

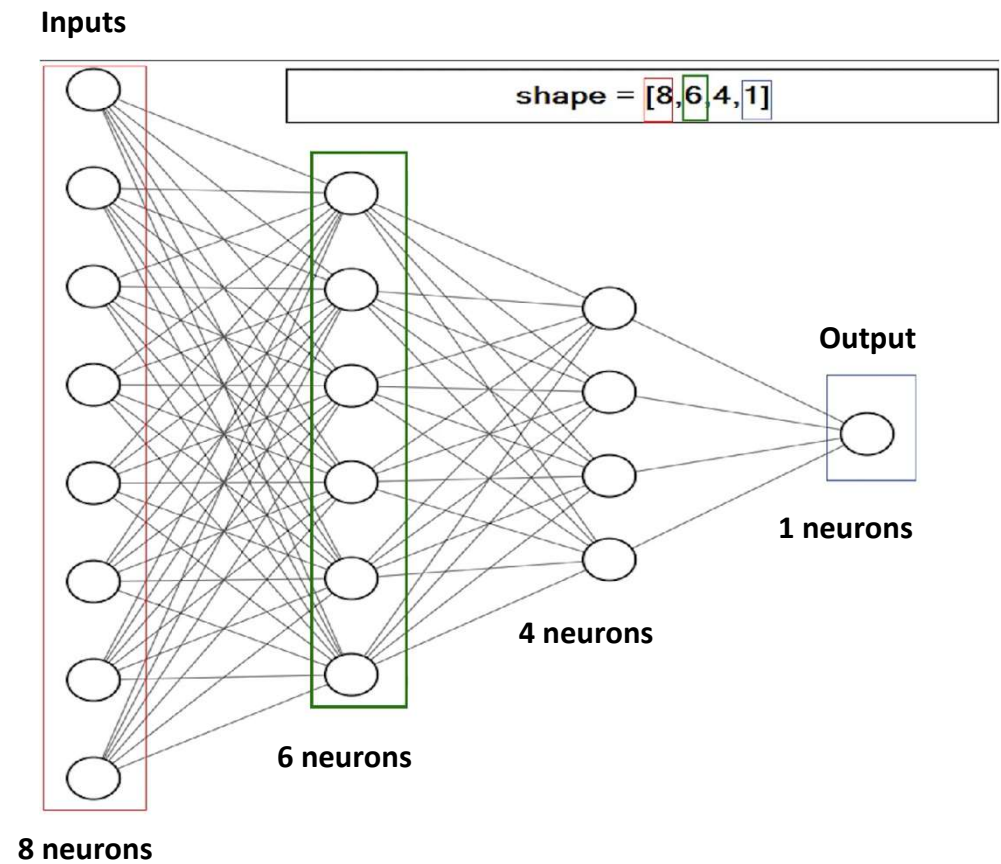
# Neural Networks

Dr. Jameel Malik

[muhammad.jameel@seecs.edu.pk](mailto:muhammad.jameel@seecs.edu.pk)

# A Multi-Layer Perceptron (MLP)

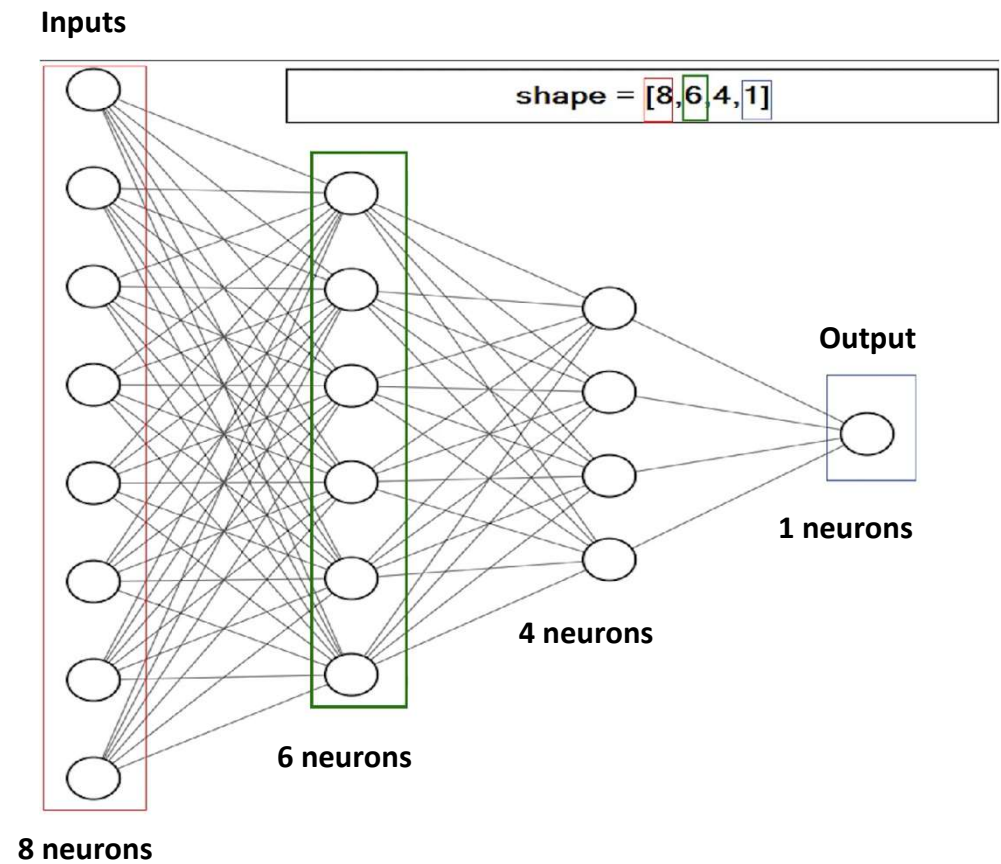
- Network Parameters (weights, biases)
  - **How many ?**



