

```
In [44]: import pandas as pd
import numpy as np
import torch
import torch.nn as nn
import torch.optim as optim
from torch.utils.data import DataLoader, TensorDataset
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from sklearn.metrics import mean_squared_error
import torch
import torch.nn as nn
import torch.optim as optim
from torch.utils.data import DataLoader, TensorDataset
from sklearn.metrics import accuracy_score
import matplotlib.pyplot as plt
import seaborn as sns
```

```
In [24]: import pandas as pd
df=pd.read_csv("apneaset.csv")
df
```

```
Out[24]:
```

|     | Patinet_ID | EEG_Signal_Amplitude | EEG_Delta_band | EEG_Theta_band | EEG_Alpha_band | EEG_Beta_band | Hair_Phenotype | heart        |
|-----|------------|----------------------|----------------|----------------|----------------|---------------|----------------|--------------|
| 0   | 180203     | 56                   | 2.4786         | 5.5748         | 11.7319        | 23.9909       | Curly_hair     | Medium_Pulse |
| 1   | 152268     | 97                   | 3.2531         | 6.4658         | 13.1411        | 28.3962       | Curly_hair     | High_Pulse   |
| 2   | 157399     | 83                   | 3.6325         | 6.0053         | 13.6766        | 26.0487       | Wavy_hair      | High_Pulse   |
| 3   | 131849     | 58                   | 2.9477         | 5.5462         | 10.3739        | 22.0865       | Straight_hair  | Medium_Pulse |
| 4   | 164593     | 22                   | 1.9366         | 4.3574         | 8.9079         | 18.7077       | Curly_hair     | Low_Pulse    |
| ... | ...        | ...                  | ...            | ...            | ...            | ...           | ...            | ...          |
| 670 | 134065     | 95                   | 3.0788         | 6.7874         | 14.5136        | 26.9154       | No_hair        | High_Pulse   |
| 671 | 182597     | 23                   | 1.2767         | 4.9695         | 8.8617         | 18.6980       | No_hair        | Low_Pulse    |
| 672 | 156972     | 36                   | 2.3799         | 5.3240         | 11.5026        | 23.6280       | Wavy_hair      | Medium_Pulse |
| 673 | 172428     | 59                   | 2.6147         | 5.3841         | 11.1521        | 20.8031       | Straight_hair  | Medium_Pulse |
| 674 | 158058     | 100                  | 3.4924         | 6.7524         | 12.9776        | 26.8441       | No_hair        | High_Pulse   |

675 rows × 14 columns

```
In [25]: df["apnea_Severity"] = df["apnea_Severity"].map(
    {'High_Severity': 2, 'Medium_Severity': 1, 'Low_Severity': 0})
df["heart_rate"] = df["heart_rate"].map(
    {'High_PulseRate': 2, 'Medium_PulseRate': 1, 'Low_PulseRate': 0})
df["skin_conductance"] = df["skin_conductance"].map(
    {'High_Conductance': 2, 'Normal_Conductance': 1, 'Low_Conductance': 0})
df["skin_temperature"] = df["skin_temperature"].map(
    {'Low_Temperature': 2, 'Normal_Temperature': 1, 'Fever': 0})
df["cortisol_level"] = df["cortisol_level"].map(
    {'Above_AverageCL': 2, 'AverageCL': 1, 'Below_AverageCL': 0})
df["Systolic_BP"] = df["Systolic_BP"].map(
    {'Range1_LowSystolic': 2, 'Range2_LowSystolic': 1, 'Range3_LowSystolic': 0})
df["Diastolic_BP"] = df["Diastolic_BP"].map(
    {'VerylowDiSystolic': 2, 'NormalDiSystolic': 1, 'LowDiSystolic': 0})
```

