# 11-785: Deep Learning

HW #1: Backpropagation & Shape Learning

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# Single-Layer Neural Network

Implement a single-hidden-layer multi-layer Perceptron with different hidden nodes (less than 8) to classify the example shapes including a circle, a diamond and a random shape (RShape).

Report the best accuracy you can get with the constrained networks.

**Answer:** Below are two graphs showing the sum of squared errors and overall accuracy on the testing set with different numbers of neurons in a single hidden layer.

Fig 1: Sum of Squared Errors With Single Hidden Layer

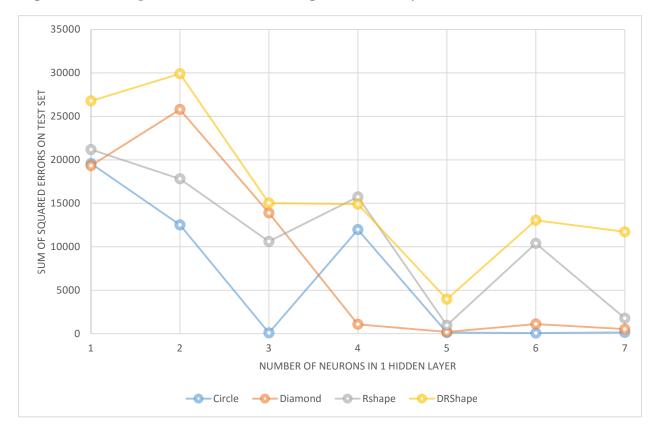
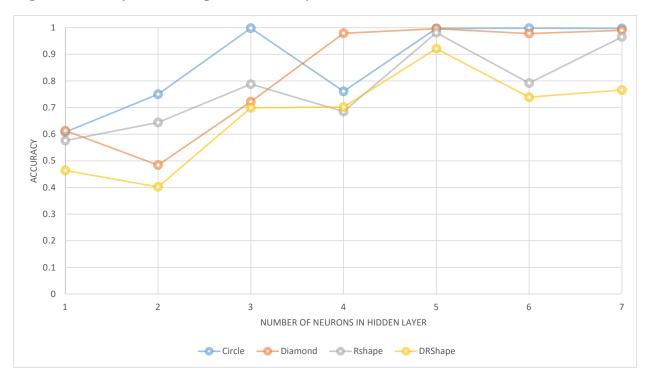
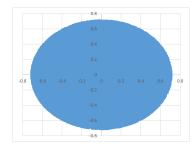


