ECGR 4105 HW6 Problem 1

November 28, 2024

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[24]: import pandas as pd
      import numpy as np
      import tensorflow as tf
      import time
      from sklearn.model_selection import train_test_split
      from sklearn.preprocessing import StandardScaler, LabelEncoder
      from tensorflow.keras import Sequential
      from tensorflow.keras.layers import Dense
[17]: file_url = 'https://raw.githubusercontent.com/lnguye782/ECGR-4105-Intro-to-ML/
       ⇔refs/heads/main/HW6/Housing.csv'
      data = pd.read_csv(file_url)
      data.head()
[17]:
            price
                   area
                         bedrooms
                                   bathrooms
                                               stories mainroad guestroom basement
      0 13300000
                  7420
                                            2
                                                     3
                                                            yes
                                                                       no
                                                                                no
      1 12250000 8960
                                4
                                            4
                                                     4
                                                            yes
                                                                       no
                                                                                no
      2 12250000
                                3
                                            2
                                                     2
                   9960
                                                            yes
                                                                                yes
                                                                       no
                                4
                                                     2
      3 12215000
                  7500
                                            2
                                                            yes
                                                                       no
                                                                                yes
      4 11410000 7420
                                4
                                            1
                                                     2
                                                            yes
                                                                                yes
                                                                      yes
        hotwaterheating airconditioning parking prefarea furnishingstatus
      0
                                    yes
                                                2
                                                       yes
                                                                  furnished
      1
                                                3
                                                                  furnished
                     no
                                    yes
                                                       no
      2
                                                2
                                                             semi-furnished
                                                       yes
                     nο
                                     no
      3
                                                3
                                                                  furnished
                     nο
                                    yes
                                                       yes
                                                2
                                                                  furnished
                                    yes
                                                        no
                     nο
[19]: # Encode categorical variables
      categorical_columns = ['mainroad', 'guestroom', 'basement', 'hotwaterheating',
                              'airconditioning', 'prefarea', 'furnishingstatus']
      data_encoded = data.copy()
      for col in categorical_columns:
          le = LabelEncoder()
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data_encoded[col] = le.fit_transform(data[col])
      # Separate features and target variable
      X = data_encoded.drop(columns=['price'])
      y = data_encoded['price']
      # Scale features
      scaler = StandardScaler()
      X_scaled = scaler.fit_transform(X)
[21]: | # Split data into training and validation sets (80% train, 20% validation)
      X_train, X_val, y_train, y_val = train_test_split(X_scaled, y, test_size=0.2,_u
       →random_state=42)
      y_train = np.array(y_train)
      y_val = np.array(y_val)
[26]: # Build the neural network
      model = Sequential([
          Dense(8, input_dim=12, activation='relu'), # Hidden layer with 8 nodes
          Dense(1, activation='linear')
                                                     # Output layer for regression
      1)
      # Compile the model
      model.compile(optimizer='adam', loss='mse', metrics=['mae'])
      # Train the model
      start_time = time.time()
      history = model.fit(X_train, y_train, validation_data=(X_val, y_val),_u
       ⇔epochs=100, batch_size=32, verbose=0)
      training_time = time.time() - start_time
      # Evaluate the model
      train_loss, train_mae = model.evaluate(X_train, y_train, verbose=0)
      val_loss, val_mae = model.evaluate(X_val, y_val, verbose=0)
      # Report results
      training_time, train_loss, train_mae, val_loss, val_mae
[26]: (9.537226676940918, 25234312790016.0, 4706488.5, 30129436753920.0, 5007497.5)
[27]: # Build the extended neural network with two additional hidden layers
      extended_model = Sequential([
          Dense(8, input_dim=12, activation='relu'), # First hidden layer
          Dense(8, activation='relu'),
                                                    # Second hidden layer
          Dense(8, activation='relu'),
                                                    # Third hidden layer
          Dense(1, activation='linear')
                                                    # Output layer for regression
```

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])
     # Compile the extended model
     extended model.compile(optimizer='adam', loss='mse', metrics=['mae'])
     # Train the extended model
     start time = time.time()
     extended_history = extended_model.fit(X_train, y_train, validation_data=(X_val,_
       extended_training_time = time.time() - start_time
     # Evaluate the extended model
     extended_train_loss, extended_train_mae = extended_model.evaluate(X_train,_
       →y_train, verbose=0)
     extended_val_loss, extended_val_mae = extended_model.evaluate(X_val, y_val,_
       →verbose=0)
[29]: # Report results
     results = {
         "Extended (3 Hidden Layers)": {
             "Training Time (s)": extended_training_time,
             "Training Loss": extended_train_loss,
             "Training MAE": extended_train_mae,
             "Validation Loss": extended_val_loss,
             "Validation MAE": extended_val_mae,
         }
     }
     results
```