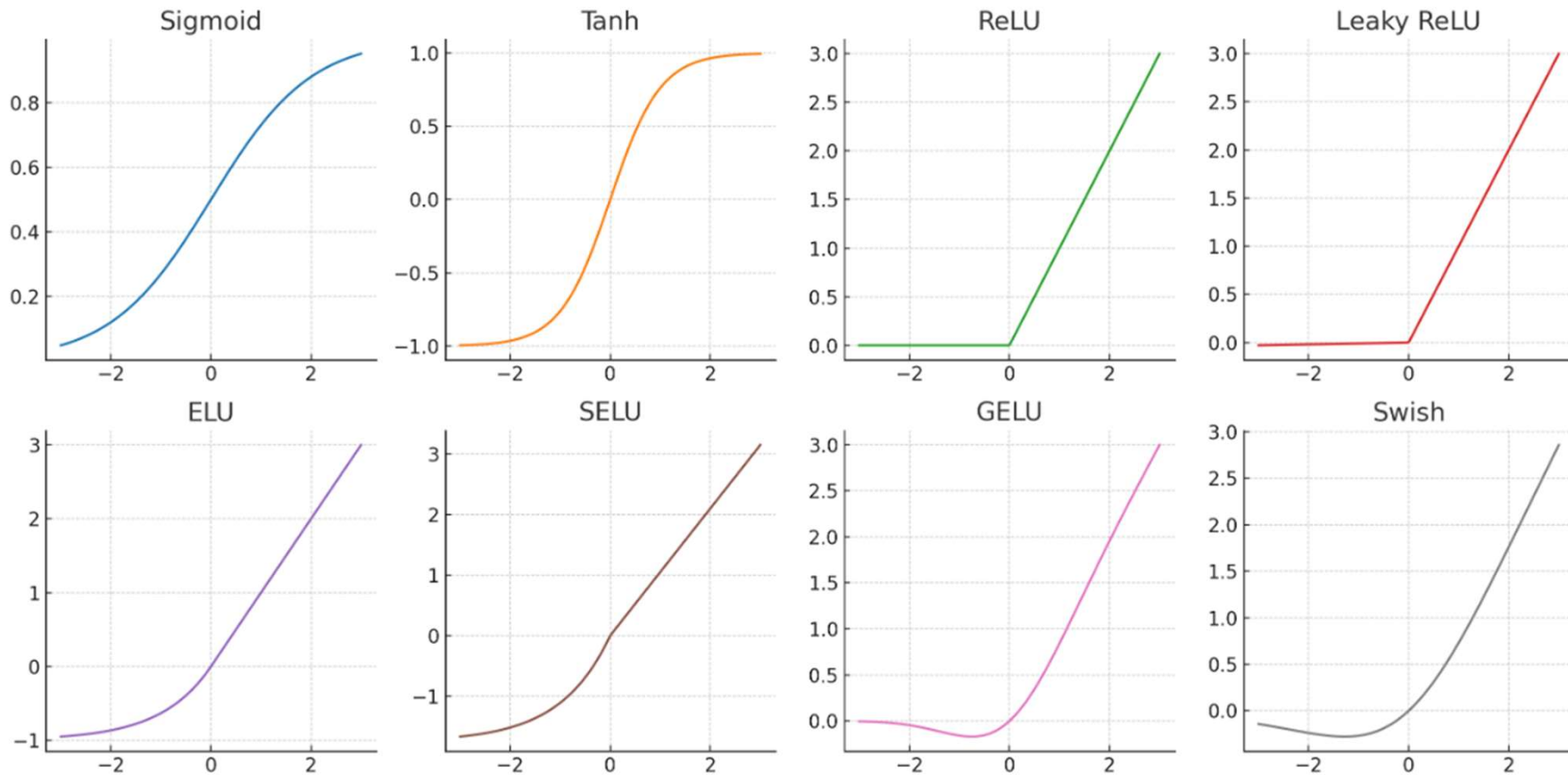
# A Multi-Layer Perceptron (MLP)

- Network Parameters (weights, biases)

$$\begin{aligned} & \blacksquare 48 \quad // 8 \times 6 \\ & + 24 \quad // 6 \times 4 \\ & + 4 \quad // 4 \times 1 \\ & + 11 = 87 \end{aligned}$$