In [26]: df

Out[26]:

|     | Patinet_ID | EEG_Signal_Amplitude | EEG_Delta_band | EEG_Theta_band | EEG_Alpha_band | EEG_Beta_band | Hair_Phenotype | heart_rate | sl  |
|-----|------------|----------------------|----------------|----------------|----------------|---------------|----------------|------------|-----|
| 0   | 180203     | 56                   | 2.4786         | 5.5748         | 11.7319        | 23.9909       | Curly_hair     | 1          |     |
| 1   | 152268     | 97                   | 3.2531         | 6.4658         | 13.1411        | 28.3962       | Curly_hair     | 2          |     |
| 2   | 157399     | 83                   | 3.6325         | 6.0053         | 13.6766        | 26.0487       | Wavy_hair      | 2          |     |
| 3   | 131849     | 58                   | 2.9477         | 5.5462         | 10.3739        | 22.0865       | Straight_hair  | 1          |     |
| 4   | 164593     | 22                   | 1.9366         | 4.3574         | 8.9079         | 18.7077       | Curly_hair     | 0          |     |
| ... | ...        | ...                  | ...            | ...            | ...            | ...           | ...            | ...        | ... |
| 670 | 134065     | 95                   | 3.0788         | 6.7874         | 14.5136        | 26.9154       | No_hair        | 2          |     |
| 671 | 182597     | 23                   | 1.2767         | 4.9695         | 8.8617         | 18.6980       | No_hair        | 0          |     |
| 672 | 156972     | 36                   | 2.3799         | 5.3240         | 11.5026        | 23.6280       | Wavy_hair      | 1          |     |
| 673 | 172428     | 59                   | 2.6147         | 5.3841         | 11.1521        | 20.8031       | Straight_hair  | 1          |     |
| 674 | 158058     | 100                  | 3.4924         | 6.7524         | 12.9776        | 26.8441       | No_hair        | 2          |     |

675 rows × 14 columns

In [27]: *# Select only the specified columns in the DataFrame*  
df = df[["EEG\_Signal\_Amplitude", "EEG\_Delta\_band", "EEG\_Theta\_band", "EEG\_Alpha\_band", "EEG\_Beta\_band", "skin\_conductance", "skin\_temperature", "cortisol\_level", "Systolic\_BP", "Diastolic\_BP", "apnea"]]

In [28]: df

Out[28]:

|     | EEG_Signal_Amplitude | EEG_Delta_band | EEG_Theta_band | EEG_Alpha_band | EEG_Beta_band | heart_rate | skin_conductance | skin_tempe |
|-----|----------------------|----------------|----------------|----------------|---------------|------------|------------------|------------|
| 0   | 56                   | 2.4786         | 5.5748         | 11.7319        | 23.9909       | 1          | 1                |            |
| 1   | 97                   | 3.2531         | 6.4658         | 13.1411        | 28.3962       | 2          | 0                |            |
| 2   | 83                   | 3.6325         | 6.0053         | 13.6766        | 26.0487       | 2          | 0                |            |
| 3   | 58                   | 2.9477         | 5.5462         | 10.3739        | 22.0865       | 1          | 1                |            |
| 4   | 22                   | 1.9366         | 4.3574         | 8.9079         | 18.7077       | 0          | 2                |            |
| ... | ...                  | ...            | ...            | ...            | ...           | ...        | ...              | ...        |
| 670 | 95                   | 3.0788         | 6.7874         | 14.5136        | 26.9154       | 2          | 0                |            |
| 671 | 23                   | 1.2767         | 4.9695         | 8.8617         | 18.6980       | 0          | 2                |            |
| 672 | 36                   | 2.3799         | 5.3240         | 11.5026        | 23.6280       | 1          | 1                |            |
| 673 | 59                   | 2.6147         | 5.3841         | 11.1521        | 20.8031       | 1          | 1                |            |
| 674 | 100                  | 3.4924         | 6.7524         | 12.9776        | 26.8441       | 2          | 0                |            |

675 rows × 12 columns

In [29]: *# Imported Library's*  
import torch  
import torch.nn as nn  
import torch.optim as optim  
from torch.utils.data import DataLoader, TensorDataset  
import pandas as pd  
from sklearn.model\_selection import train\_test\_split  
from sklearn.preprocessing import StandardScaler  
from sklearn.metrics import accuracy\_score  
import warnings  
warnings.filterwarnings("ignore")

```
In [30]: # Handle missing values if any  
df.dropna(inplace=True)  
df
```

```
Out[30]:
```

