Practice Lab Assignment 1

Neural Network Implementation from Scratch

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Neural Network Implementation from Scratch for Titanic Dataset:

Objective:

Implement a simple feedforward neural network from scratch in Python without using any in-built deep learning libraries. This implementation will focus on the basic components: forward pass, backward propagation (backpropagation), and training using gradient descent.

1. Problem Definition:

- Dataset: We'll use the Titanic dataset, which contains passenger information like age, gender, and ticket class to predict survival (binary classification: survived or not).
- Task: The task is a binary classification problem, where we predict whether a passenger survived or not based on their features.

2. Neural Network Architecture:

- Input Layer: 8 neurons (since we have 8 preprocessed features).
- Hidden Layer: 10 neurons (this is a hyperparameter).
- Output Layer: 2 neurons (since we have 2 output classes: survived or not).

3. Methodology:

Activation Functions:

a. Hidden layer: ReLU (Rectified Linear Unit).

b. Output layer: Softmax (to compute probabilities for binary classification).

Loss Function:

Cross-Entropy Loss (as it's a classification problem).

Optimization:

Gradient Descent (batch gradient descent).

Data Preprocessing:

1. Loading Titanic dataset:

The dataset is loaded using pandas.

- 2. Handling missing values:
 - o For numerical features like Age, missing values are filled with the median.
 - For categorical features like Embarked, missing values are filled with the mode.
- 3. One-hot encoding:

Categorical features (Sex and Embarked) are one-hot encoded.

4. Feature standardization:

Numerical features are standardized using StandardScaler for better performance.

5. Feature and target selection:

Input features include Pclass, Age, SibSp, Parch, Fare, and one-hot-encoded Sex and Embarked.

The target is Survived.

Neural Network Initialization:

- The input layer has 8 neurons (for the 8 features).
- The hidden layer has 50 neurons, and the output layer has 2 neurons (binary classification: survived or not).
- We initialize weights (W1, W2) and biases (b1, b2) with small random values.

Activation Functions:

- a. ReLU for the hidden layer to introduce non-linearity.
- b. Softmax for the output layer to compute probabilities.

Loss Function:

We use Cross-Entropy Loss, suitable for binary classification tasks.

Gradient Descent (Backpropagation):

Gradients of the loss with respect to weights and biases are computed, and parameters are updated using gradient descent.

Training and Evaluation:

- The model is trained for 1000 epochs (you can adjust this).
- The training loss is printed every 100 epochs.
- After training, the model is evaluated on both the training and test sets by computing accuracy.

Code File:

https://colab.research.google.com/drive/1V4o20QJMnNz9X9WKomCW6kdw01J9yzJM?usp=sharing

Dataset Link: https://www.kaggle.com/datasets/yasserh/titanic-dataset

Screenshot of Model Performance Metrics:

```
Epoch 0/1000, Loss: 0.6934
Epoch 100/1000, Loss: 0.5610
Epoch 200/1000, Loss: 0.4396
Epoch 300/1000, Loss: 0.4266
Epoch 400/1000, Loss: 0.4472
Epoch 500/1000, Loss: 0.4097
Epoch 600/1000, Loss: 0.4097
Epoch 700/1000, Loss: 0.3990
Epoch 800/1000, Loss: 0.3912
Train Accuracy: 83.99%
Test Accuracy: 81.56%
```

GitHub Link: https://github.com/ayushrewatkar/Deep Learning Projects.git

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