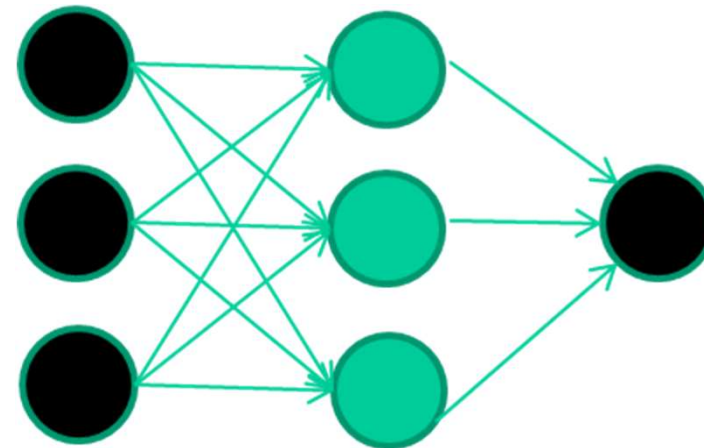


# Activation Functions -- Nonlinearity in NNs



*Suppose you are given with a labeled dataset as follows,*

| <i>Features</i> | <i>class</i> |
|-----------------|--------------|
| 1.4 2.7 1.9     | 0            |
| 3.8 3.4 3.2     | 0            |
| 6.4 2.8 1.7     | 1            |
| 4.1 0.1 0.2     | 0            |
| etc ...         |              |



Neural Network

*Training the neural network*

***Features***                      ***class***

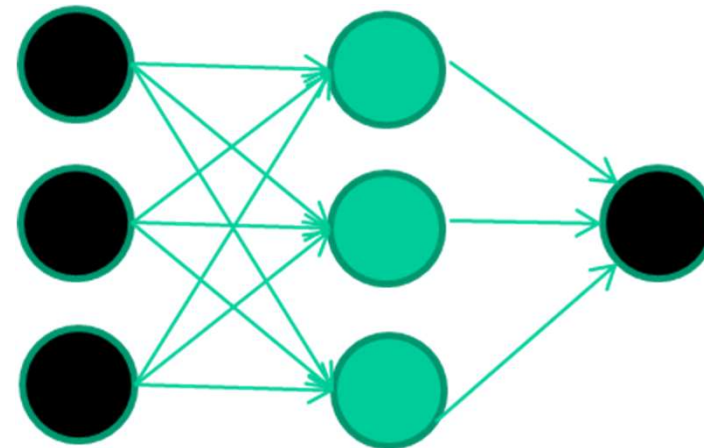
1.4 2.7 1.9                      0

3.8 3.4 3.2                      0

6.4 2.8 1.7                      1

4.1 0.1 0.2                      0

etc ...

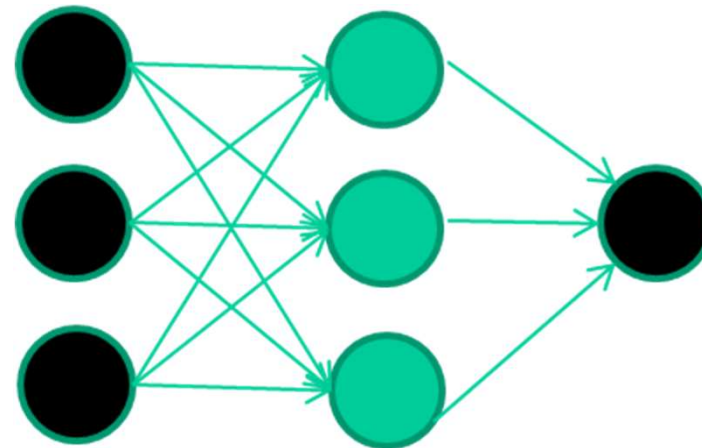


Neural Network

*Training data*

| <i>Features</i> | <i>class</i> |
|-----------------|--------------|
| 1.4 2.7 1.9     | 0            |
| 3.8 3.4 3.2     | 0            |
| 6.4 2.8 1.7     | 1            |
| 4.1 0.1 0.2     | 0            |
| etc ...         |              |

Initialise with random weights

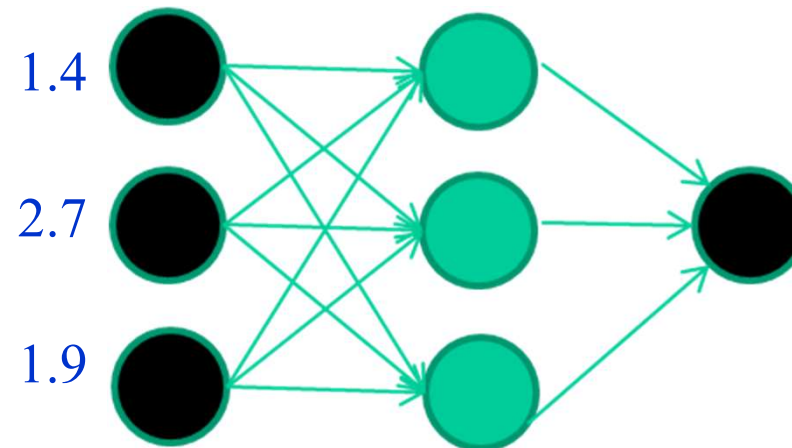


Neural Network

*Training data*

| <i>Features</i> |     |     | <i>class</i> |
|-----------------|-----|-----|--------------|
| 1.4             | 2.7 | 1.9 | 0            |
| 3.8             | 3.4 | 3.2 | 0            |
| 6.4             | 2.8 | 1.7 | 1            |
| 4.1             | 0.1 | 0.2 | 0            |
| etc ...         |     |     |              |

