

# Creating Neural Networks in TensorFlow

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**Jerry Kurata**

CONSULTANT

@jerrykur [www.insteptech.com](http://www.insteptech.com)

# Training Steps

**Prepared Data**

**Inference**

**Loss Measurement**

**Optimize to Minimize Loss**



# Overview



**Introduction to Neural Networks**

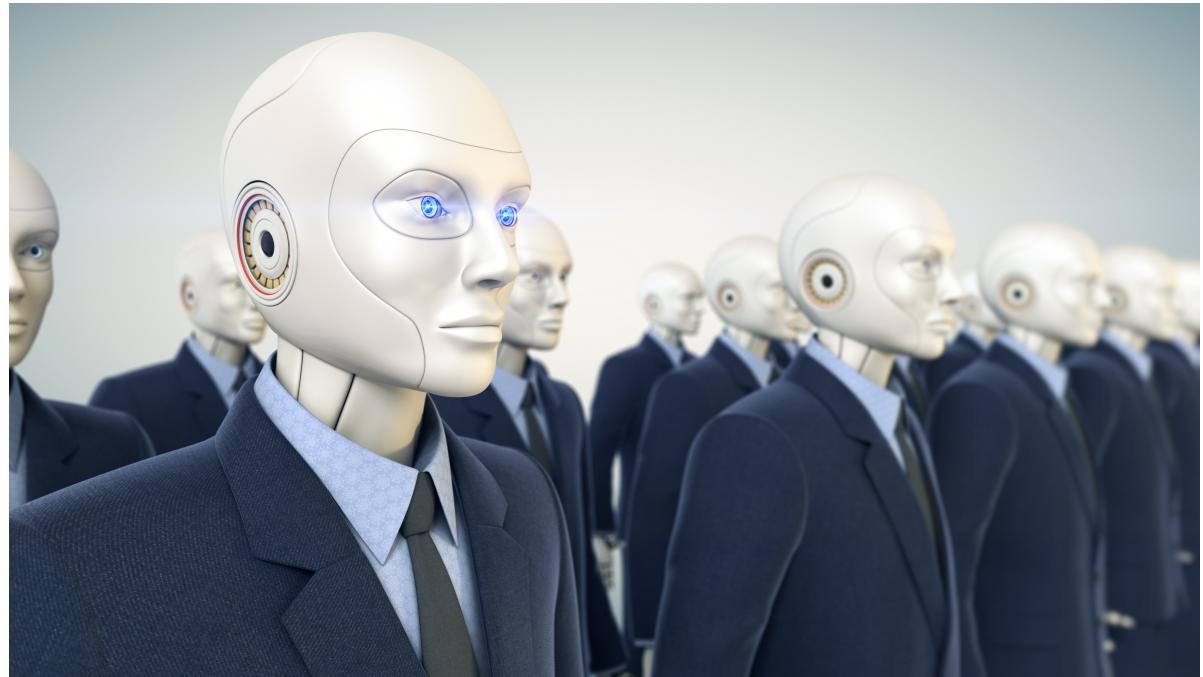
**Building a simple Neural Network**

**Creating Deep Neural Networks**

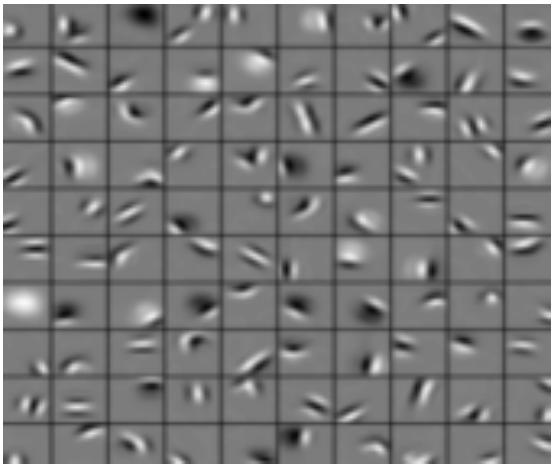
**TensorFlow makes Neural Networks  
simple**