|     | EEG_Signal_Amplitude | EEG_Delta_band | EEG_Theta_band | EEG_Alpha_band | EEG_Beta_band | heart_rate | skin_conductance | skin_tempe |
|-----|----------------------|----------------|----------------|----------------|---------------|------------|------------------|------------|
| 0   | 56                   | 2.4786         | 5.5748         | 11.7319        | 23.9909       | 1          | 1                |            |
| 1   | 97                   | 3.2531         | 6.4658         | 13.1411        | 28.3962       | 2          | 0                |            |
| 2   | 83                   | 3.6325         | 6.0053         | 13.6766        | 26.0487       | 2          | 0                |            |
| 3   | 58                   | 2.9477         | 5.5462         | 10.3739        | 22.0865       | 1          | 1                |            |
| 4   | 22                   | 1.9366         | 4.3574         | 8.9079         | 18.7077       | 0          | 2                |            |
| ... | ...                  | ...            | ...            | ...            | ...           | ...        | ...              |            |
| 670 | 95                   | 3.0788         | 6.7874         | 14.5136        | 26.9154       | 2          | 0                |            |
| 671 | 23                   | 1.2767         | 4.9695         | 8.8617         | 18.6980       | 0          | 2                |            |
| 672 | 36                   | 2.3799         | 5.3240         | 11.5026        | 23.6280       | 1          | 1                |            |
| 673 | 59                   | 2.6147         | 5.3841         | 11.1521        | 20.8031       | 1          | 1                |            |
| 674 | 100                  | 3.4924         | 6.7524         | 12.9776        | 26.8441       | 2          | 0                |            |

675 rows × 12 columns

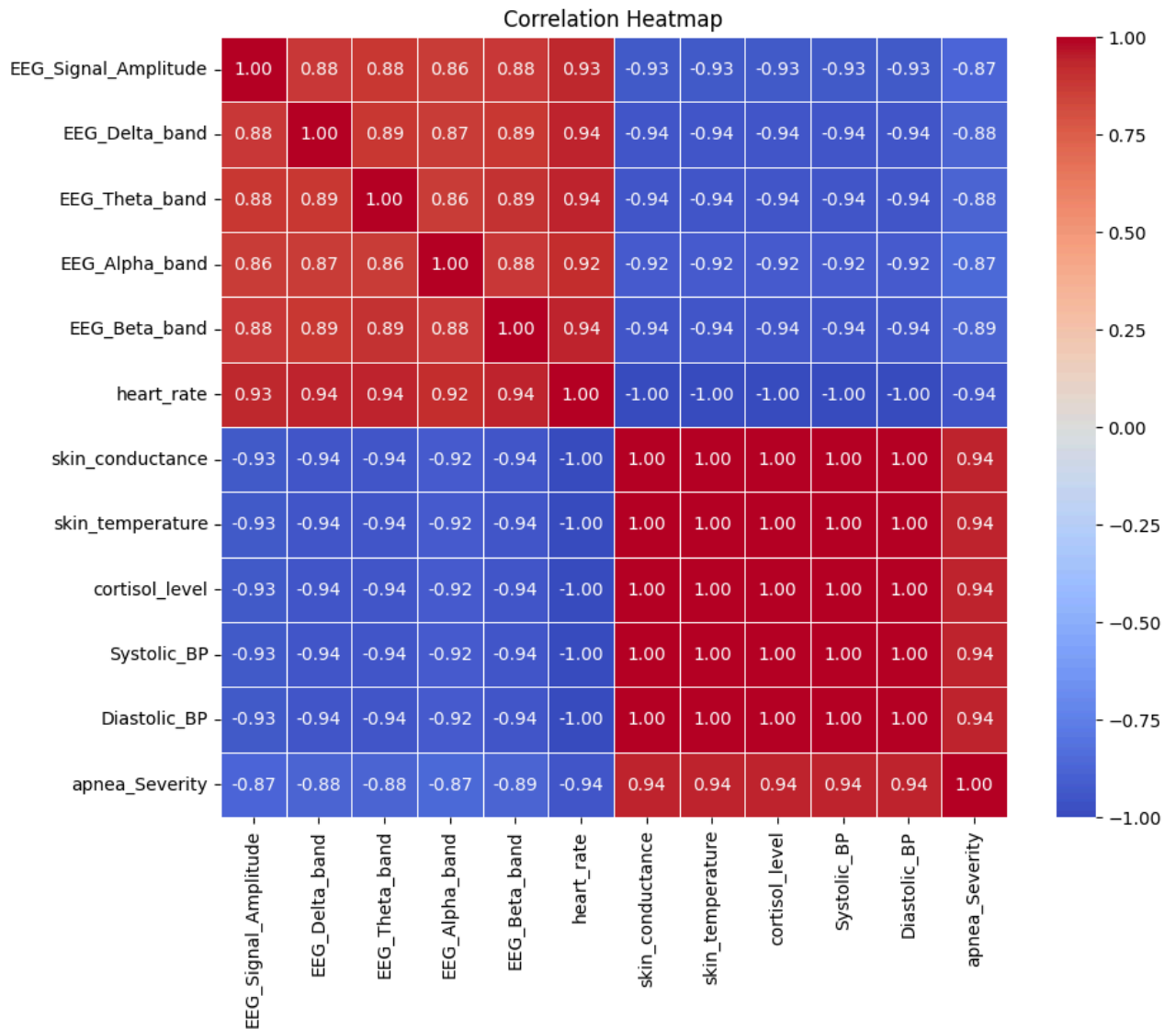
```
In [31]: correlation_matrix = df.corr()
print(correlation_matrix)
plt.figure(figsize=(10, 8))
sns.heatmap(correlation_matrix, annot=True, cmap='coolwarm', fmt=".2f", linewidths=.5)
plt.title("Correlation Heatmap")
plt.show()
```