Present a training instance



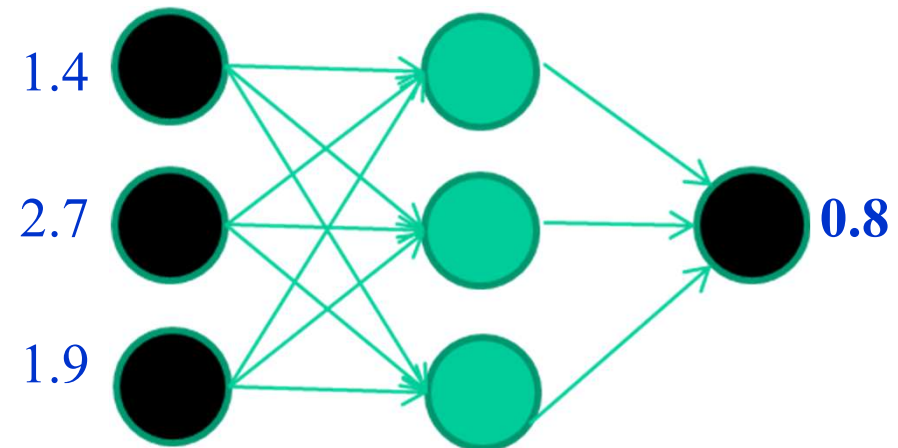
Neural Network



*Training data*

| <i>Features</i> |     |     | <i>class</i> |
|-----------------|-----|-----|--------------|
| 1.4             | 2.7 | 1.9 | 0            |
| 3.8             | 3.4 | 3.2 | 0            |
| 6.4             | 2.8 | 1.7 | 1            |
| 4.1             | 0.1 | 0.2 | 0            |
| etc ...         |     |     |              |

Feed it through to get output

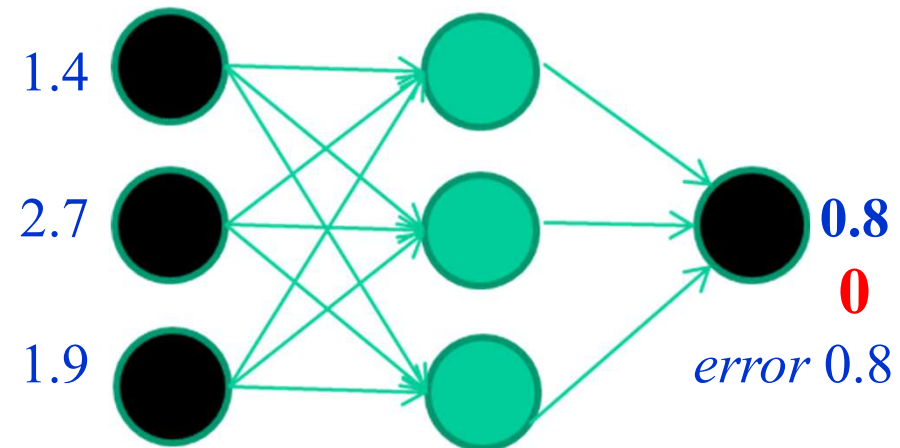


Neural Network

*Training data*

| <i>Features</i> |     |     | <i>class</i> |
|-----------------|-----|-----|--------------|
| 1.4             | 2.7 | 1.9 | 0            |
| 3.8             | 3.4 | 3.2 | 0            |
| 6.4             | 2.8 | 1.7 | 1            |
| 4.1             | 0.1 | 0.2 | 0            |
| etc ...         |     |     |              |

Compare with target output

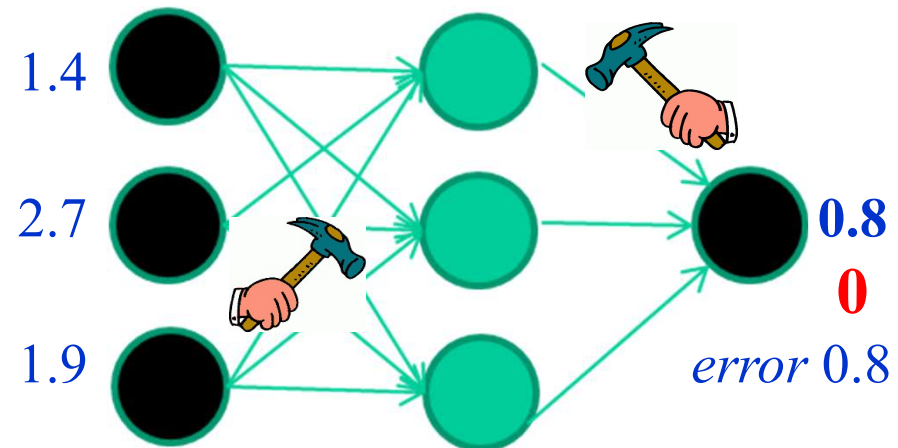


Neural Network

*Training data*

| <i>Features</i> |     |     | <i>class</i> |
|-----------------|-----|-----|--------------|
| 1.4             | 2.7 | 1.9 | 0            |
| 3.8             | 3.4 | 3.2 | 0            |
| 6.4             | 2.8 | 1.7 | 1            |
| 4.1             | 0.1 | 0.2 | 0            |
| etc ...         |     |     |              |

