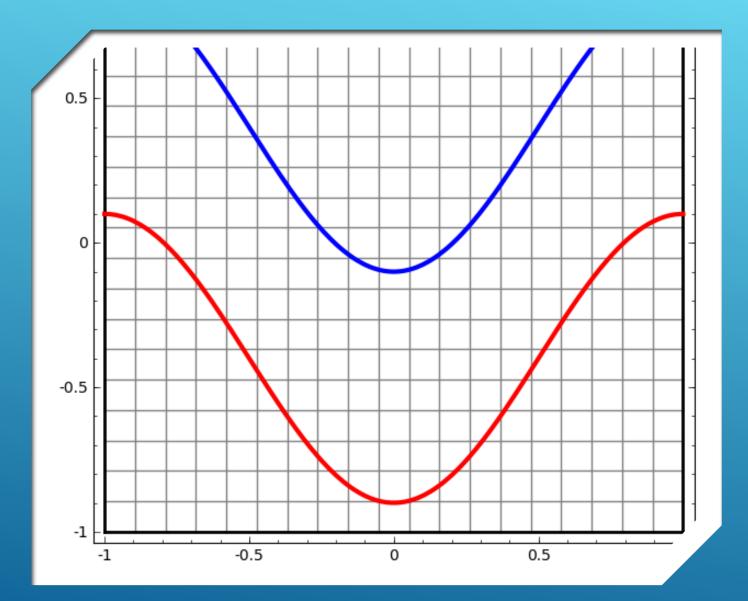
# NEURAL NETWORKS



### SOME DATA

- ► How can we solve this?
  - Use a perceptron?

#### Perceptron algorithm

- Initialize: w<sub>1</sub> = 0
- Updating rule For each data point x
  - If class(x) != decision(x,w)
  - then
    - $w_{\mu i} \leftarrow w_{\mu} + y_{i}x_{i}$
    - k ← k+1
  - else
    - $\mathsf{w}_{\scriptscriptstyle k^q} \gets \mathsf{w}_{\scriptscriptstyle k}$

 $\begin{array}{c}
\mathbf{w}_{k+1} \\
\mathbf{w}_{k+1}$ 

14

0

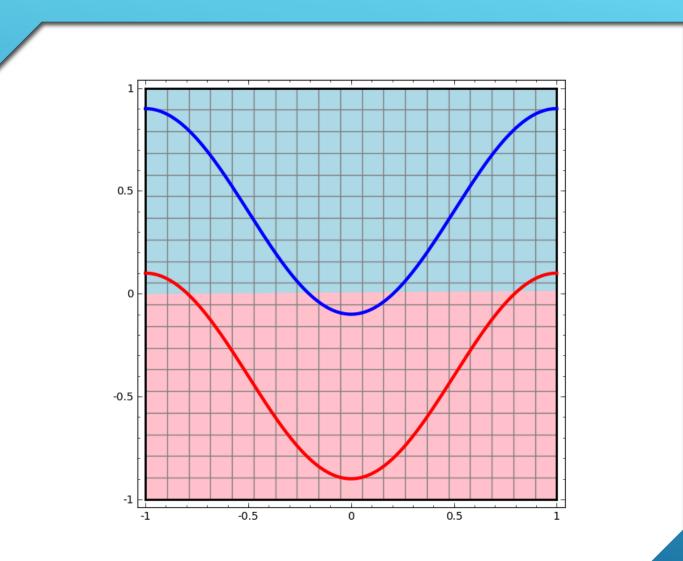
#### Function decision(x, w) If wx + b > 0 return +1

Else return -1

From Gert Lanckriet, Statistical Learning Theory Tutorial

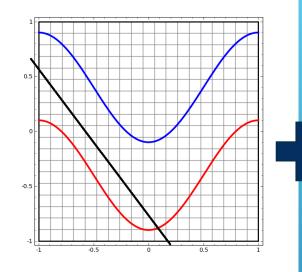
#### THE PERCEPTRON

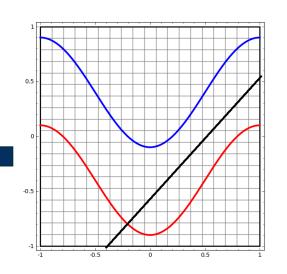
What do we get if we apply this to the data?