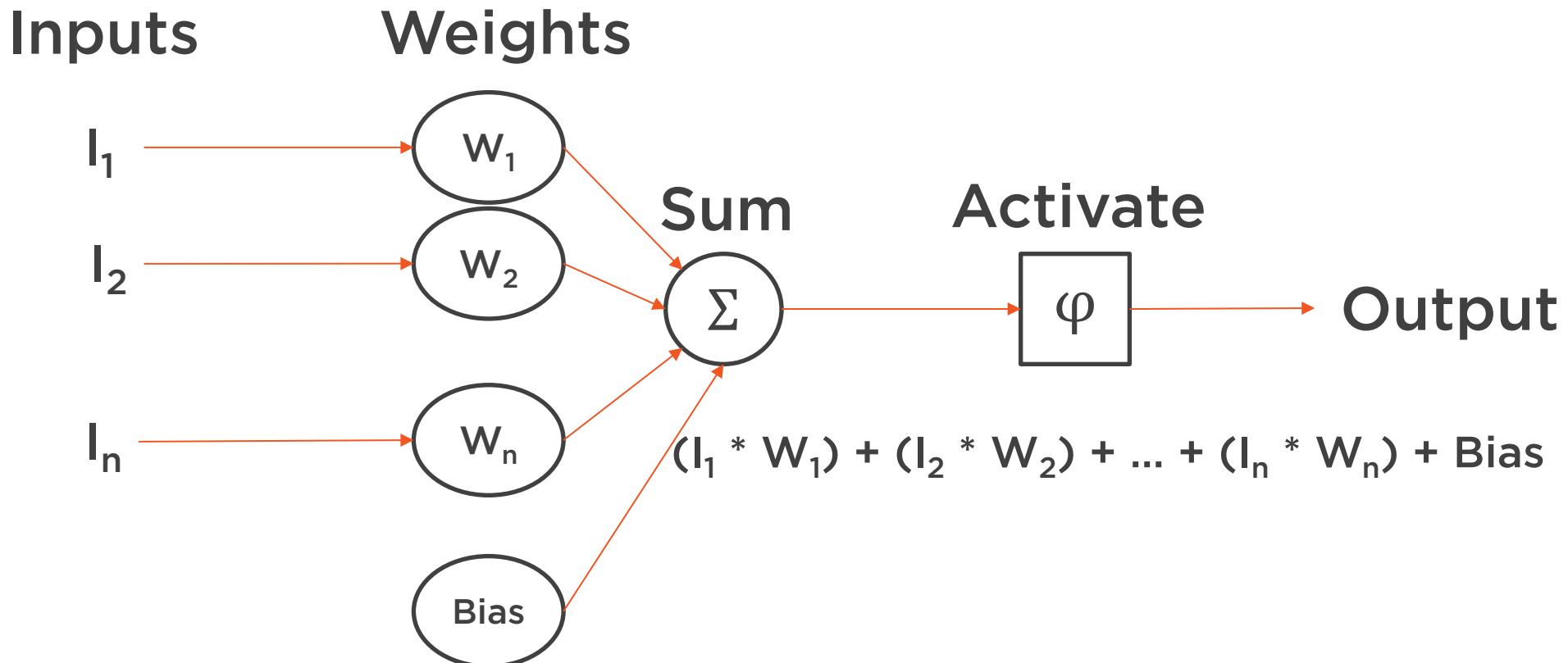
# Neural Networks are



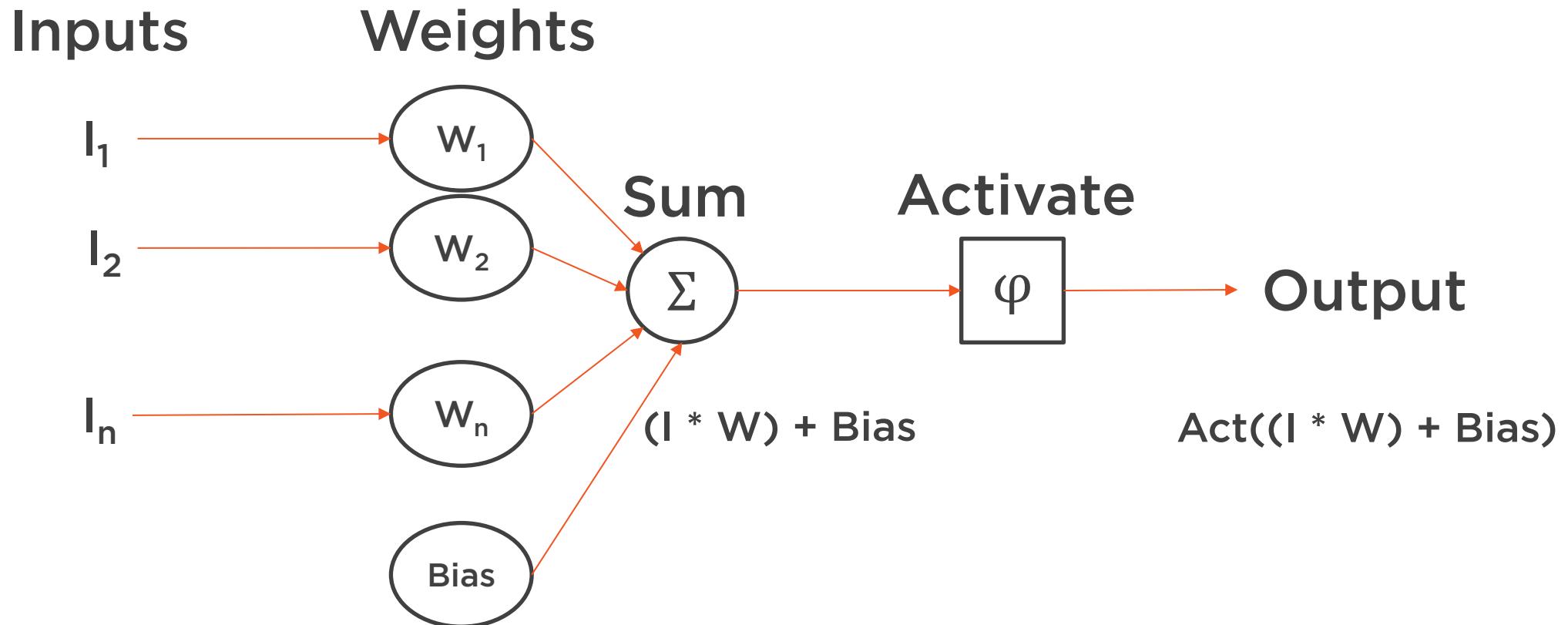
# Neural Network Learning



# Neuron Architecture



# Neuron Architecture

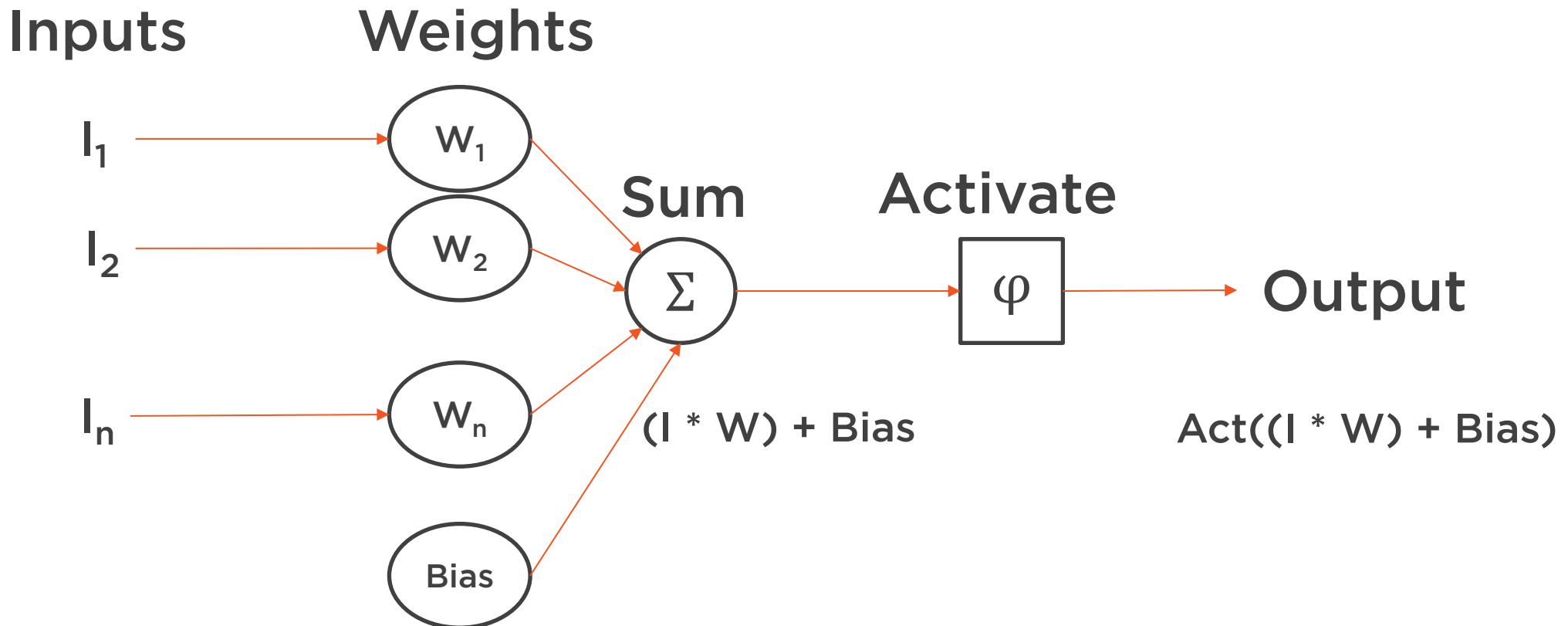


# Linear Regression Example Revisited

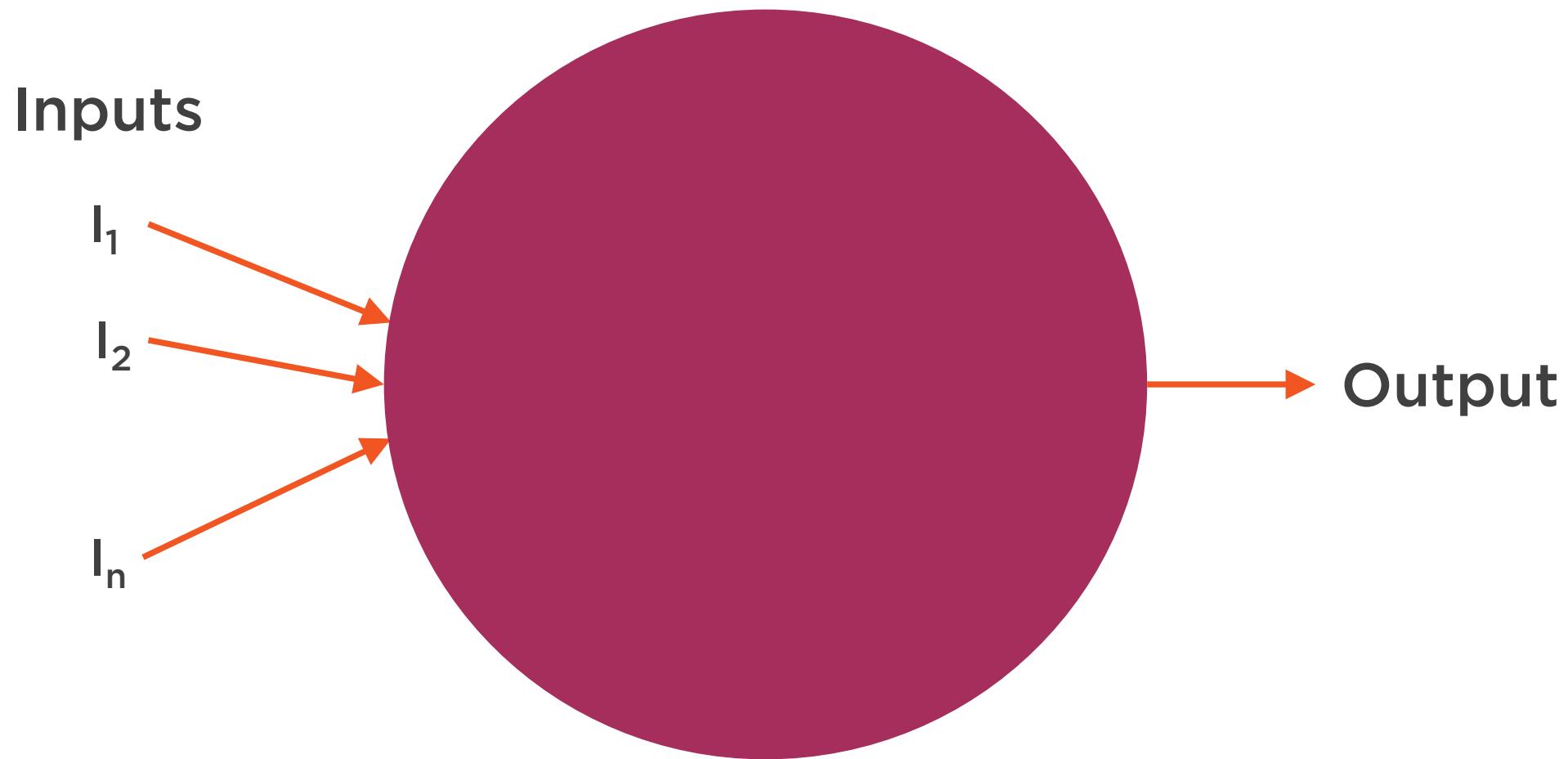
```
tf_price_pred = tf.add(tf.multiply(tf_size_factor,  
                                  tf_house_size), tf_price_offset)  
  
tf_cost = tf.reduce_sum(tf.pow(tf_price_pred-tf_price, 2))  
            /(2*num_train_samples)  
  
optimizer = tf.train.GradientDescentOptimizer(learning_rate)  
            .minimize(tf_cost)
```