Adjust weights based on error



Neural Network

*Training data*

**Features**                      **class**

1.4 2.7 1.9                      0

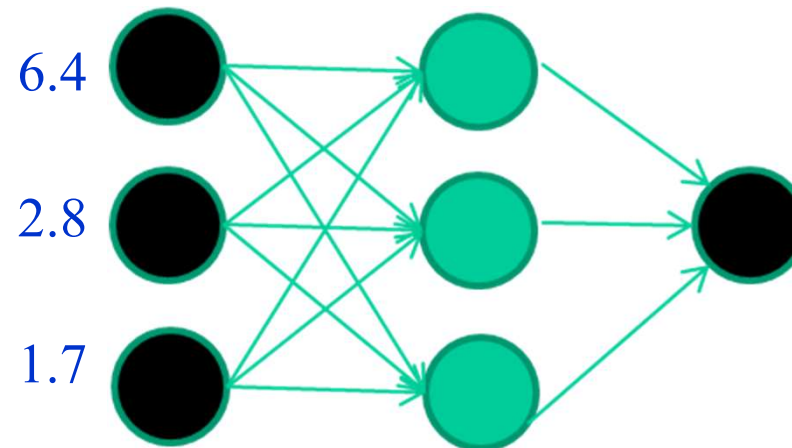
3.8 3.4 3.2                      0

6.4 2.8 1.7                      1

4.1 0.1 0.2                      0

etc ...

Present a training instance



Neural Network

*Training data*

***Features***                      ***class***

1.4 2.7 1.9                      0

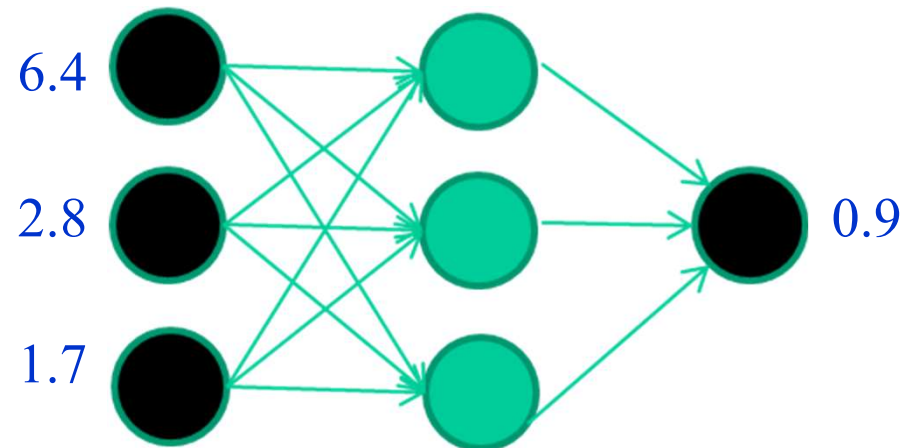
3.8 3.4 3.2                      0

6.4 2.8 1.7                      1

4.1 0.1 0.2                      0

etc ...

Feed it through to get output



Neural Network

*Training data*

**Features** **class**

1.4 2.7 1.9 0

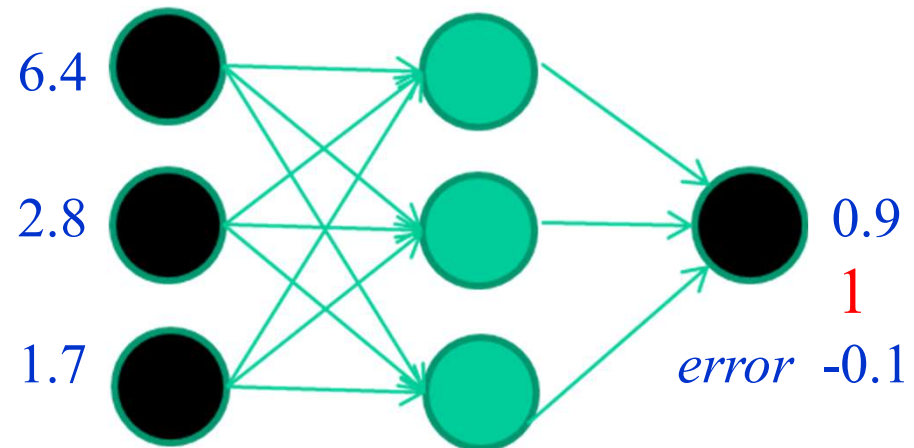
3.8 3.4 3.2 0

6.4 2.8 1.7 1

4.1 0.1 0.2 0

etc ...