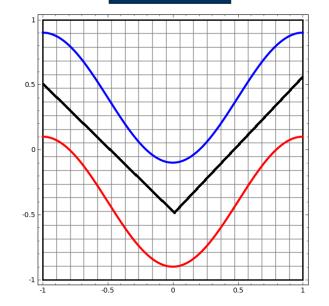


#### NOT BAD

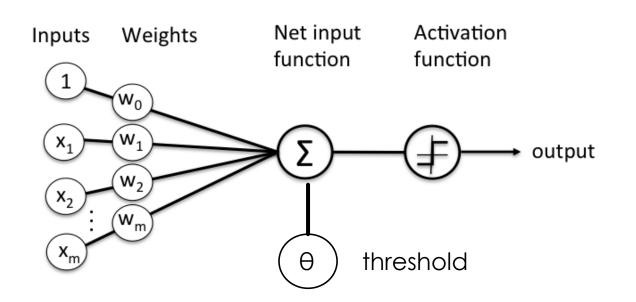
But can we do better?







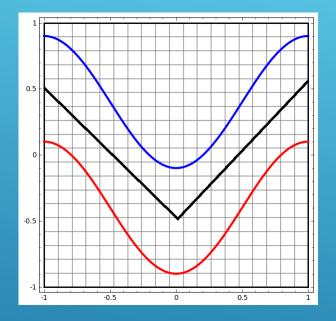
### WE CAN COMBINE TWO PERCEPTRONS

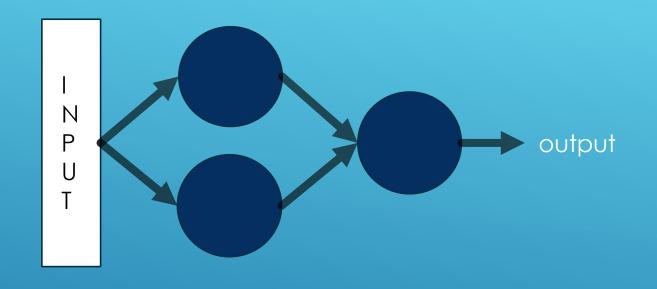


Schematic of Rosenblatt's perceptron.

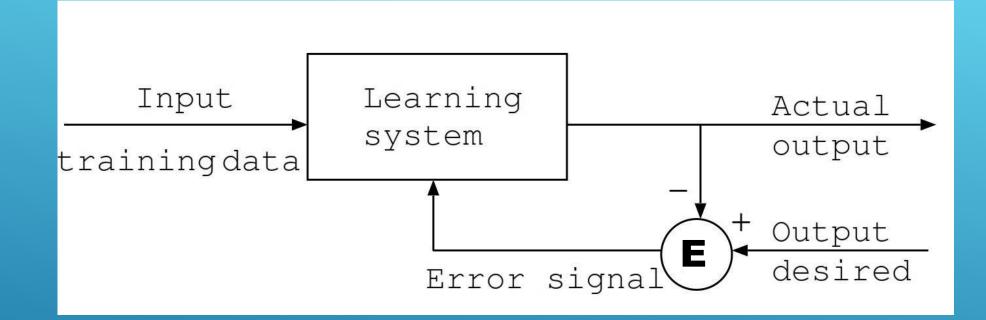
### WHAT GOES INTO A PERCEPTRON

- Inputs
- Weights
- > Fan-in function (Net input function)
- Activation function
- ▶ threshold

