CS 615 - Deep Learning

Assignment 5 - MLPs Winter 2022 By: Willie Hood

03/07/22

1 Theory

1. (10pts) In class and the lecture notes, we provided the gradient of the tanh function without actually walking through the derivation. For this assignment's only theory question, show the work on how the partial derivative of the tanh function, $g(z) = \frac{e^z - e^{-z}}{e^z + e^{-z}}$, is $\frac{\partial g(z)}{\partial z} = (1 - g^2(z))$

$$g(z) = \frac{e^z - e^{-z}}{e^z + e^{-z}} = \frac{(e^z + e^{-z})(e^z + e^{-z}) - (e^z - e^{-z})(e^z - e^{-z})}{(e^z + e^{-z})^2} = 1 - \frac{(e^z - e^{-z})^2}{(e^z + e^{-z})^2} = 1 - \tanh^2(z) = (1 - g^2(z))$$

2 Multi-Class Logistic Regression

The architecture is:

 $\text{Input} \rightarrow \text{Fully-Connected} \rightarrow \text{Sigmoid Activation} \rightarrow \text{Log Loss Objective}$

For this architecture I used ADAM I had 100 epochs and a learning rate of 0.001. I had 10 outputs from my fully connected layer. I also used one hot encoding on my targets.

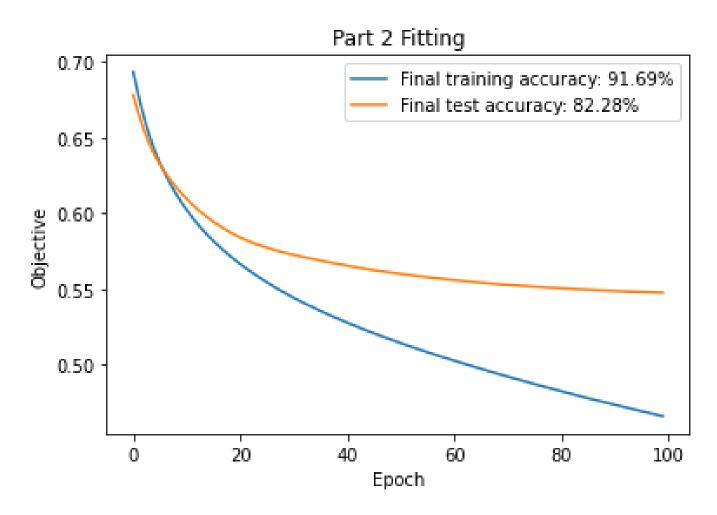


Figure 1: Architecture

3 Artificial Neural Networks

Architecture	Training Accuracy	Validation Accuracy	
First Architecture			
Input:	99.5%	90.29%	
FC(Output: 450):			
Relu:			
FC(Output: 10):			
Sigmoid			
Logloss			
Second Architecture			
Input:	100%	90.49%	
FC(Output: 450)			
Relu			
FC(Output: 10)			
Softmax			
Logloss			
Third Architecture			
Input	81.68%	74.17%	
FC(Output: 300)			
Linear			
FC(Output: 10)			
Sigmoid			
Cross Entropy			

Table 1: All Configurations used ADAM Architecture 1: 120 epochs and a learning rate of 0.001; Architecture 2: 100 epochs 0.001 learning rate; Architecture 3: 100 epochs 0.1 learning rate. (Note: it took hours for this to run my architecture is very slow)