Compare with target output



Neural Network

*Training data*

**Features** **class**

1.4 2.7 1.9 0

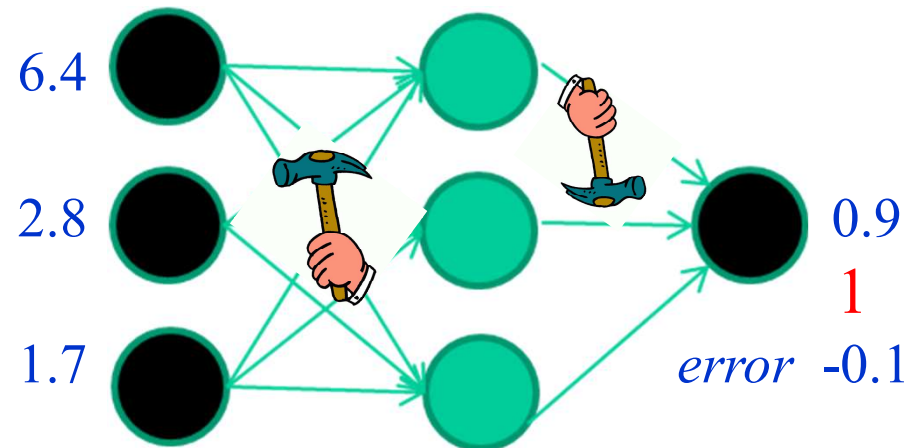
3.8 3.4 3.2 0

6.4 2.8 1.7 1

4.1 0.1 0.2 0

etc ...

Adjust weights based on error



Neural Network

### *Training data*

**Features** **class**

1.4 2.7 1.9 0

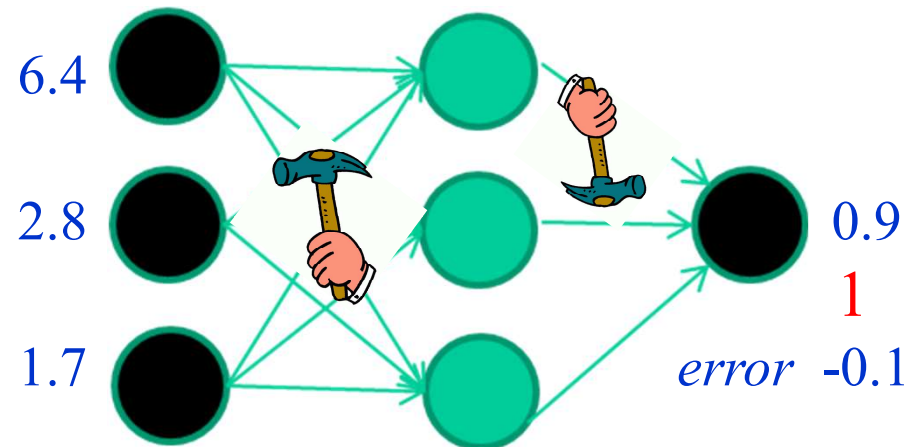
3.8 3.4 3.2 0

6.4 2.8 1.7 1

4.1 0.1 0.2 0

etc ...

And so on ....



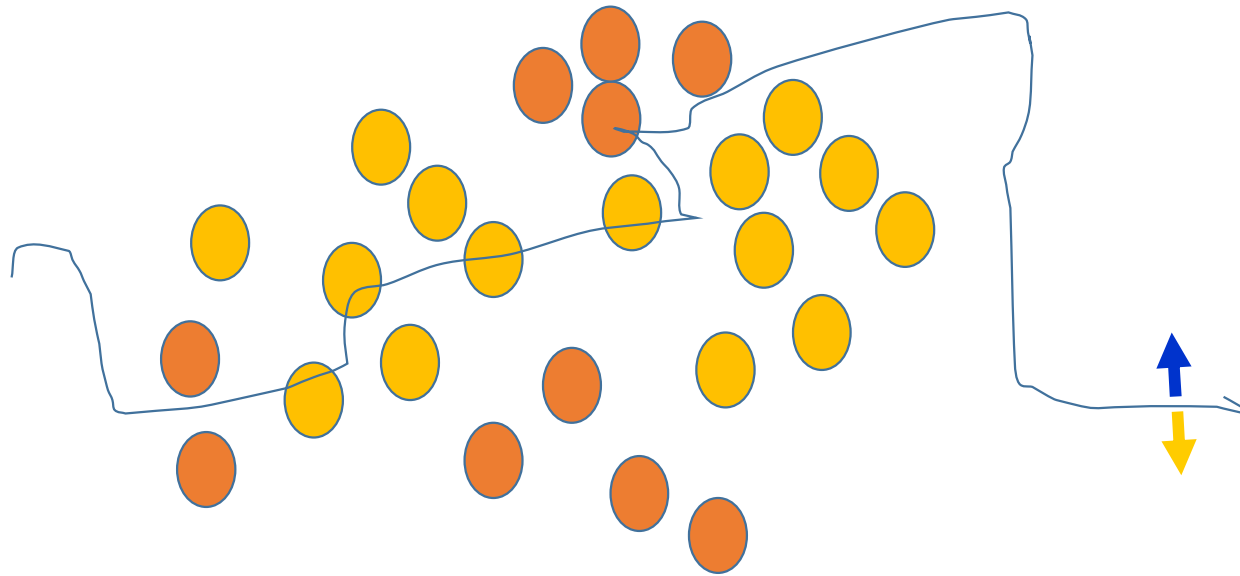
Repeat this thousands, maybe millions of times – each time taking a random training instance, and making slight weight adjustments