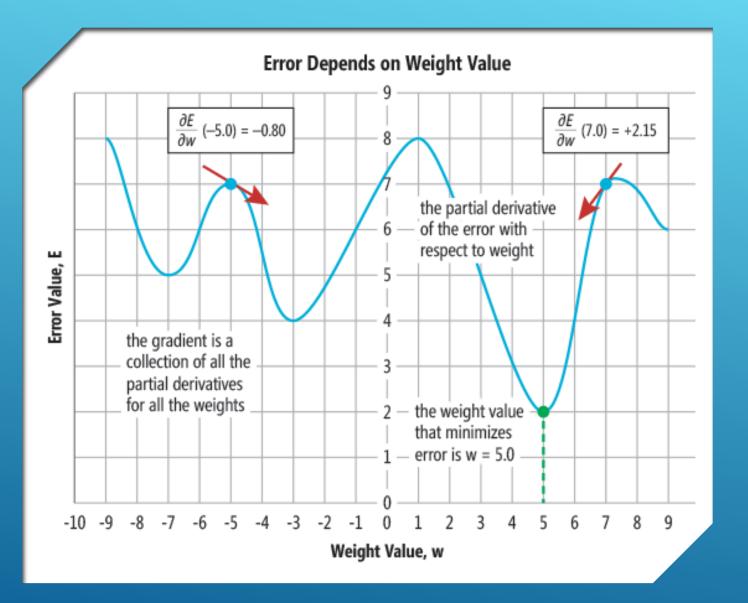




## HOW DO WE LEARN A DECISION BOUNDARY LIKE THIS?

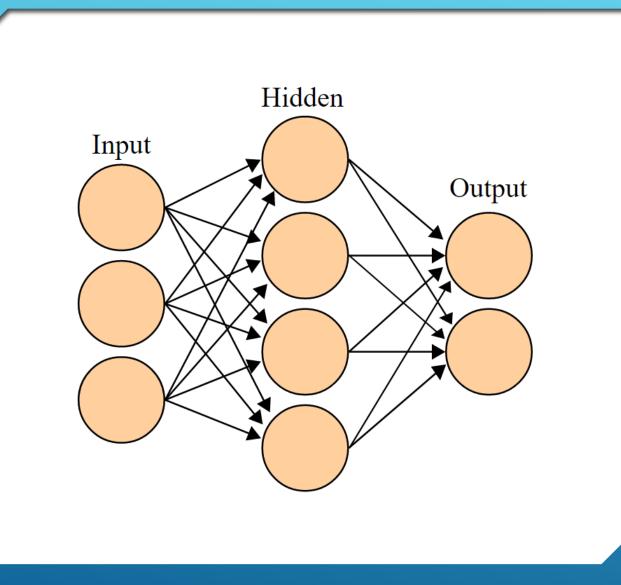


## SUPERVISED LEARNING

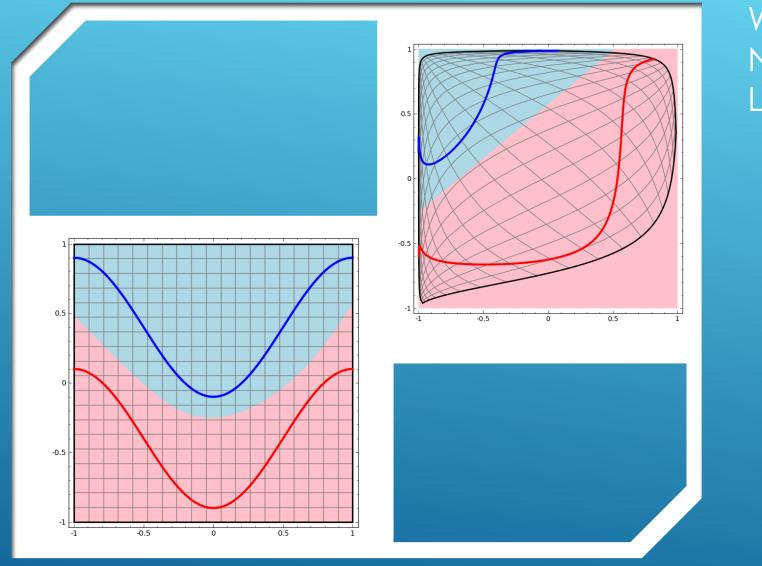