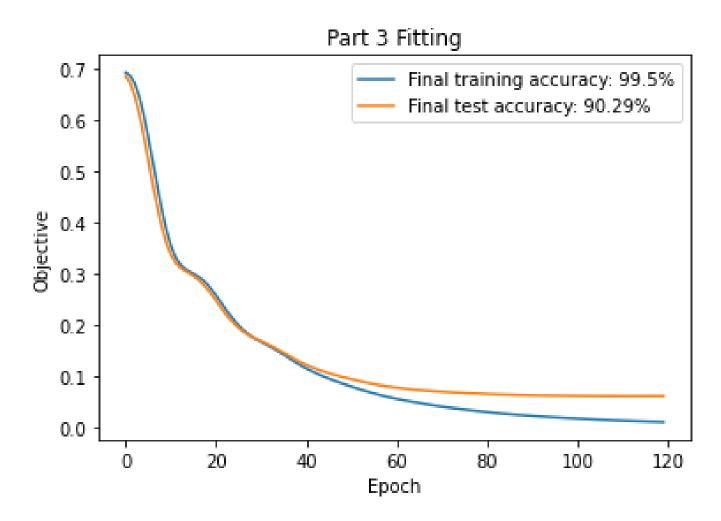


Figure 2: Architecture 1

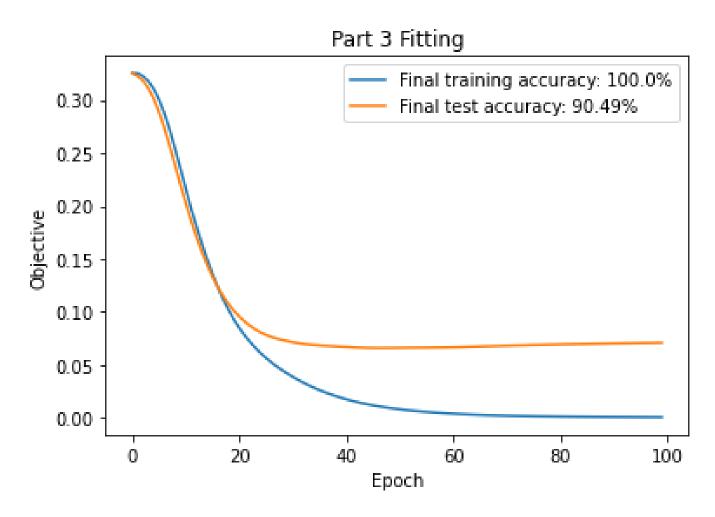


Figure 3: Architecture 2

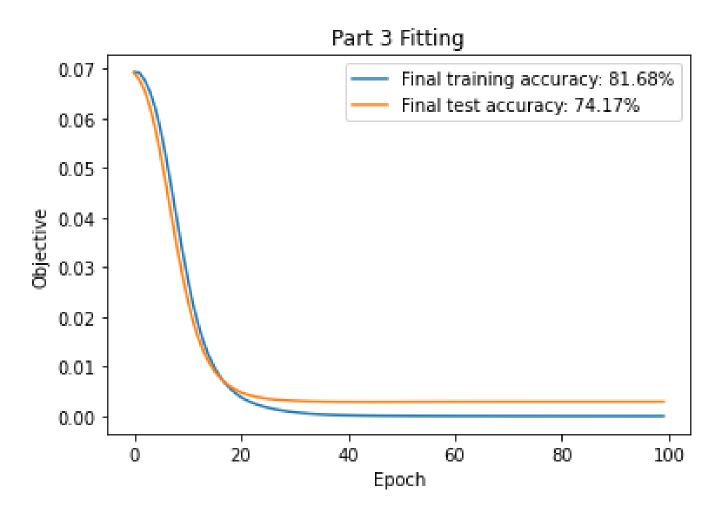


Figure 4: Architecture 3

4 Multi-Layer Perceptron

Architecture	Training Accuracy	Validation Accuracy	
First Architecture			
Input:	100%	83.88%	
FC(Output: 400):			
Relu:			
FC(Output: 250):			
Tan:			
FC(Output: 10):			
Softmax:			
Logloss			
Second Architecture			
Input:	98.60%	78.48%	
FC(Output: 400)			
Tan			
FC(Output: 250)			
Sigmoid			
FC(Output: 10)			
Softmax			
Cross Entropy			
Third Architecture			
Input	100%	81.28%	
FC(Output: 400)			
Tan			
FC(Output: 250)			
Relu			
FC(Output: 10)			
Sigmoid			
Logloss			