Algorithms for weight adjustment are designed to make changes that will reduce the error



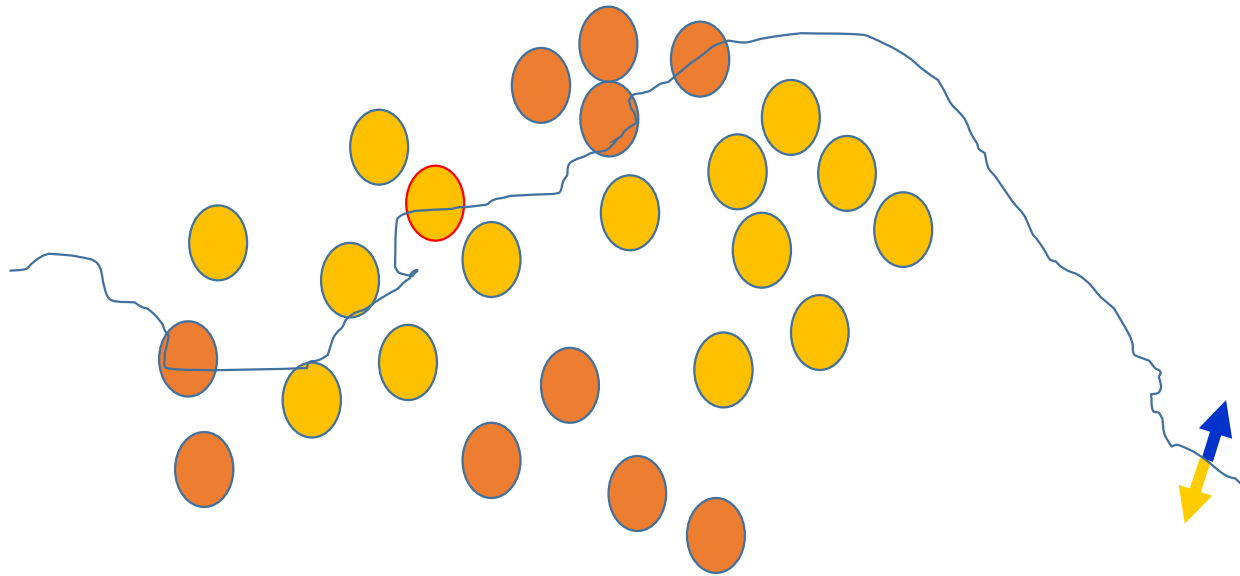
# The decision boundary perspective...

**Initial random weights**



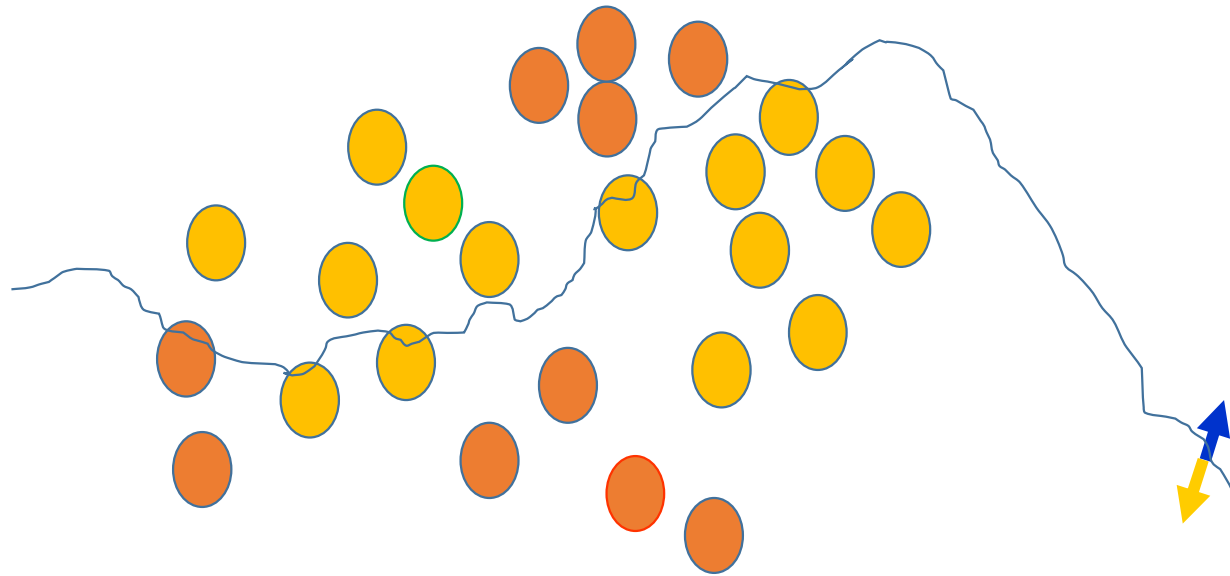
# The decision boundary perspective...