#### MINIMIZE THE ERROR (GRADIENT DESCENT)

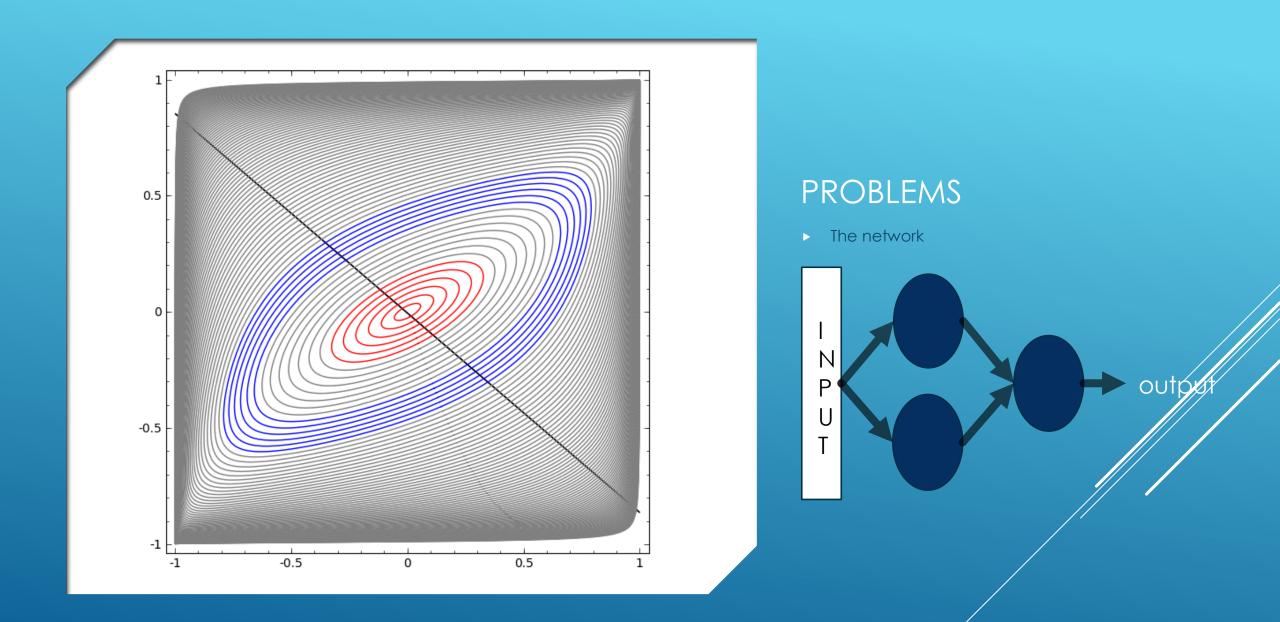
 Calculate the derivative of the error with respect to the weights and then move a small distance in the opposite direction to the gradient.