Fig 2: Accuracy With Single Hidden Layer

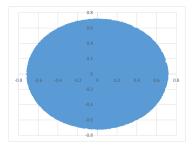


#### Circle Shape

Visualization of Truth Values for Testing Set

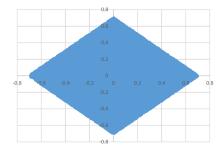


Visualization of Network Output with 6 Neurons

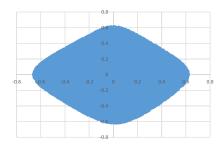


## Diamond Shape

 ${\it Visualization~of~Truth~Values~for~Testing~Set}$ 

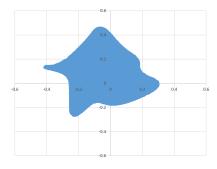


Visualization of Network Output with 5 Neurons

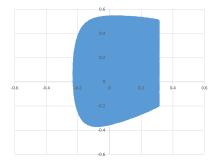


#### Random Shape

Visualization of Truth Values for Testing Set

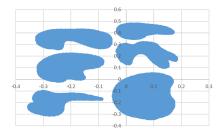


 $Visualization\ of\ Network\ Output\ with\ 5\ Neurons$ 

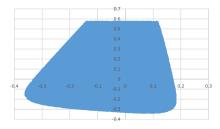


## Disconnected Random Shape

 $Visualization\ of\ Truth\ Values\ for\ Testing\ Set$ 



 $Visualization\ of\ Network\ Output\ with\ 5\ Neurons$ 

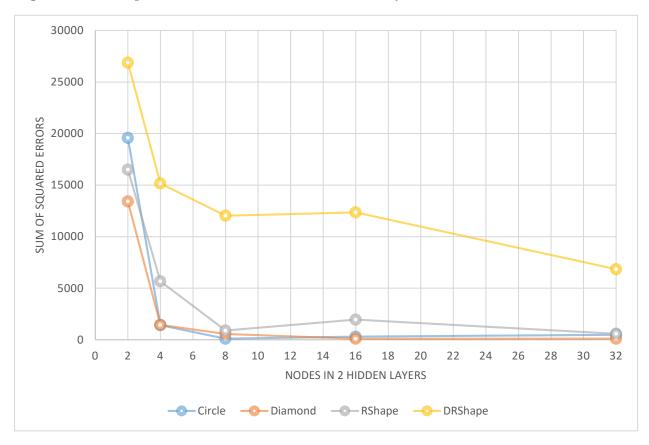


## Multi-Layer Perceptron

Implement a multi-layer Perceptron to classify the random shape (RShape) and disconnected random shape (DRShape). Explore the network structure (depth and width) to achieve best testing accuracy you can get. Report the testing accuracy.

**Answer:** Below are two graphs showing the sum of squared errors and overall accuracy on the testing set with different numbers of neurons in two hidden layers.

Fig 1: Sum of Squared Errors With Two Hidden Layers

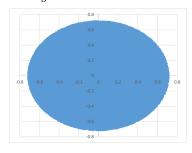


0.9 0.8 ACCURACY ON TEST DATA 8.0 0.0 9.0 4 9.0 3 0.2 0.1 NODES IN 2 HIDDEN LAYERS

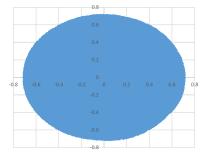
Fig 2: Accuracy With Two Hidden Layers

## Circle Shape

Visualization of Truth Values for Testing Set

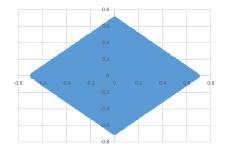


 $Visualization\ of\ Network\ Output\ with\ Two\ 8-Neuron\ Layers$ 

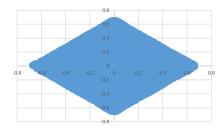


## Diamond Shape

 ${\it Visualization~of~Truth~Values~for~Testing~Set}$ 

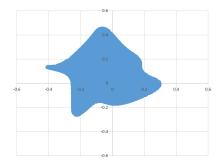


Visualization of Network Output with Two 16-Neuron Layers

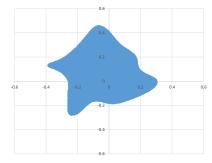


#### Random Shape

 $Visualization\ of\ Truth\ Values\ for\ Testing\ Set$ 

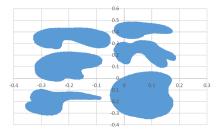


Visualization of Network Output with Two 16-Neuron Layers

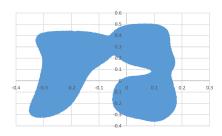


#### Disconnected Random Shape

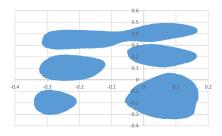
Visualization of Truth Values for Testing Set



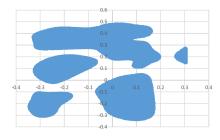
 $Visualization\ of\ Network\ Output\ with\ Two\ 32\text{-}Neuron\ Layers$ 



 $Visualization\ of\ Network\ Output\ with\ Two\ 64-Neuron\ Layers$ 



 ${\it Visualization~of~Network~Output~with~Two~128~and~64~Neuron~Layers}$ 



Visualization of Network Output with Two 256-Neuron Layers