Table 2: All Configurations used ADAM Architecture 1: 2500 epochs and a learning rate of 0.001; Architecture 2: 1000 epochs 0.1 learning rate; Architecture 3: 150 epochs 0.1 learning rate. (Note: it took days for this to run my architecture is very slow)

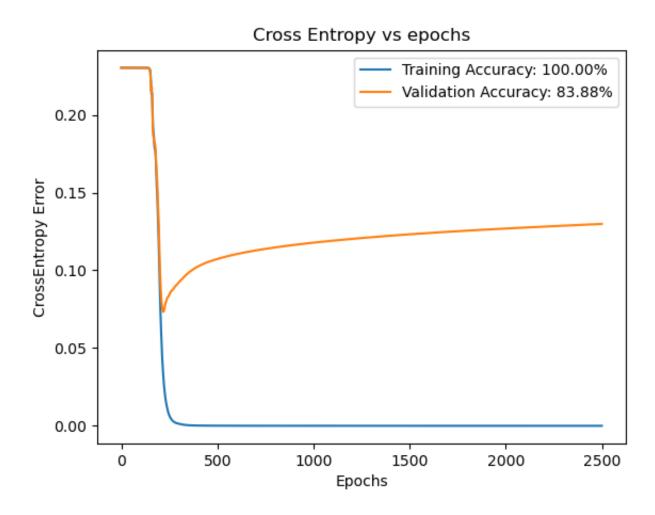


Figure 5: Architecture 1

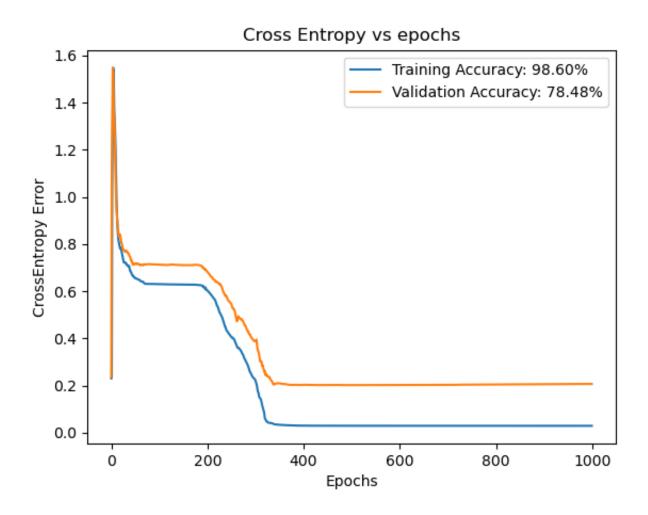


Figure 6: Architecture 2

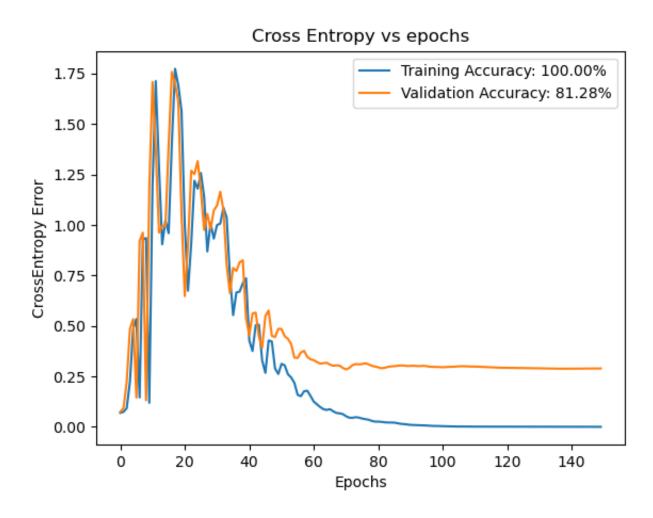


Figure 7: Architecture 3