = 0.8$  ✓

DOOR 2  
 $P(\text{gift}) = 0.7$  ✓

DOOR 3  
 $P(\text{gift}) = 0.1$  ✗

$P(\text{no-gift}) = 0.2$

$P(\text{no-gift}) = 0.3$

$P(\text{no-gift}) = 0.9$

DOOR 1	DOOR 2	DOOR 3	Pror	CE
✓ 0.8	✓ 0.7	✓ 0.1	0.056	2.88
✓ 0.8	✓ 0.7	✗ 0.9	0.504	0.69
✓ 0.8	✗ 0.3	✓ 0.1	0.204	3.73
✗ 0.2	✓ 0.7	✓ 0.1	0.014	4.27
✓ 0.8	✗ 0.3	✗ 0.9	0.216	1.53
✗ 0.2	✓ 0.7	✗ 0.9	0.126	2.07
✗ 0.2	✗ 0.3	✓ 0.1	0.006	5.12
✗ 0.2	✗ 0.3	✗ 0.9	0.054	2.32

Low CE ↓  
likely to be happy

$P_1(\text{gift}) = 0.8$   
 $P_2(\text{gift}) = 0.7$   
 $P_3(\text{gift}) = 0.1$

✓	✓	✗	CE
0.8	0.7	0.9	
$P_1$	$P_2$	$1 - P_3$	$-\ln(0.8) - \ln(0.7)$
$y_1 = 1$	$y_2 = 1$	$y_3 = 0$	$-\ln(0.9)$

$$CE = - \sum_{i=1}^n y_i \log p_i + (1 - y_i) \log(p_i)$$

$CE[(1, 1, 0), (0.8, 0.7, 0.1)]$   
 $= 0.69$  ✓