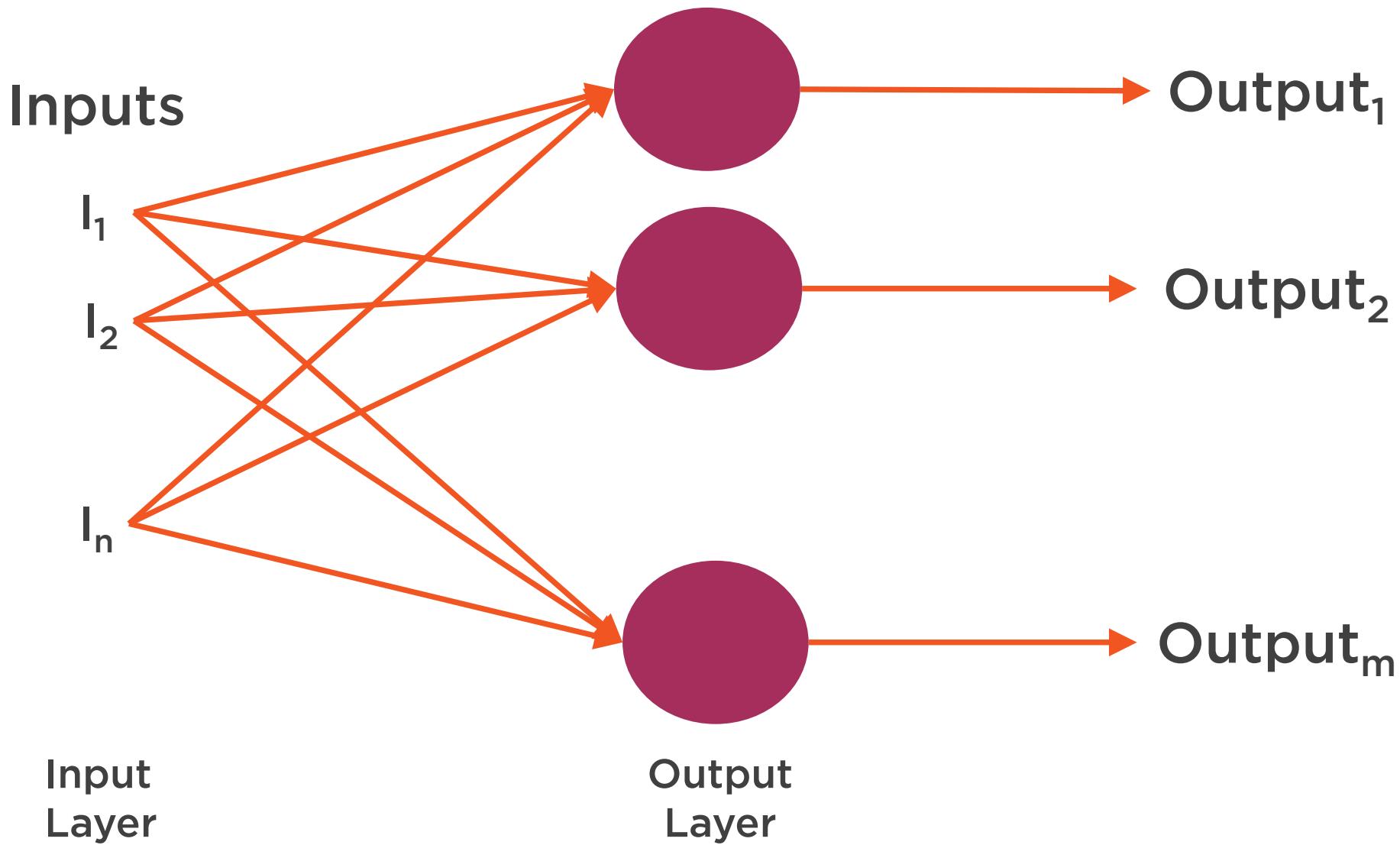
# Neuron Architecture



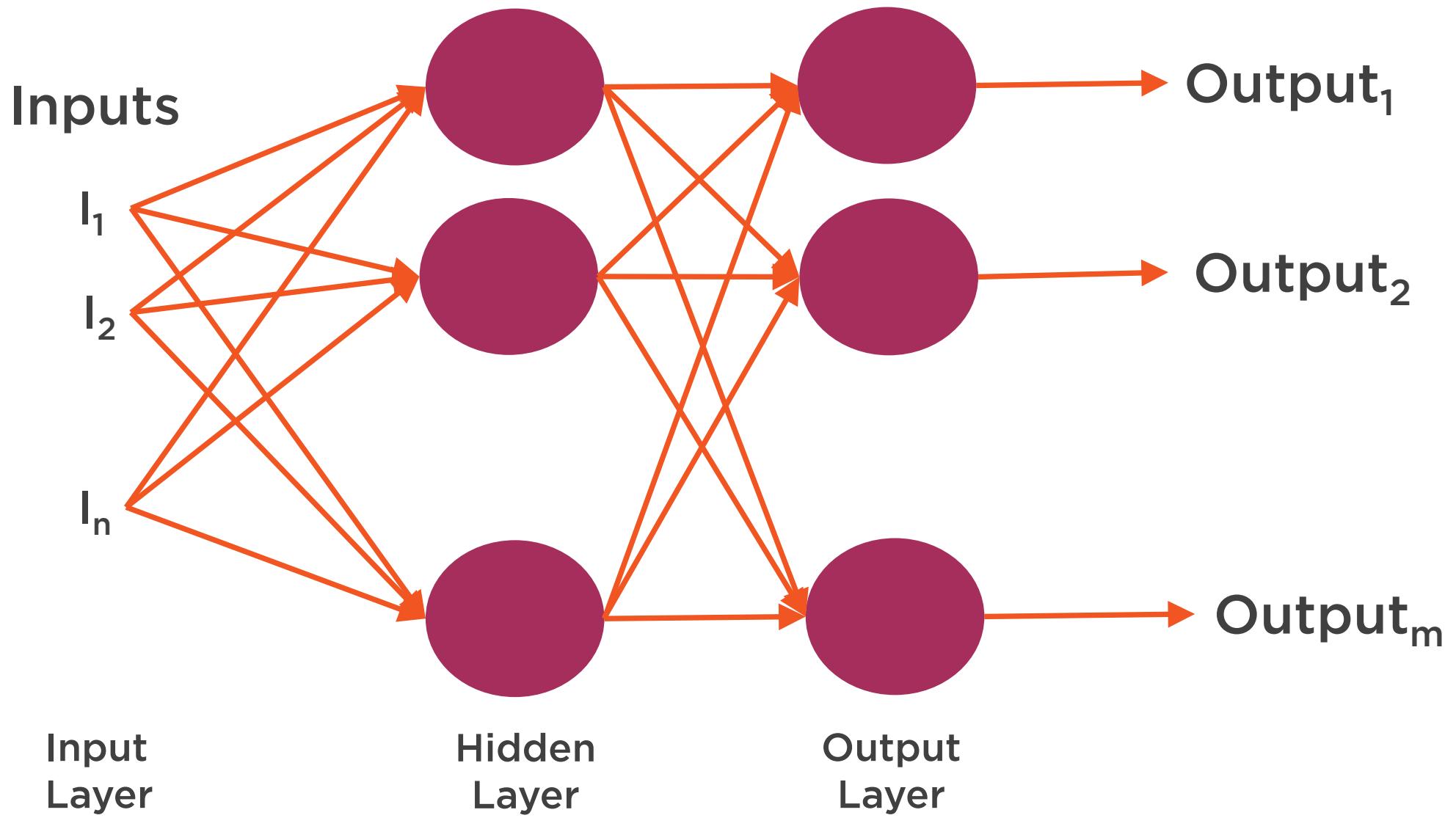
# Neuron



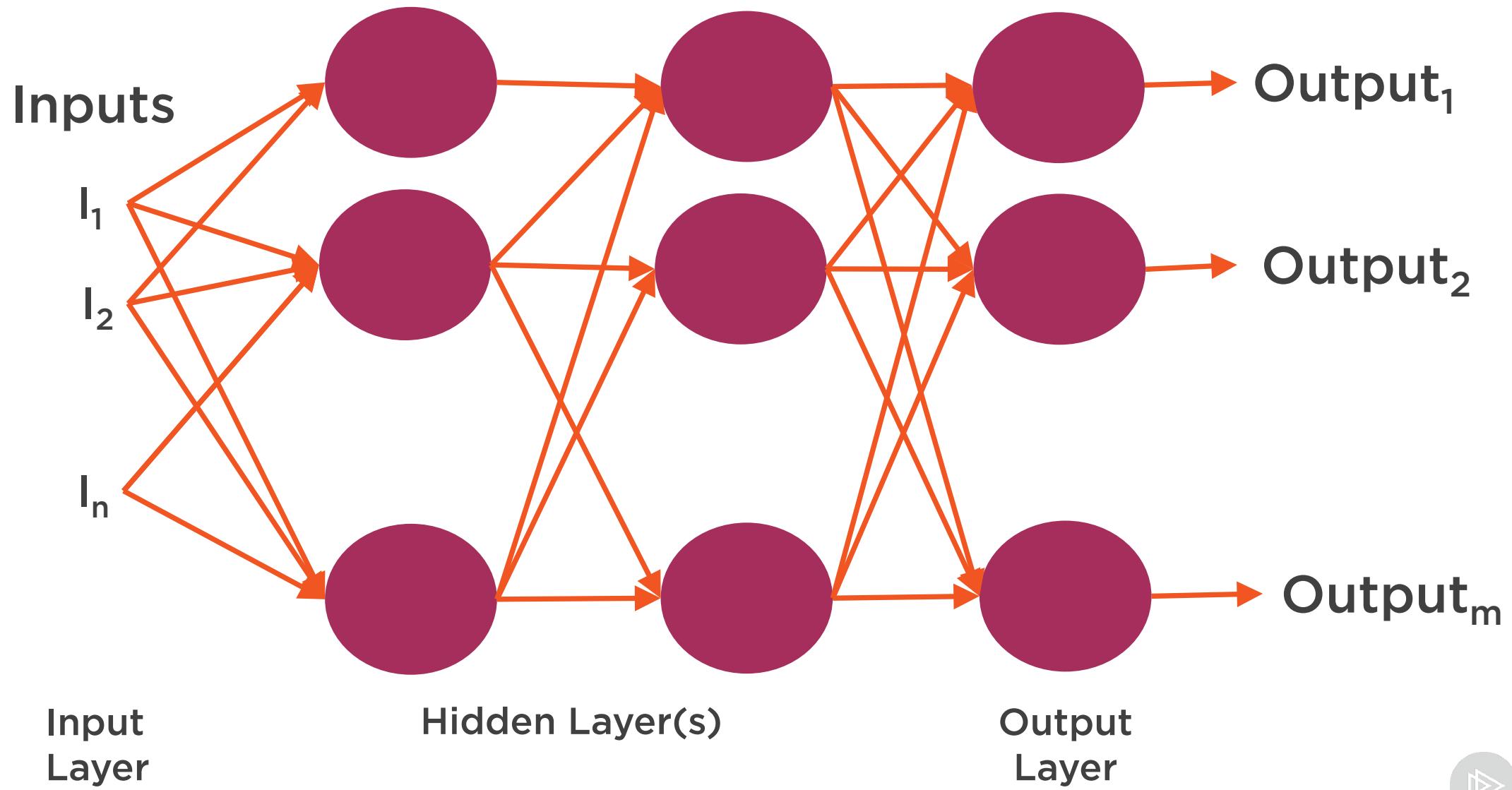
# Neural Network Layers



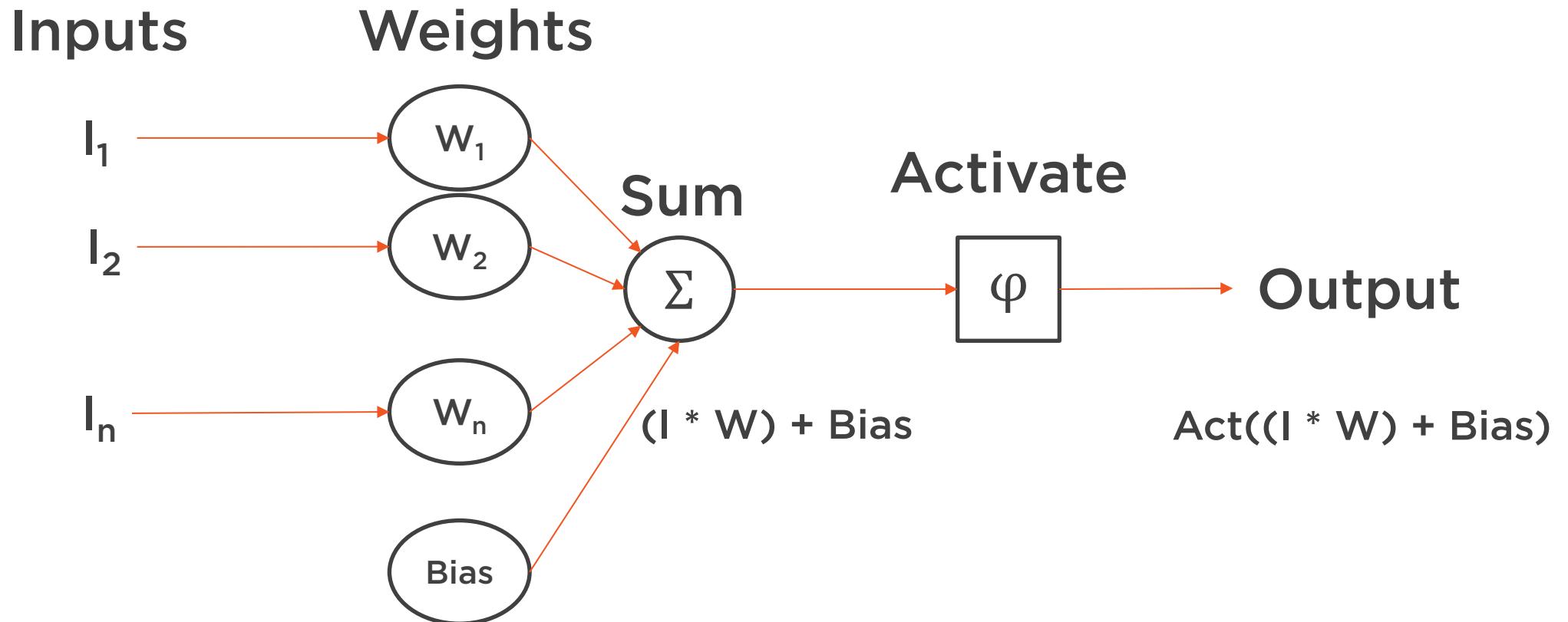
# Neural Network Layers



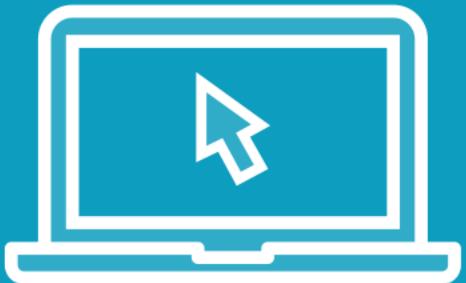
# Deep Neural Network Layers



# Neuron Architecture



# Simple Neural Network



**Handwritten digit recognition**

**MNIST dataset**

**[yann.lecun.com/exdb/mnist](http://yann.lecun.com/exdb/mnist)**

**Classic testing set**



# MNIST Data



**70,000 data points**

- 55,000 training
- 10,000 test
- 5,000 validation

**Each data point contains**

- 28 X 28 grayscale image
- Label – the digit, 0-9

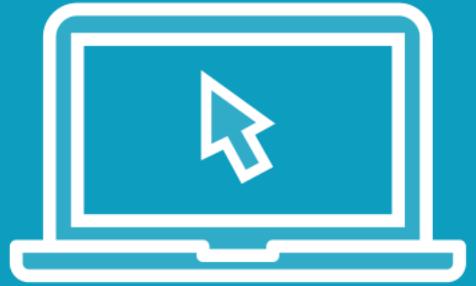
**Helper routines on TensorFlow site**



# Training a Neural Network with TensorFlow

Concept	Implementation
Prepared Data	MNIST Data
Inference	$(x * \text{weight} + \text{bias}) \rightarrow \text{activation}$
Loss Measurement	Cross Entropy
Optimize to Minimize Loss	Gradient Descent Optimizer

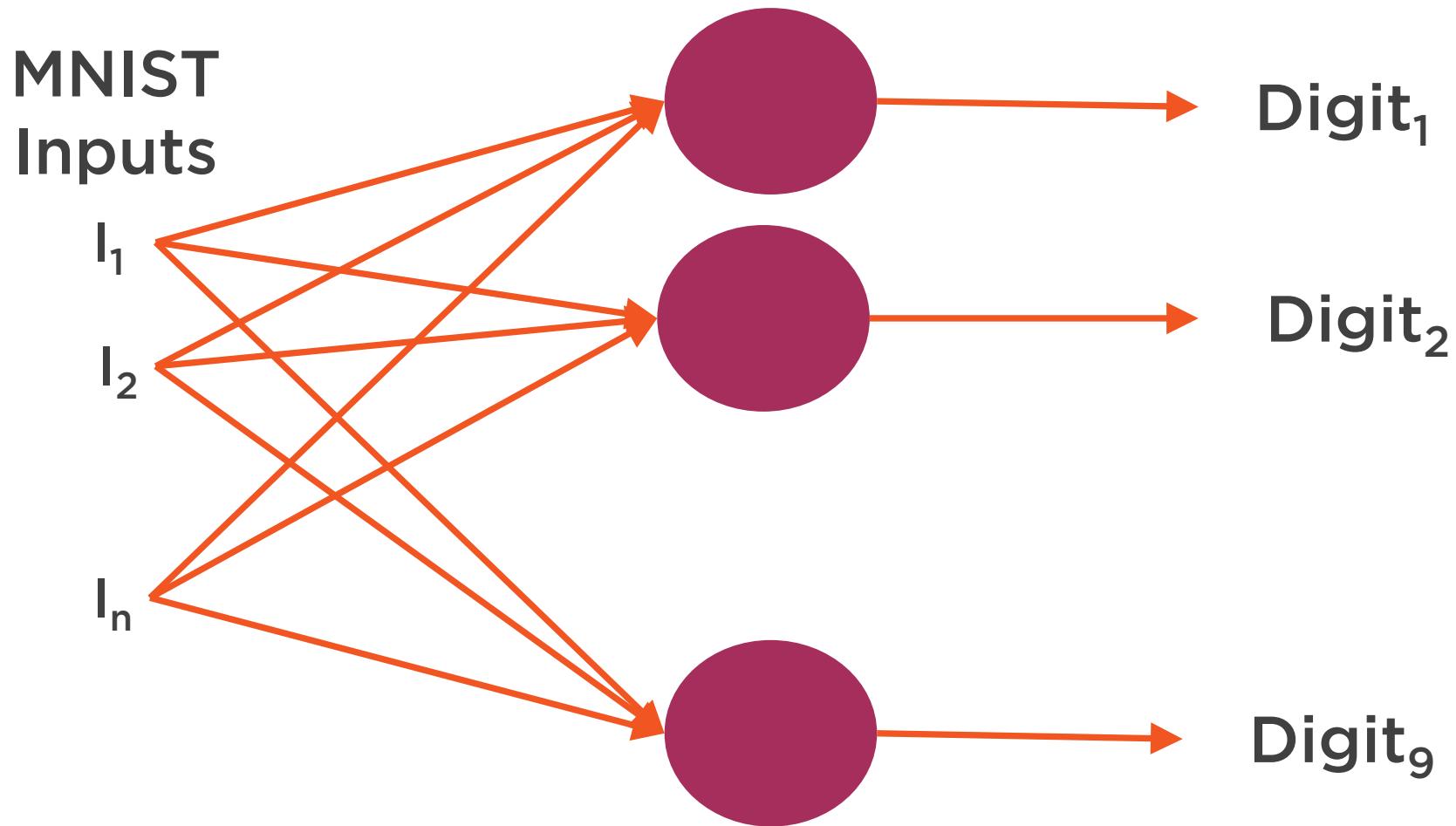




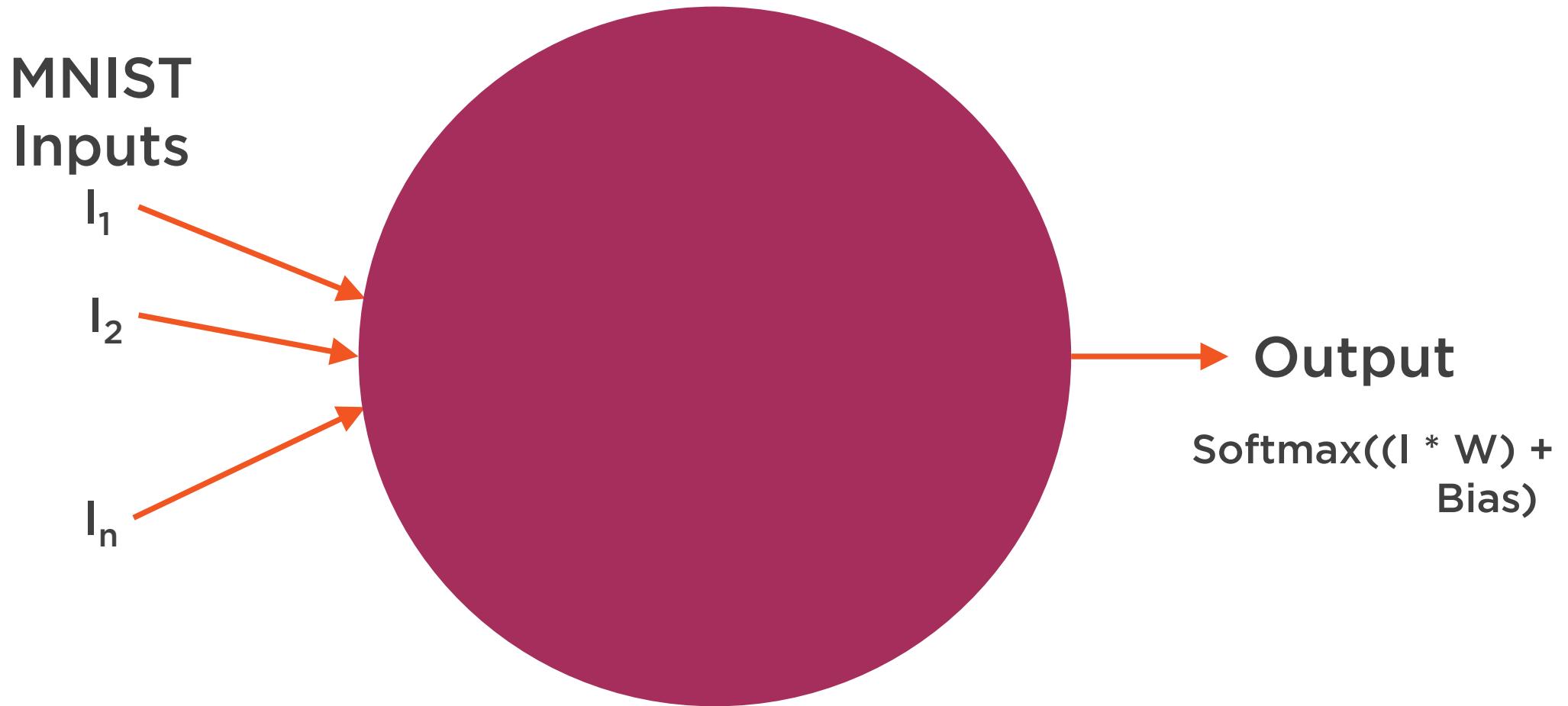
Create **MNIST\_Basic.py**  
**DO NOT SHOW SLIDE**



