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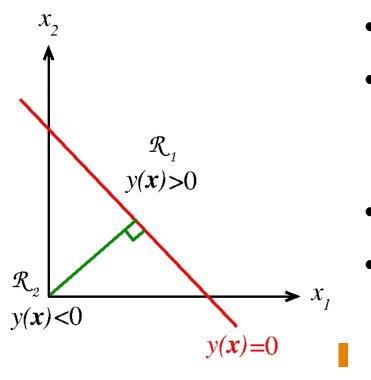
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# Perceptron: A Linear Classifier



- $y(\mathbf{x}) = \mathbf{w}^T \mathbf{x} + w_0$
- 2-D implicit from of eqn of a line is ax + by + c = 0. Here,  $y(\mathbf{x}, \mathbf{w}) = w_2x_2 + w_1x_1 + w_0 = 0$
- y(x) = 0: 1-D h'plane in 2-D
- Relative location of  $\mathcal{R}_1$ ,  $\mathcal{R}_2$  is immaterial: which is above/below/to the left/to the right
- Non-neural implementation: weight learning
- *D* dimensional data: scalars e.g., salary, years of residence, outstanding debt
- output  $y = \pm 1$  | approve/deny credit/loan/CC|
- Approve if  $\sum_{i=1}^{D} w_i x_i > Thresh (-b \text{ or } -w_0)$ , or denyl
- Some  $w_i < 0$  debt: adverse effect on credit rating



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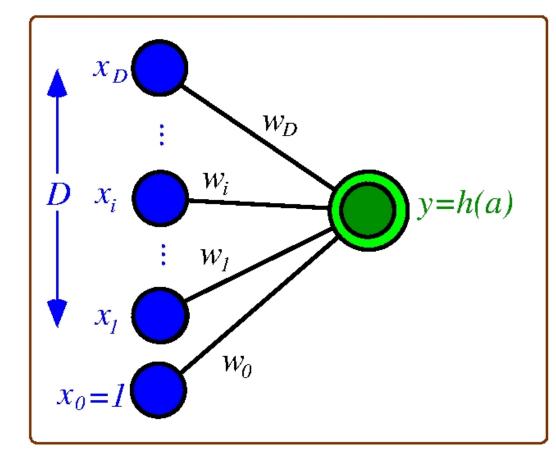
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## Rosenblatt's Perceptron: Neurali



- A single-layer NNI
- Sgn activation fn

• 
$$h(a) = +1, a > 0$$

$$\bullet h(a) = -1, a < 0$$

• 
$$y_i = \mathbf{y}(\mathbf{x}_i) = \mathbf{y}(\mathbf{x}_i, \mathbf{w})$$

• = 
$$\mathbf{w}^T \mathbf{x}_i + b$$
 nonhom

• =
$$\mathbf{w}^T \mathbf{x}_i$$
 hom

• w: lin params/wts

- b (or  $w_0$ ): bias': non-homogenous  $D-\dim x_i$
- homogeneous (D+1) dim  $\mathbf{x}_i$  with  $x_0 = 1$
- Learning problem: To learn the weights
- Some  $w_i < 0$  debt: adverse effect on credit rating



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#### The X-OR Problem





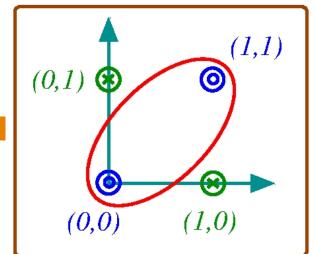
F. Rosenblatt [1928-71] M. L. Minsky [1927-2016]

https://news.cornell.edu/sites/default/files/styles/full\_size/public/2019-09/0925\_rosenblatt3.jpg?itok=glQnp70v

ttps://upload.wikimedia.org/wikipedia/commons/2/28/Marvin\_Minsky\_at\_OLPCb.jpg

Rosenblatt: digit scanner, one-versus-rest classifiers

$x_2$	$ x_1 $	$x_2 \oplus x_1$
0	0	0
0	1	1
1	0	1
1	1	0



- Solutions?
- Not linear!
- More layers
- #neurons?[04:00]



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# 2018 Turing Award: Deep Learning







Y. Bengio

[U Montreal]

G. Hinton

[U Toronto]

Y. LeCun

[NYU]

https://awards.acm.org/binaries/content/gallery/acm/awards/photo/a-b/bengio\_3406375

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A new way of computing[00:12]