**Present a training instance / adjust the weights**



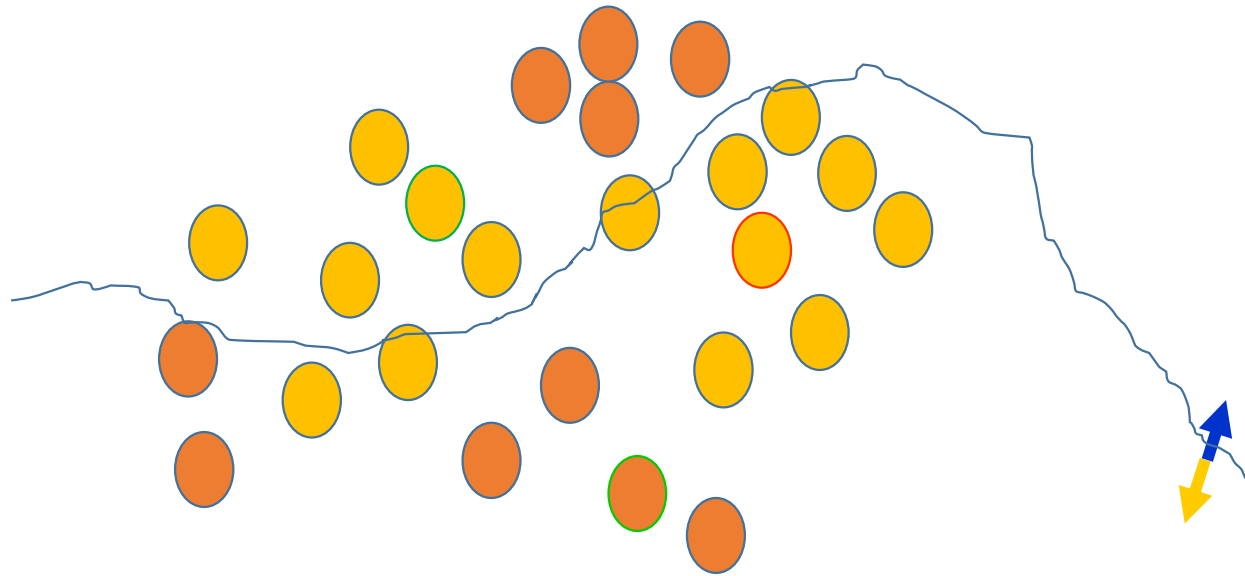
# The decision boundary perspective...

**Present a training instance / adjust the weights**



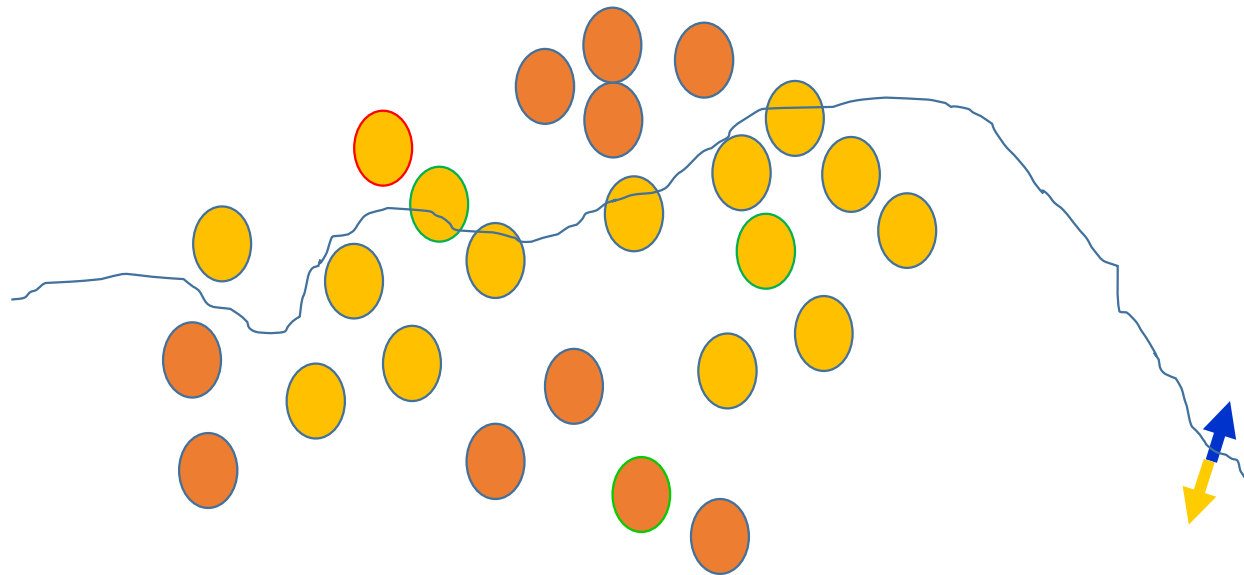
# The decision boundary perspective...

**Present a training instance / adjust the weights**



# The decision boundary perspective...

**Present a training instance / adjust the weights**



# The decision boundary perspective...

Eventually ....