# MNIST Neural Network

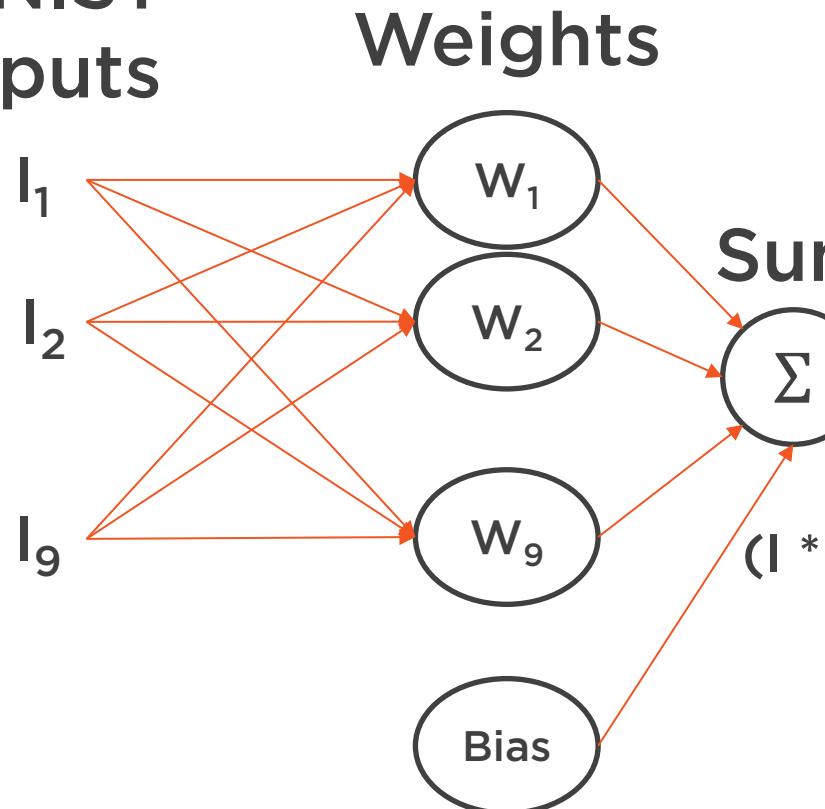


# MNIST Neuron

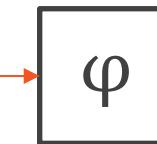


# MNIST Neuron Architecture

**MNIST  
Inputs**



**Softmax  
Activate**



**Output**

$$\text{Softmax}((I * W) + \text{Bias})$$

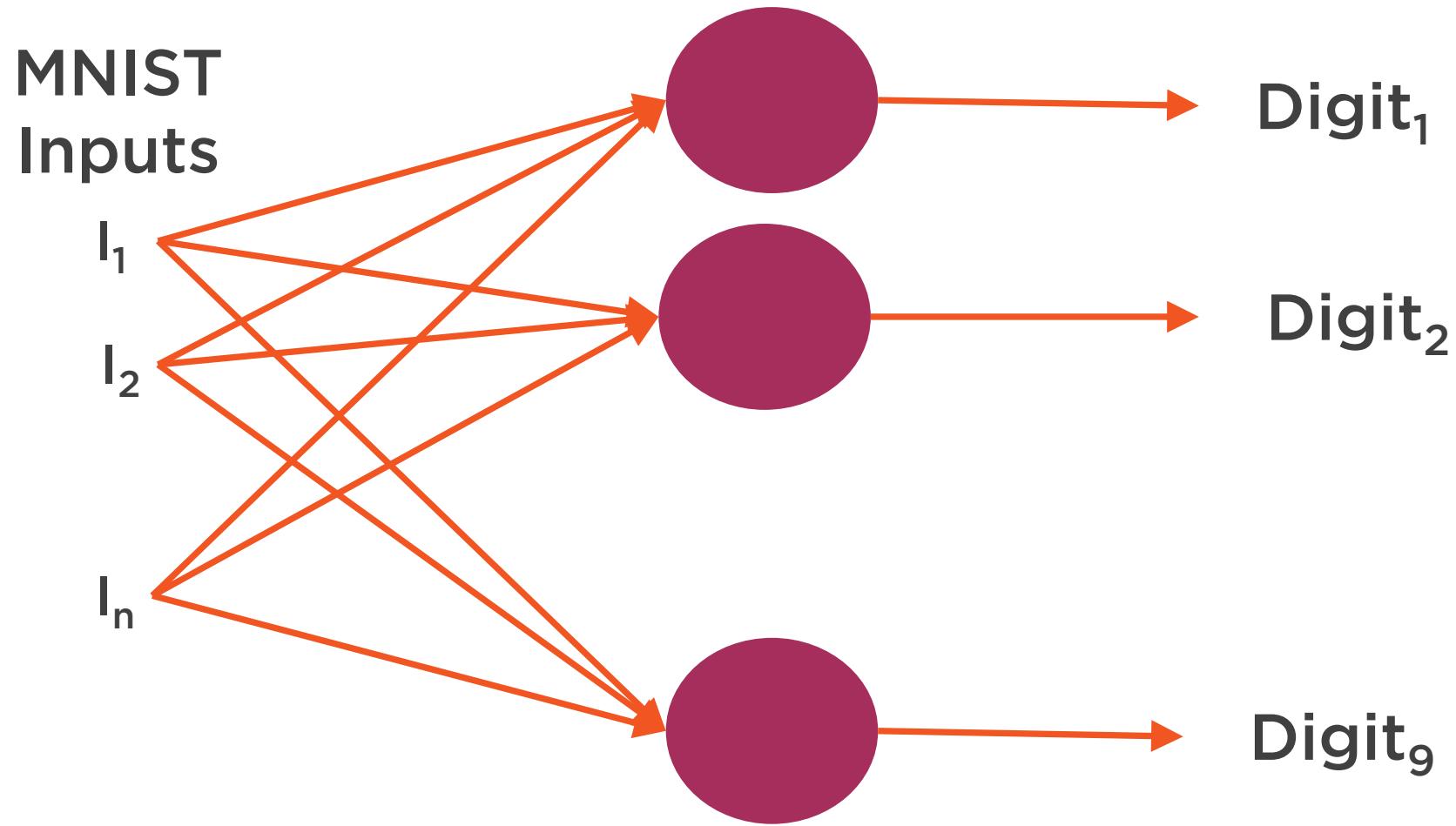


# Improving Performance by Going Deep

**Deeper networks can learn more details**  
**Simple to do with TensorFlow**



# Simple MNIST Neural Network



# Deepening the Network

## Consider data

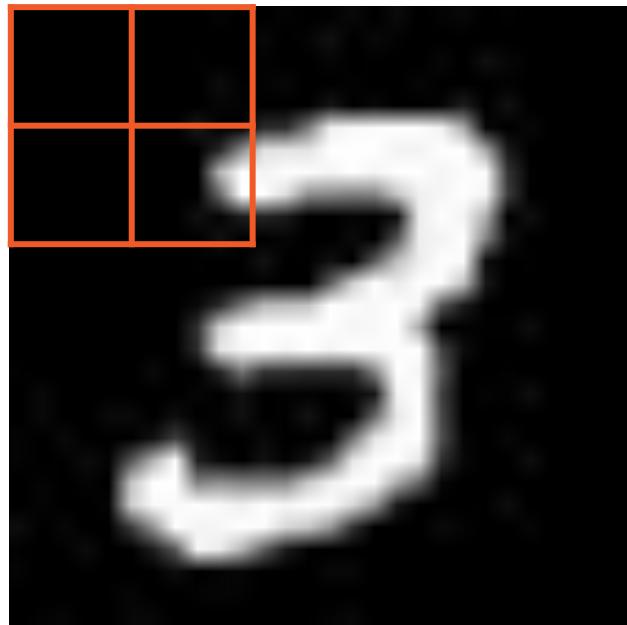
- We have images!

## Insert Convolution Network layers

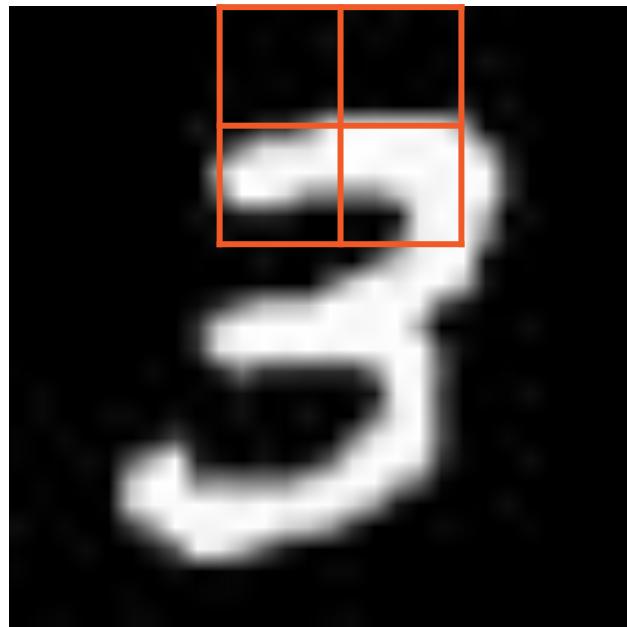
- Inspects subsets of image
- Learns features of image