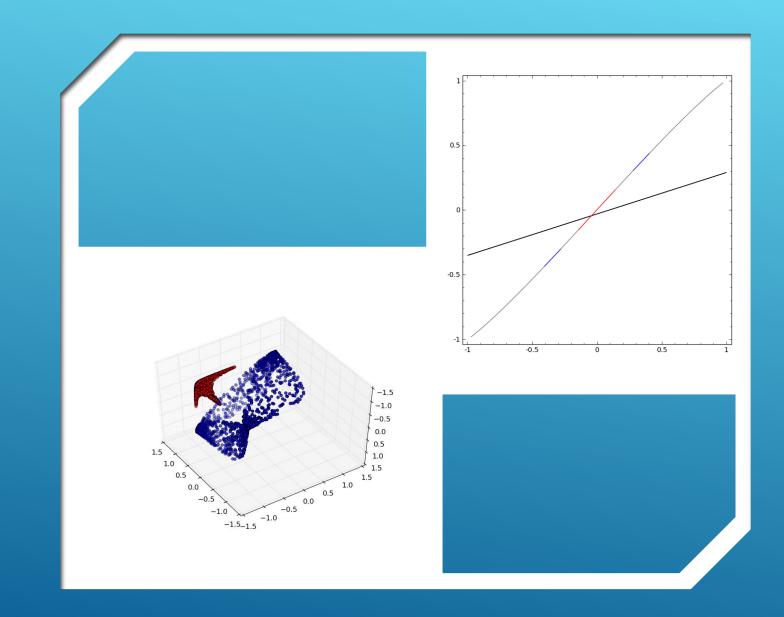


WE CAN NOW DO MULTILAYER FEED FORWARD NEURAL NETWORKS



### WHAT DOES A NEURAL NETWORK LAYER DO

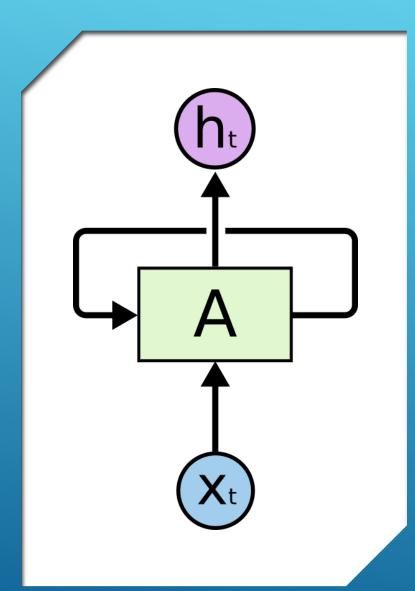




### SOLUTION

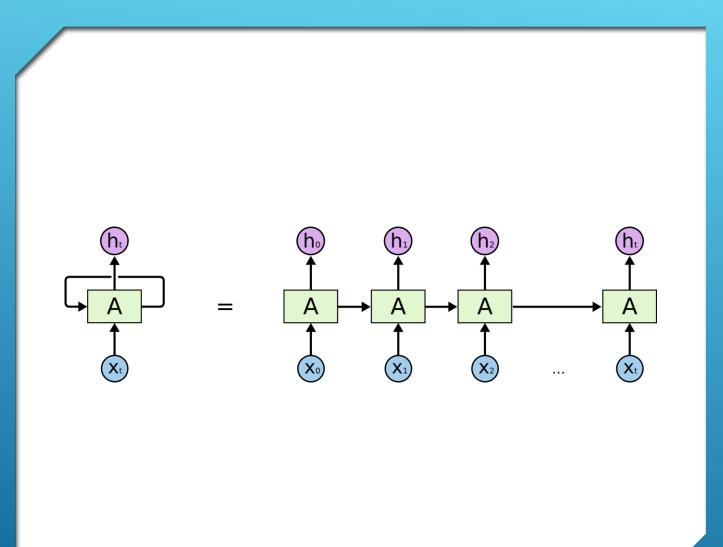
- > Add a neuron to the hidden layer
  - Gives the intermediary representation another dimension in which to separate the data.

## OTHER PROBLEMS?



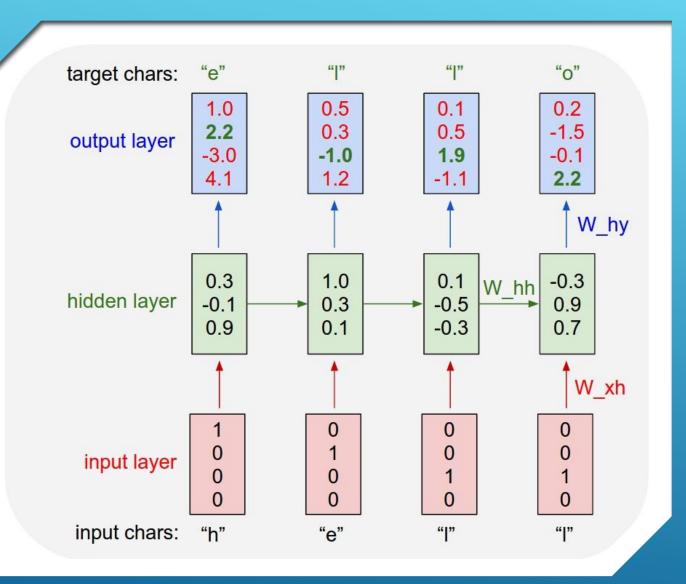
#### Can deal with arbitrary length input.

# RECURRENT NEURAL NETWORKS



### HOW TO LEARN

Back propagation through time



### WHAT CAN YOU DO WITH THESE?

 Process sequences of arbitrary length e.g. sentences

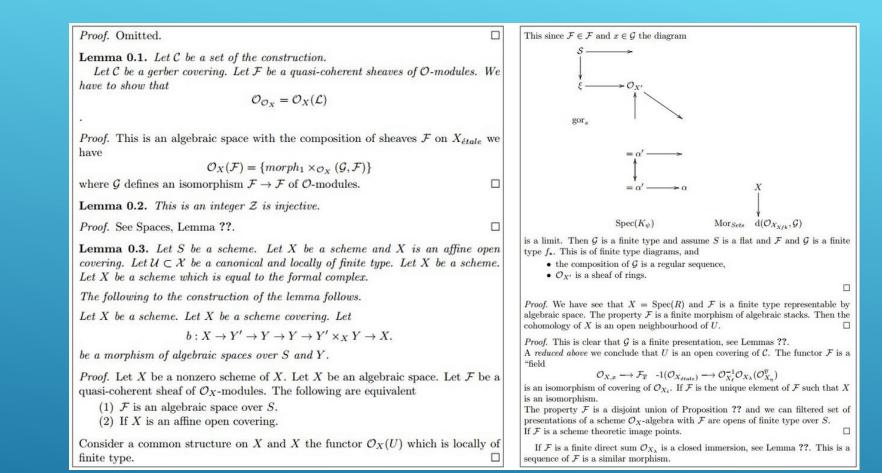
#### IOLA:

Why, Salisbury must find his flesh and thought That which I am not aps, not a man and in fire, To show the reining of the raven and the wars To grace my hand reproach within, and not a fair are hand, That Caesar and my goodly father's world; When I was heaven of presence and our fleets, We spare with hours, but cut thy council I am great, Murdered and by thy master's ready there My power to give thee but so much as hell: Some service in the noble bondman here, Would show him to her wine.

#### KING LEAR:

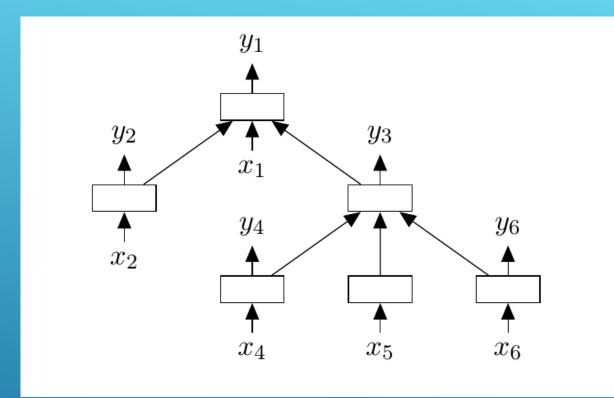
O, if you were a feeble sight, the courtesy of your law, Your sight and several breath, will wear the gods With his heads, and my hands are wonder'd at the deeds, So drop upon your lordship's head, and your o

## FAKE SHAKESPEARE

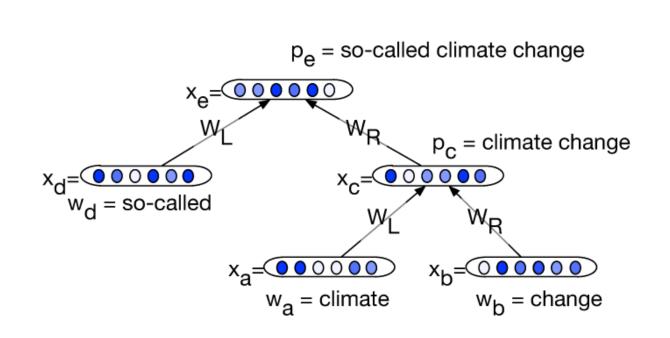


### WRITE MATH PAPERS IN LATEX

## PROBLEMS?

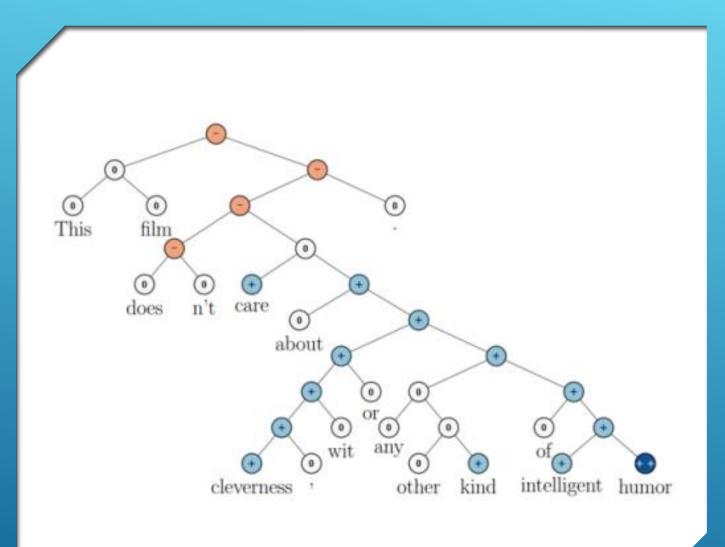


## **RECURSIVE NEURAL NETS**



#### USES

Political ideology detection



#### USES

Sentiment analysis

## AND MANY OTHERS.