# Convolution Layer



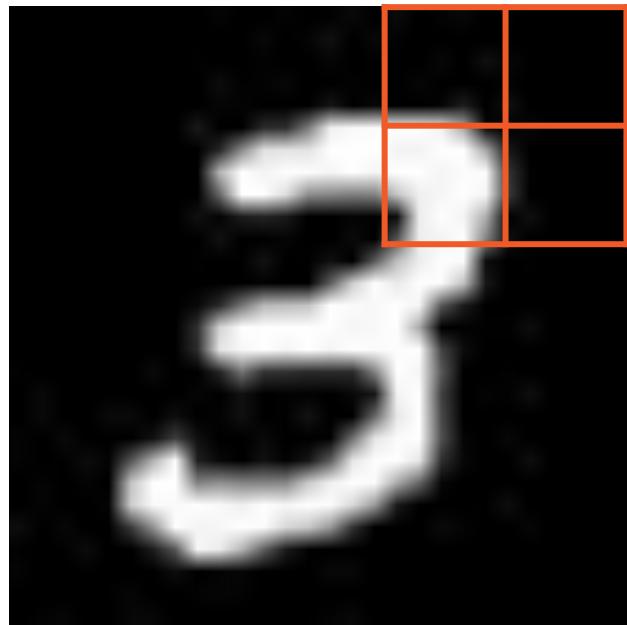
# Convolution Layer



.0	.0
.0	.2



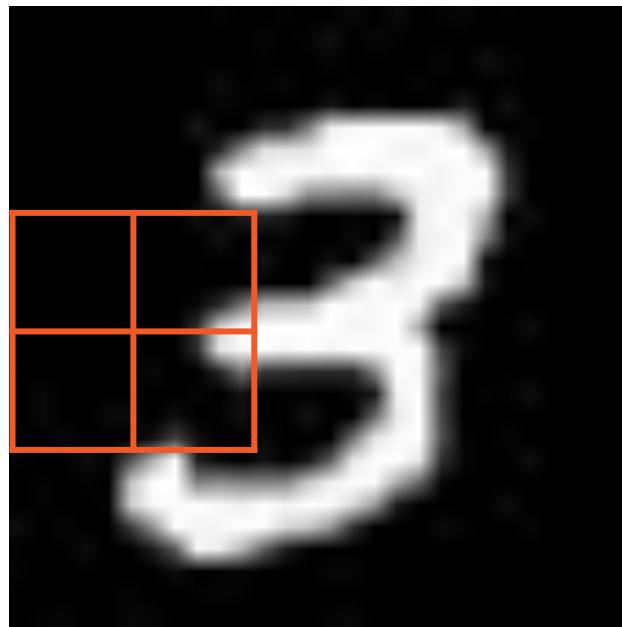
# Convolution Layer



.0	.0	.1	.2
.0	.2	.7	.9



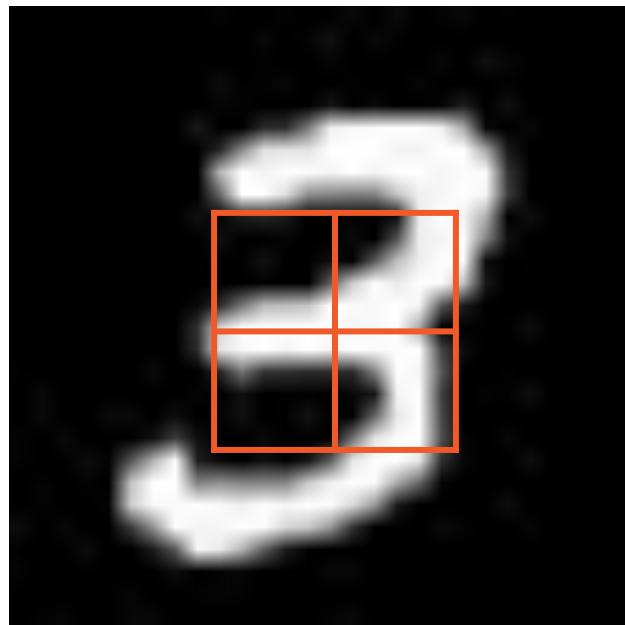
# Convolution Layer



.0	.0	.1	.2	.1	.0
.0	.2	.7	.9	.9	.0



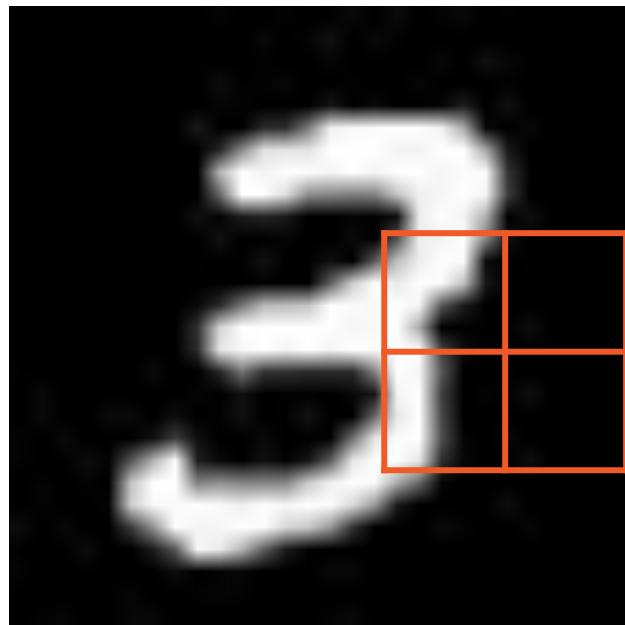
# Convolution Layer



.0	.0	.1	.2	.1	.0
.0	.2	.7	.9	.9	.0
.0	.2				
.0	.2				



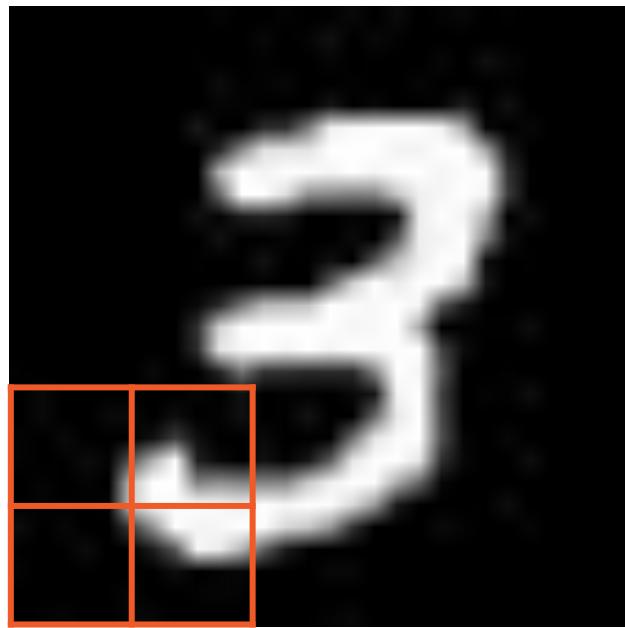
# Convolution Layer



.0	.0	.1	.2	.1	.0
.0	.2	.7	.9	.9	.0
.0	.2	.4	.5	.8	.0
.0	.2	.3	.7	.5	.0



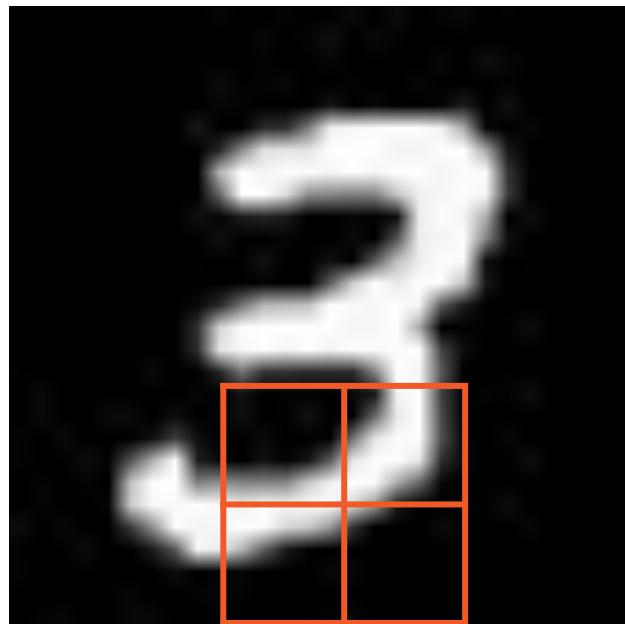
# Convolution Layer



.0	.0	.1	.2	.1	.0
.0	.2	.7	.9	.9	.0
.0	.2	.4	.5	.8	.0
.0	.2	.3	.7	.5	.0



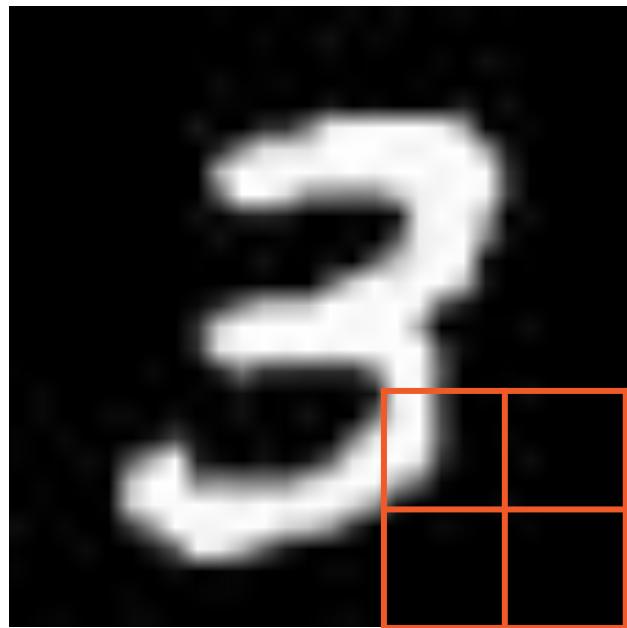
# Convolution Layer



.0	.0	.1	.2	.1	.0
.0	.2	.7	.9	.9	.0
.0	.2	.4	.5	.8	.0
.0	.2	.3	.7	.5	.0
.1	.5				
.1	.4				



# Convolution Layer



.0	.0	.1	.2	.1	.0
.0	.2	.7	.9	.9	.0
.0	.2	.4	.5	.8	.0
.0	.2	.3	.7	.5	.0
.1	.5	.4	.9		
.1	.4	.3	.1		



# Convolution Layer



Sample 1

.0	.0	.1	.2	.1	.0
.0	.2	.7	.9	.9	.0
.0	.2	.4	.5	.8	.0
.0	.2	.3	.7	.5	.0
.1	.5	.4	.9	.4	.0
.1	.4	.3	.1	.0	.0



# Convolution Layer



Sample 2

.1	.1	.1	.2	.1	.0
.3	.3	.7	.9	.7	.0
.0	.1	.4	.5	.6	.0
.0	.1	.3	.7	.6	.0
.1	.6	.4	.9	.6	.0
.1	.4	.3	.1	.0	.0



# Convolution Layer



Sample 3

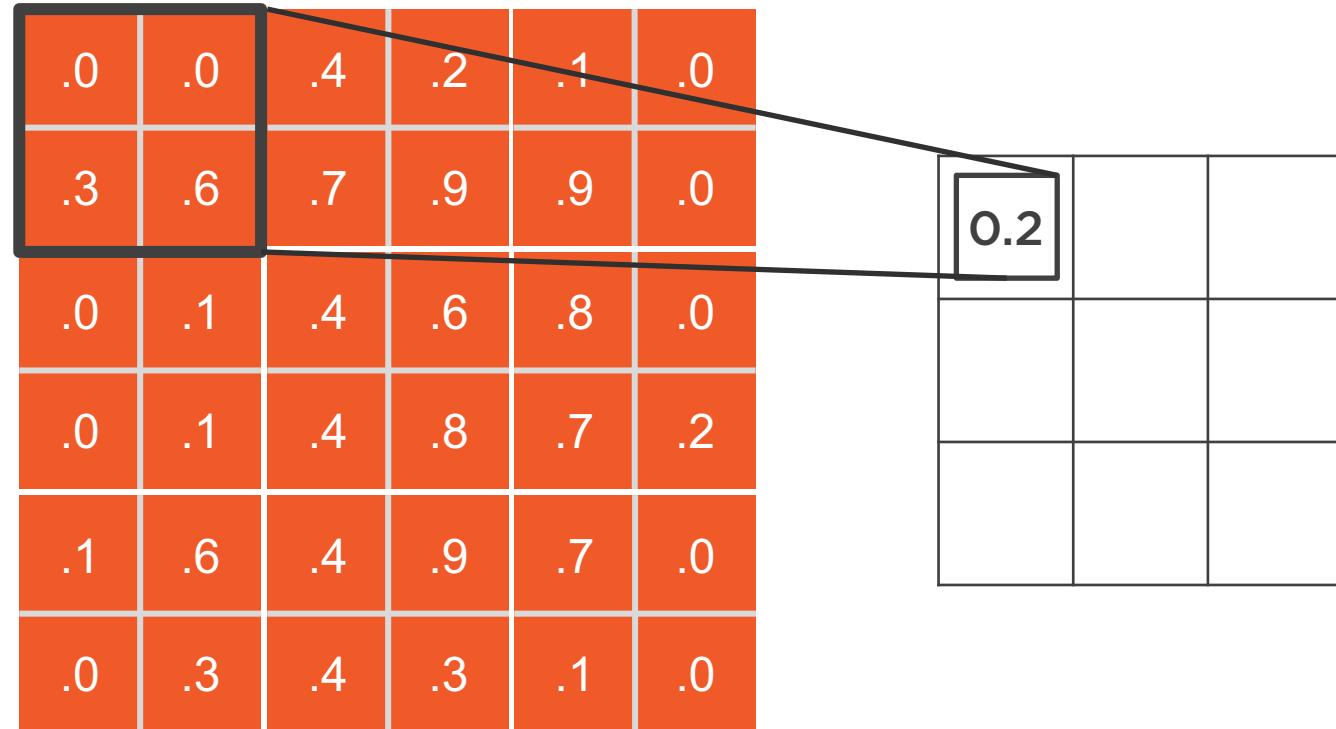
.1	.1	.1	.2	.1	.0
.2	.4	.7	.9	.9	.0
.0	.1	.6	.6	.8	.0
.0	.1	.5	.6	.5	.0
.1	.5	.3	.8	.4	.0
.1	.4	.4	.2	.0	.0



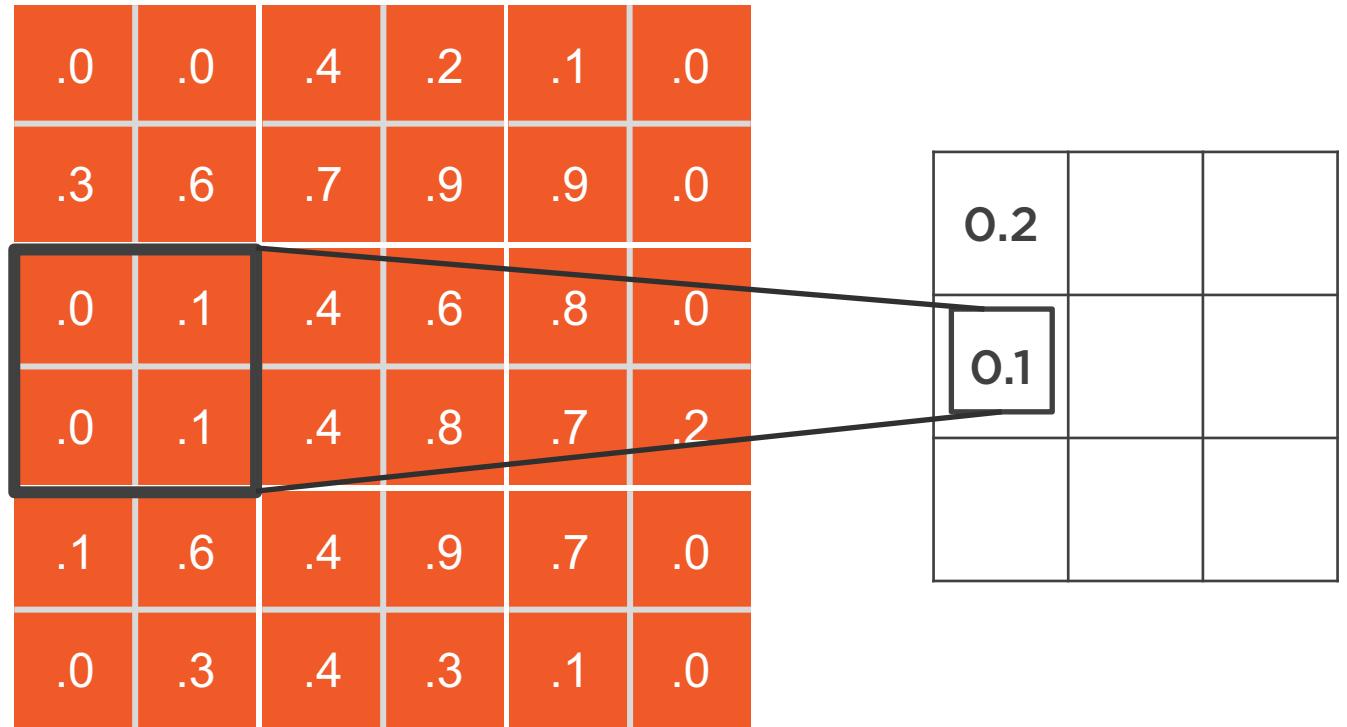
# Convolution Layer



# Convolution Layer + Pool Layer



# Convolution Layer + Pool Layer



# Convolution Layer + Pool Layer



.0	.0	.4	.2	.1	.0
.3	.6	.7	.9	.9	.0
.0	.1	.4	.6	.8	.0
.0	.1	.4	.8	.7	.2
.1	.6	.4	.9	.7	.0
.0	.3	.4	.3	.1	.0

<b>0.2</b>		
<b>0.1</b>		
<b>0.2</b>		



# Convolution Layer + Pool Layer

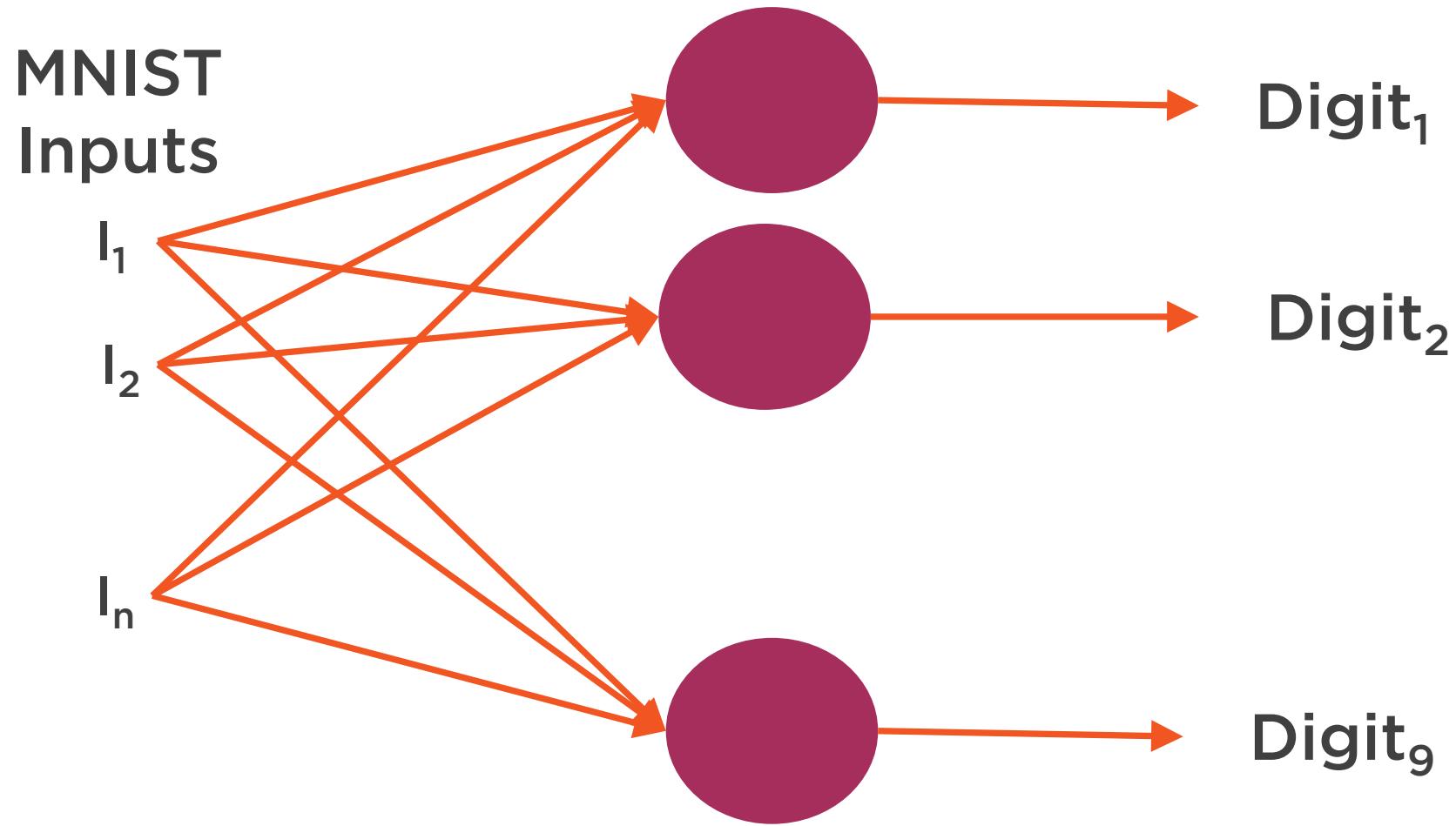


.0	.0	.4	.2	.1	.0
.3	.6	.7	.9	.9	.0
.0	.1	.4	.6	.8	.0
.0	.1	.4	.8	.7	.2
.1	.6	.4	.9	.7	.0
.0	.3	.4	.3	.1	.0

<b>0.2</b>	<b>0.6</b>	<b>0.3</b>
<b>0.1</b>	<b>0.5</b>	<b>0.4</b>
<b>0.2</b>	<b>0.5</b>	<b>0.3</b>



# Simple MNIST Neural Network



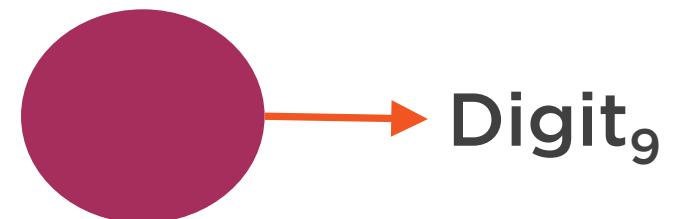
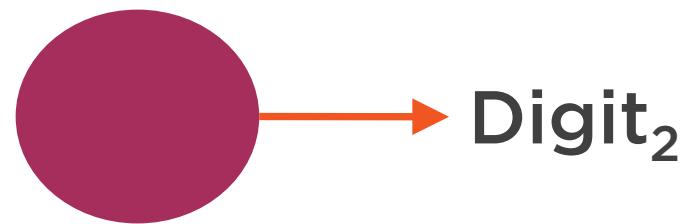
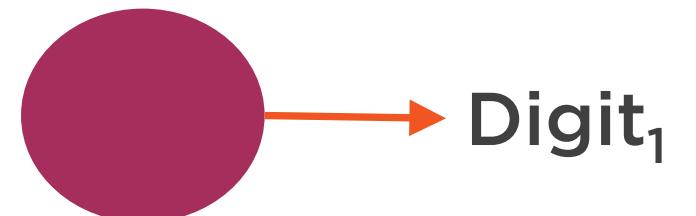
# Deep MNIST Neural Network

MNIST  
Inputs

$I_1$  →

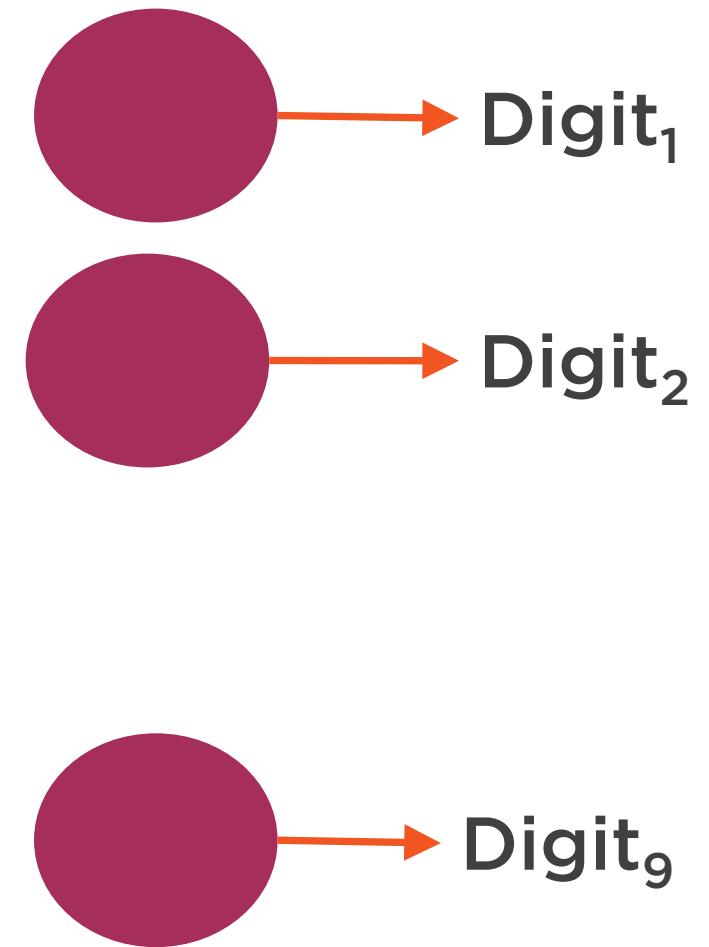
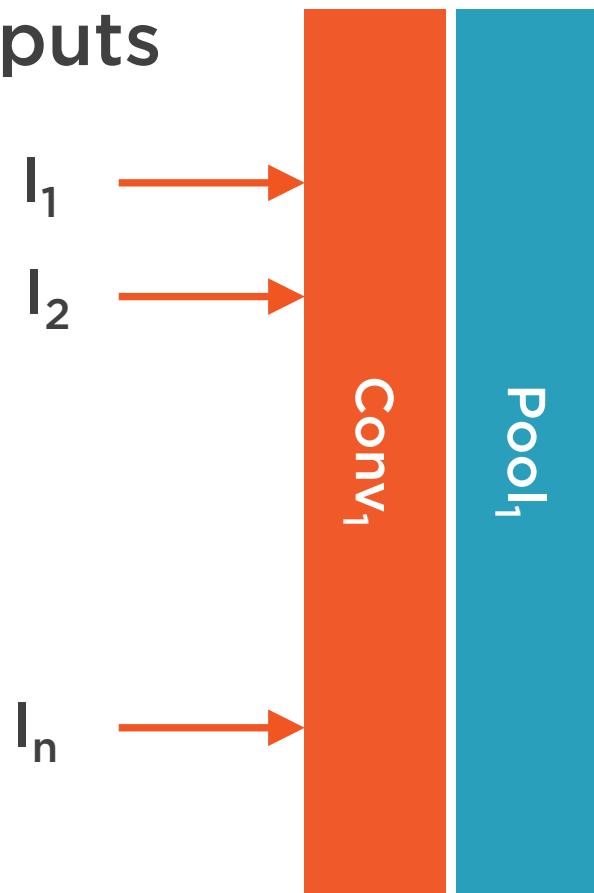
$I_2$  →

$I_n$  →



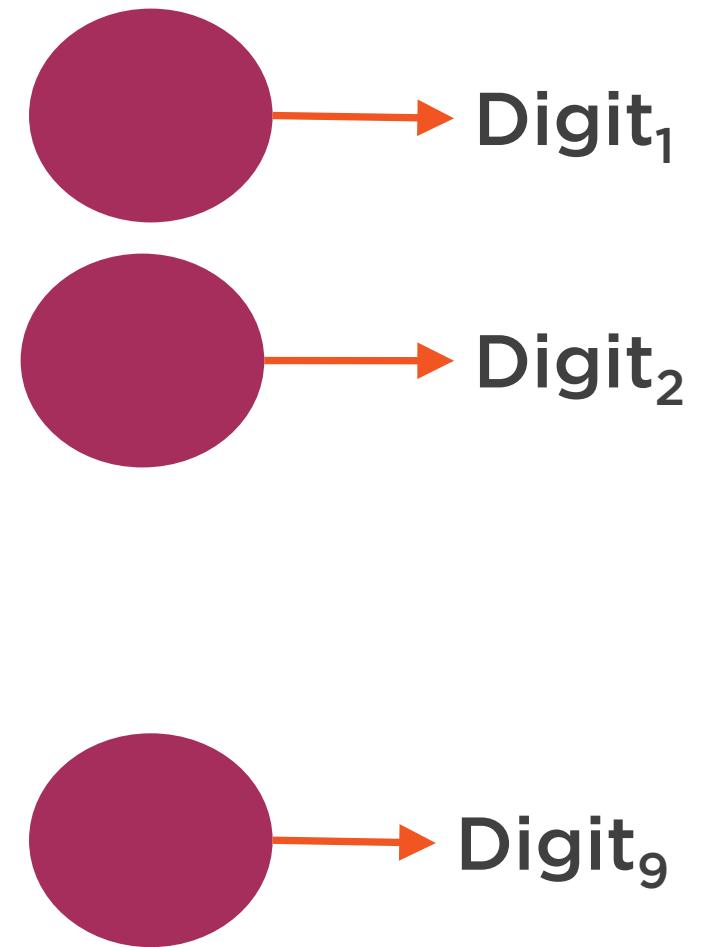
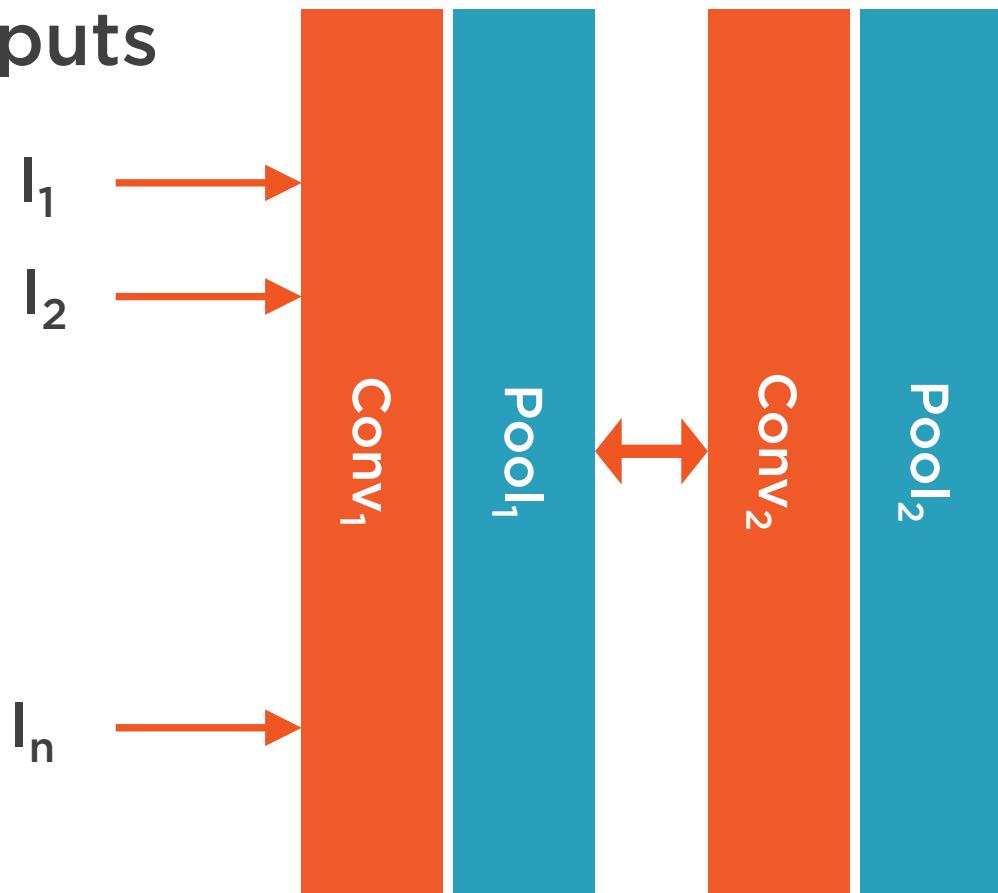
# Deep MNIST Neural Network

MNIST  
Inputs



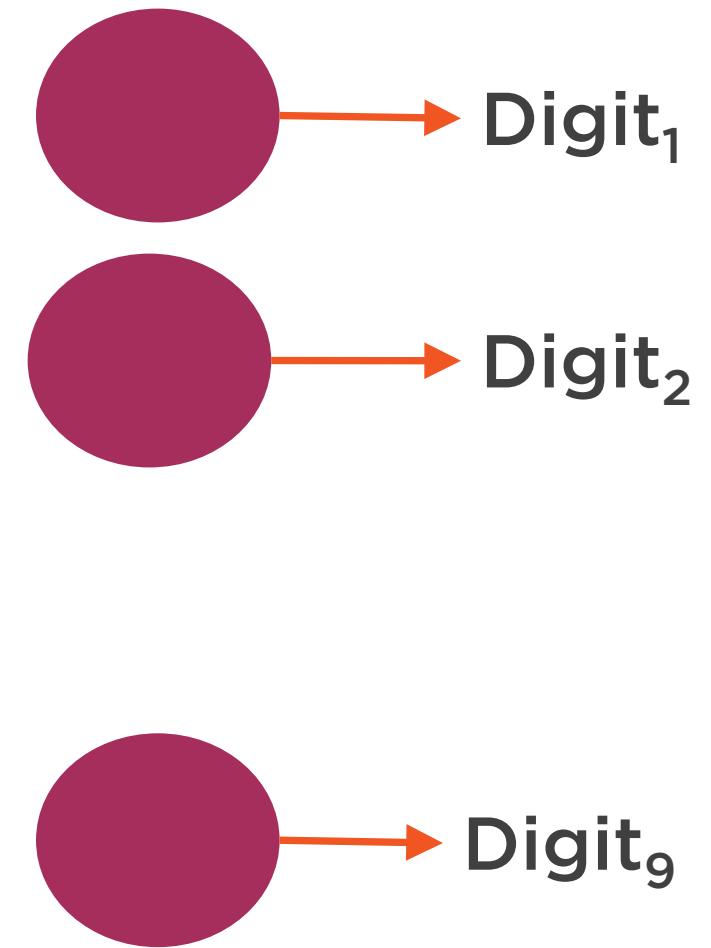
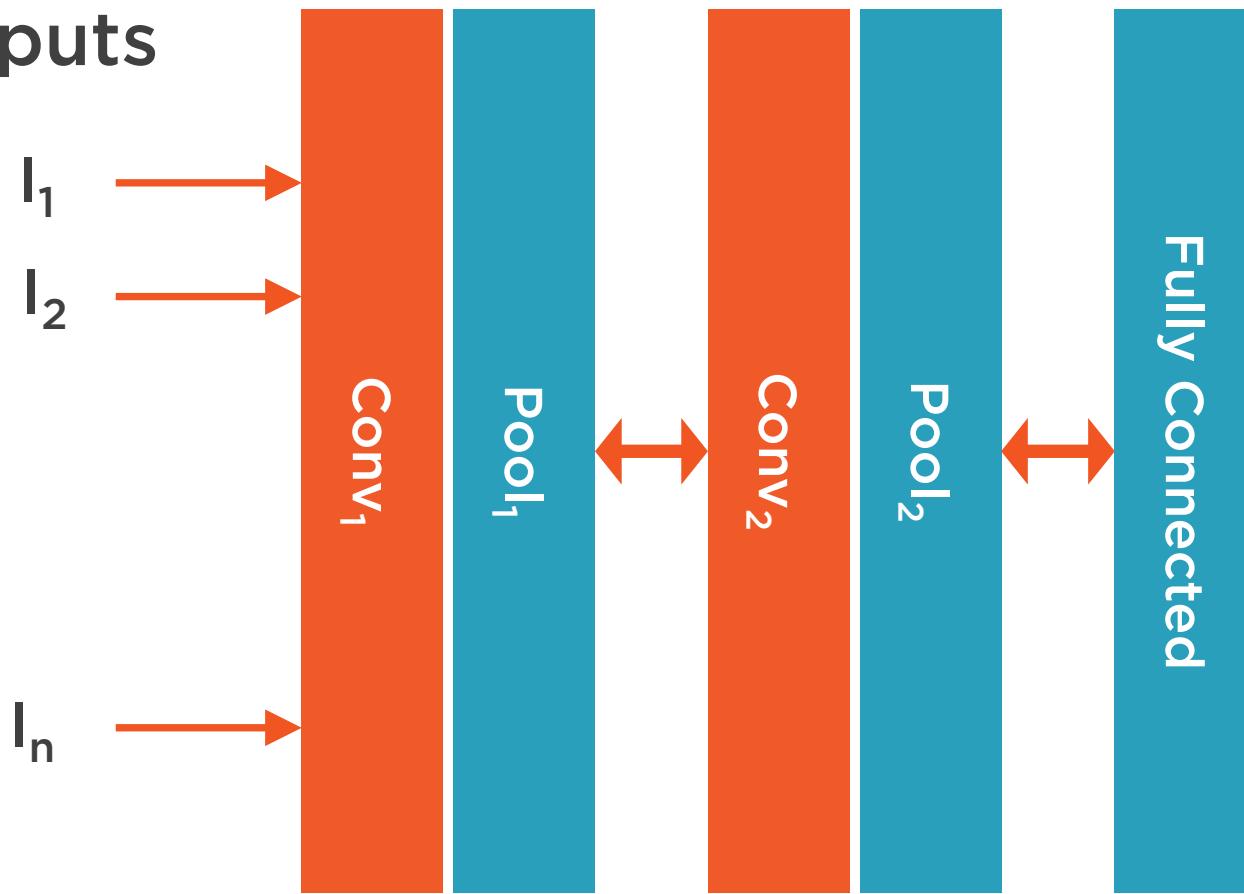
# Deep MNIST Neural Network

MNIST  
Inputs

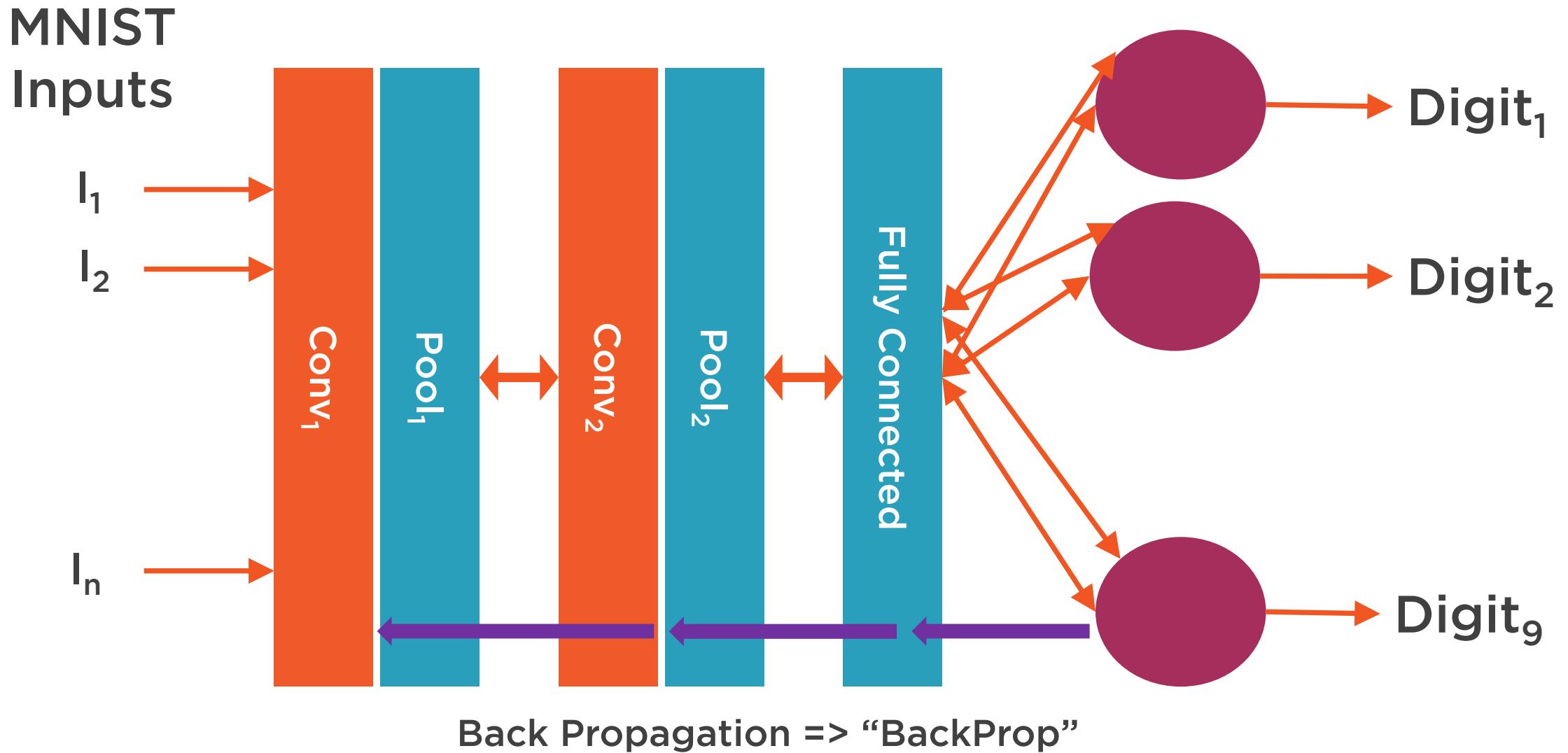


# Deep MNIST Neural Network

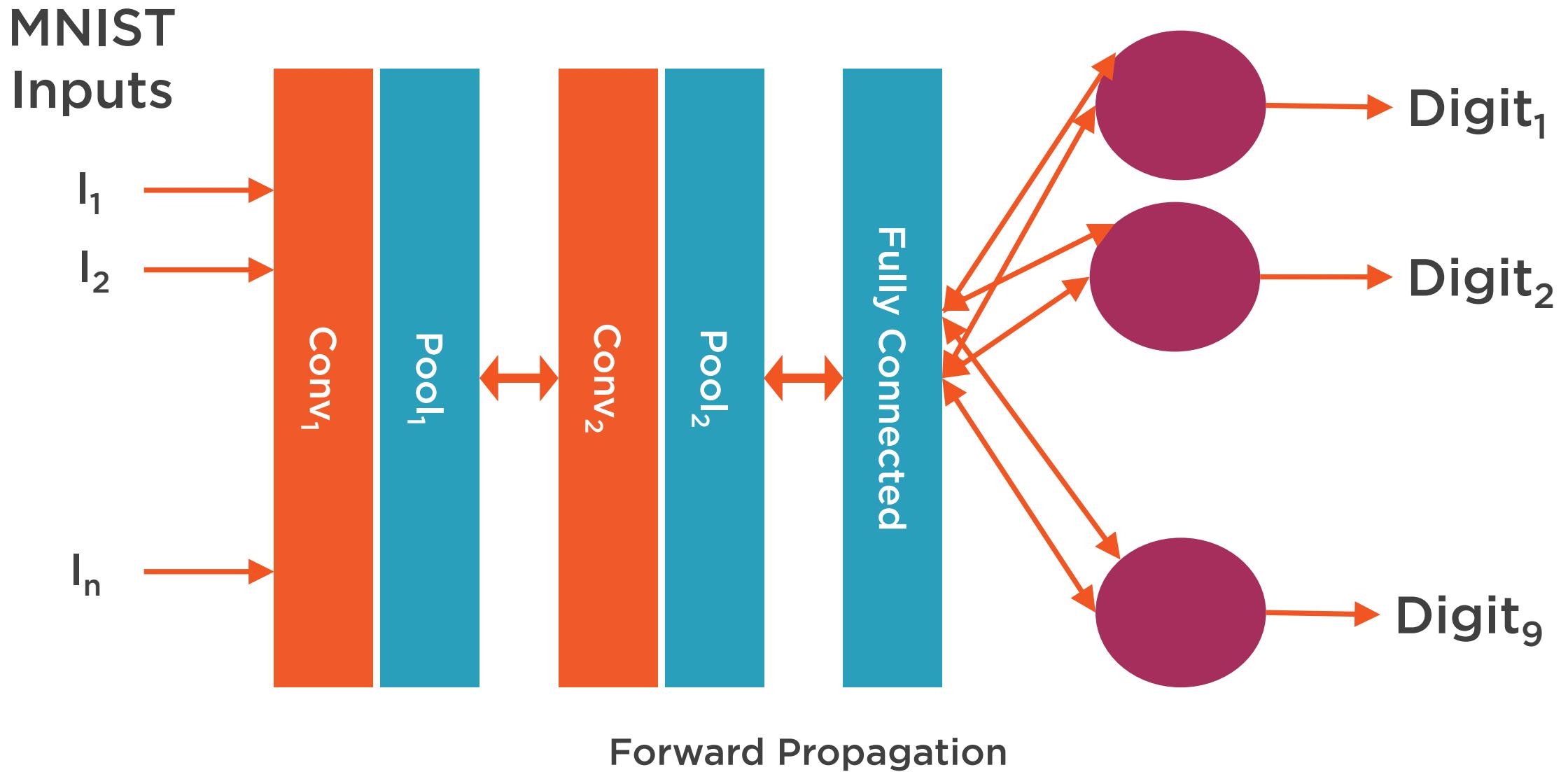
MNIST  
Inputs



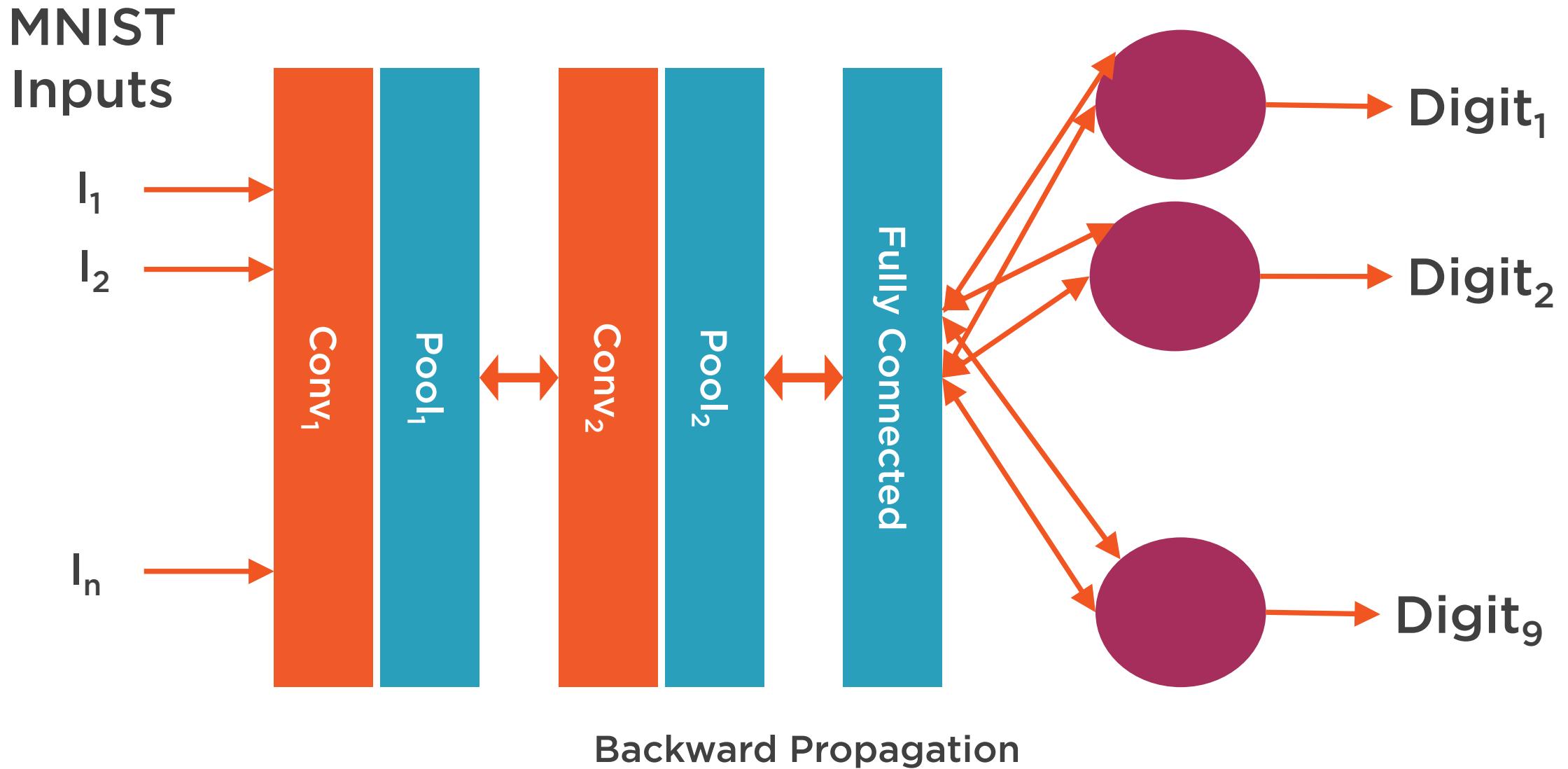
# Deep MNIST Neural Network



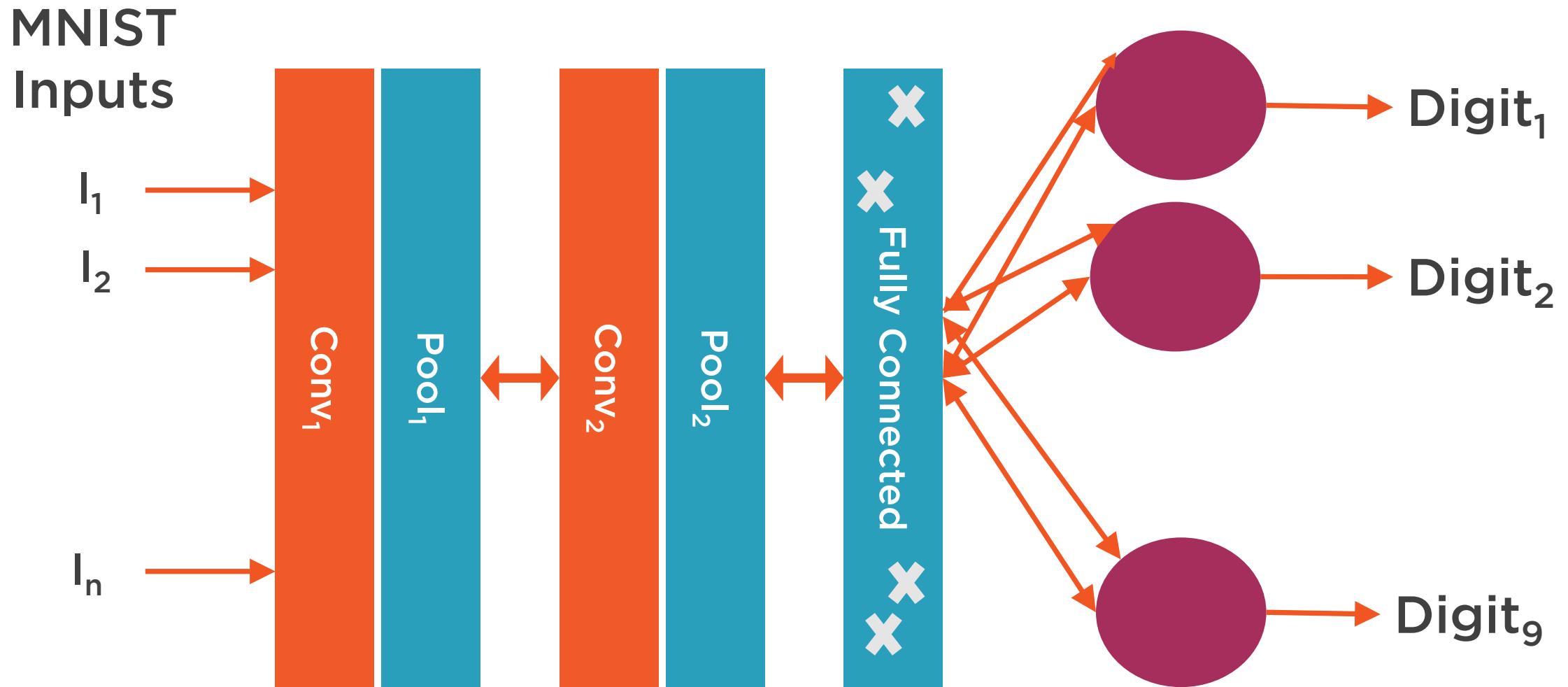
# Deep MNIST Neural Network

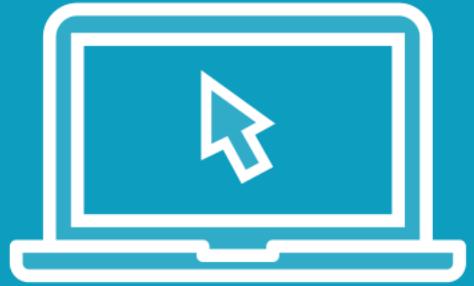


# Deep MNIST Neural Network



# Deep MNIST Neural Network

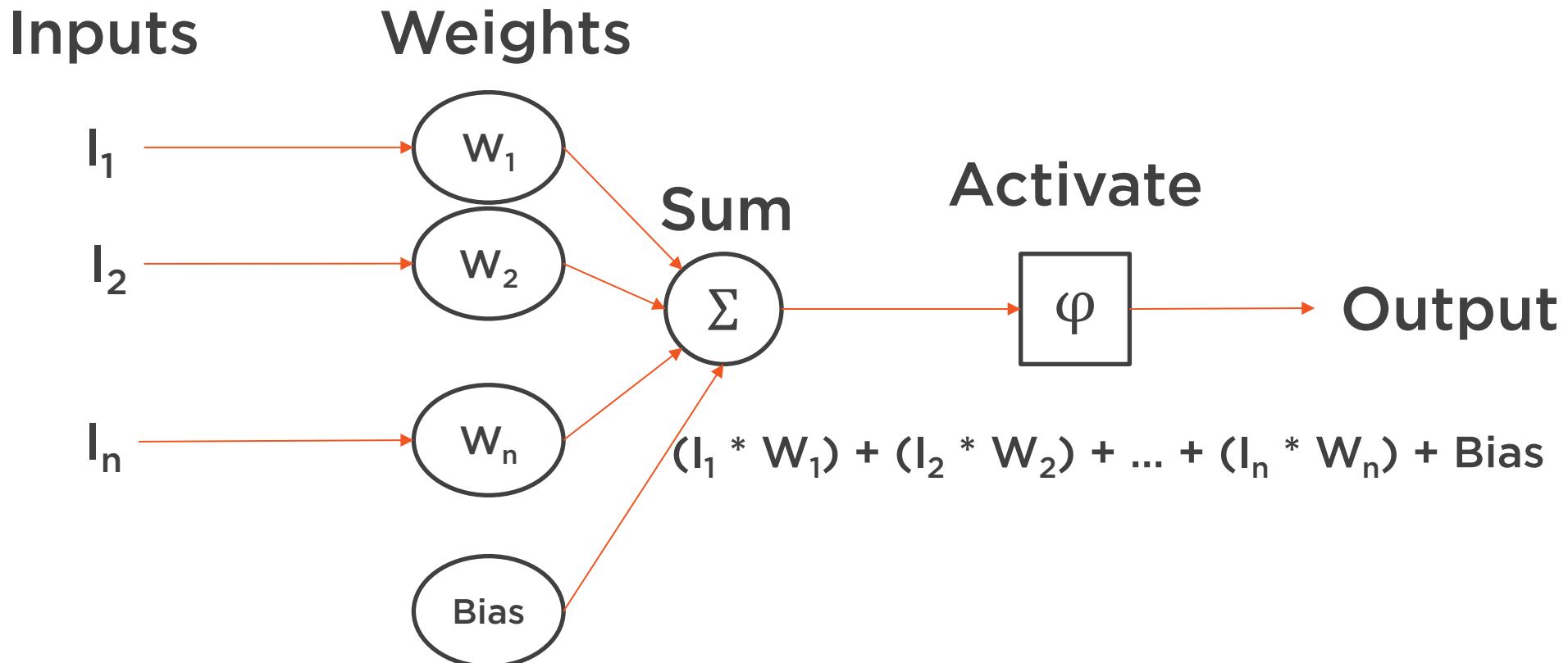




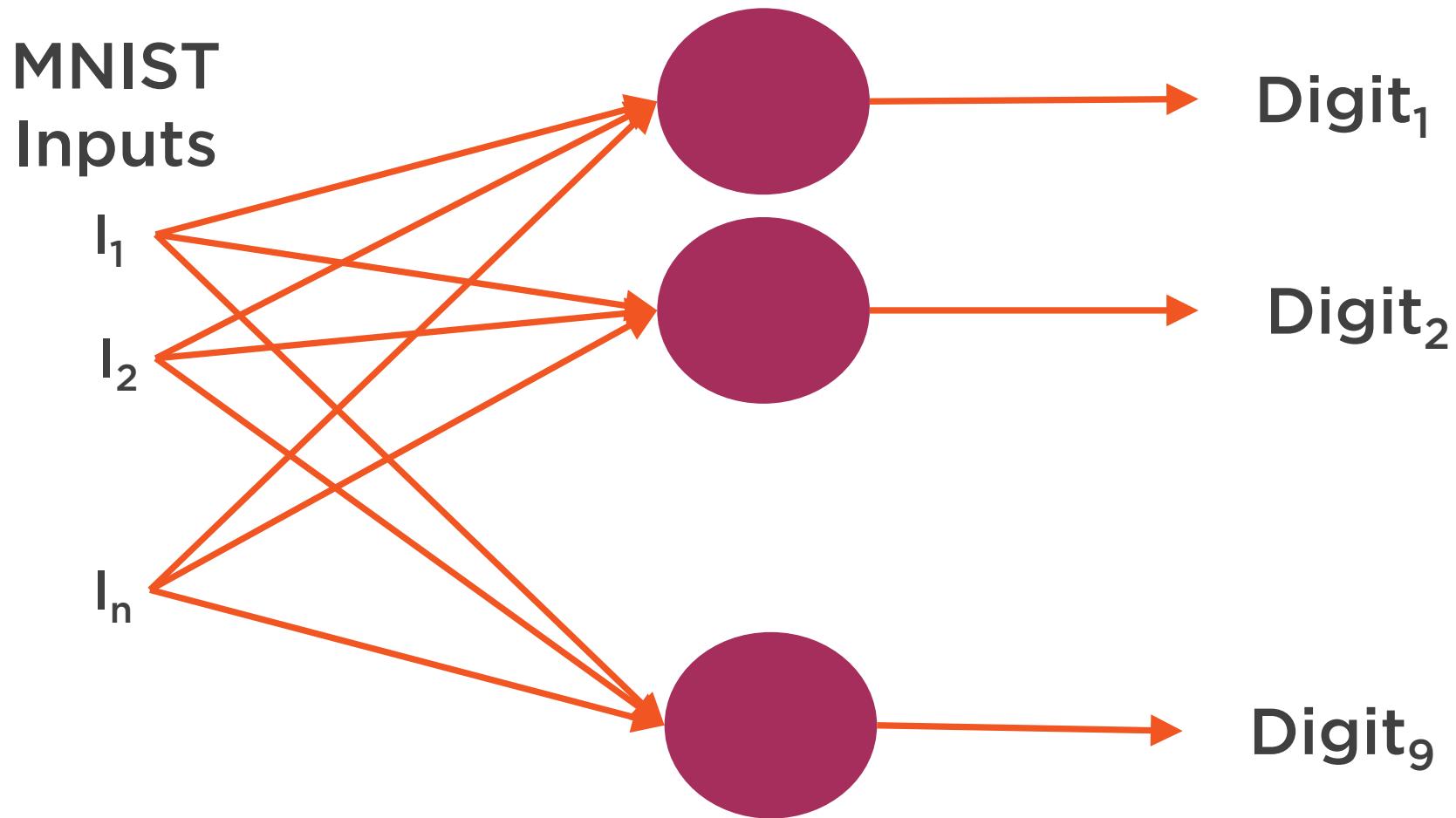
## Create Deep MINST



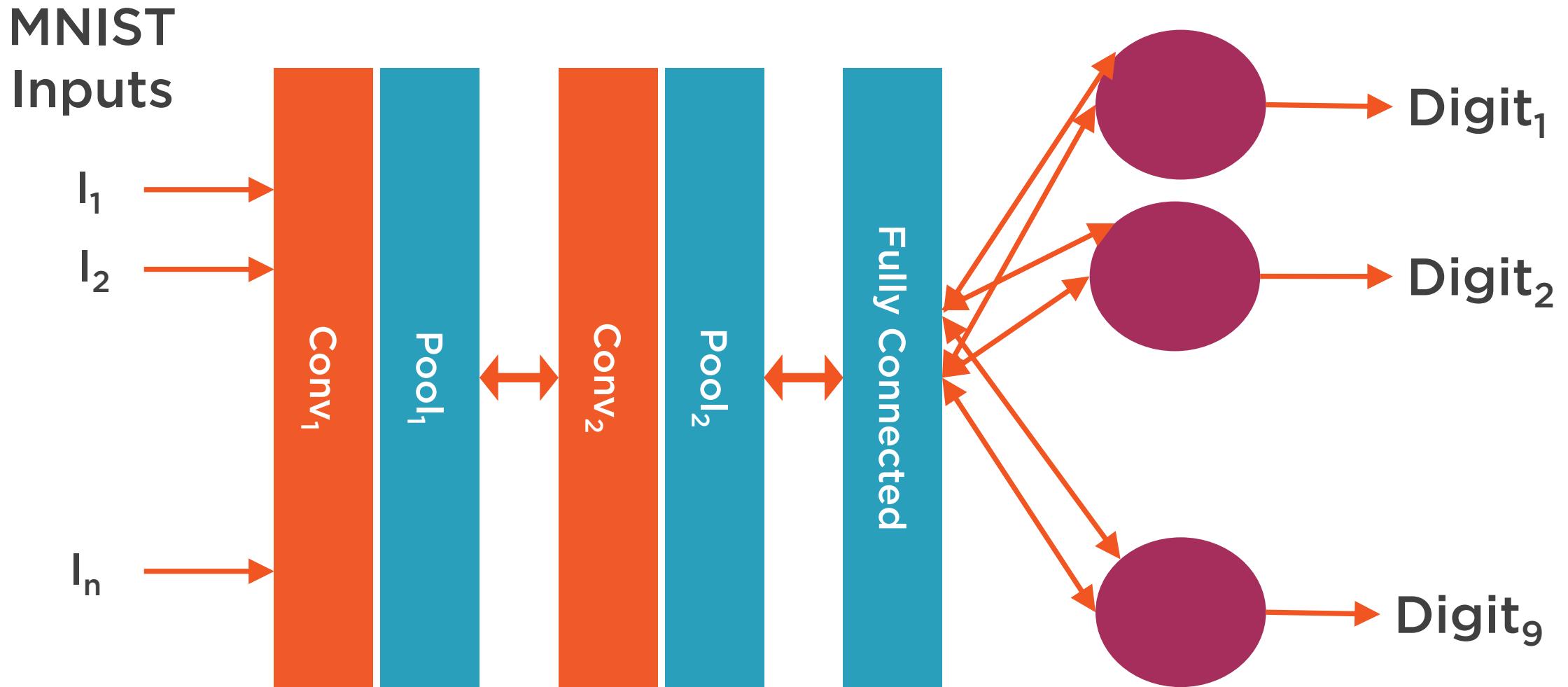
# Neuron Architecture



# MNIST Neural Network



# Deep MNIST Neural Network



# Neural Network with TensorFlow

Concept	Implementation
Prepared Data	MNIST data and reshape as required
Inference	Matmul(Weight, x) + bias for entire NN
Loss Measurement	Cross Entropy
Optimize to Minimize Loss	Gradient Decent Optimizer