|                      | EEG_Signal_Amplitude | EEG_Delta_band | EEG_Theta_band | \ |
|----------------------|----------------------|----------------|----------------|---|
| EEG_Signal_Amplitude | 1.000000             | 0.882041       | 0.883475       |   |
| EEG_Delta_band       | 0.882041             | 1.000000       | 0.890056       |   |
| EEG_Theta_band       | 0.883475             | 0.890056       | 1.000000       |   |
| EEG_Alpha_band       | 0.862325             | 0.867287       | 0.860805       |   |
| EEG_Beta_band        | 0.876931             | 0.889012       | 0.893707       |   |
| heart_rate           | 0.931941             | 0.942607       | 0.944144       |   |
| skin_conductance     | -0.931941            | -0.942607      | -0.944144      |   |
| skin_temperature     | -0.931941            | -0.942607      | -0.944144      |   |
| cortisol_level       | -0.931941            | -0.942607      | -0.944144      |   |
| Systolic_BP          | -0.931941            | -0.942607      | -0.944144      |   |
| Diastolic_BP         | -0.931941            | -0.942607      | -0.944144      |   |
| apnea_Severity       | -0.868084            | -0.884335      | -0.878918      |   |

|                      | EEG_Alpha_band | EEG_Beta_band | heart_rate | \ |
|----------------------|----------------|---------------|------------|---|
| EEG_Signal_Amplitude | 0.862325       | 0.876931      | 0.931941   |   |
| EEG_Delta_band       | 0.867287       | 0.889012      | 0.942607   |   |
| EEG_Theta_band       | 0.860805       | 0.893707      | 0.944144   |   |
| EEG_Alpha_band       | 1.000000       | 0.878412      | 0.920644   |   |
| EEG_Beta_band        | 0.878412       | 1.000000      | 0.941563   |   |
| heart_rate           | 0.920644       | 0.941563      | 1.000000   |   |
| skin_conductance     | -0.920644      | -0.941563     | -1.000000  |   |
| skin_temperature     | -0.920644      | -0.941563     | -1.000000  |   |
| cortisol_level       | -0.920644      | -0.941563     | -1.000000  |   |
| Systolic_BP          | -0.920644      | -0.941563     | -1.000000  |   |
| Diastolic_BP         | -0.920644      | -0.941563     | -1.000000  |   |
| apnea_Severity       | -0.865113      | -0.885964     | -0.937604  |   |

|                      | skin_conductance | skin_temperature | cortisol_level | \ |
|----------------------|------------------|------------------|----------------|---|
| EEG_Signal_Amplitude | -0.931941        | -0.931941        | -0.931941      |   |
| EEG_Delta_band       | -0.942607        | -0.942607        | -0.942607      |   |
| EEG_Theta_band       | -0.944144        | -0.944144        | -0.944144      |   |
| EEG_Alpha_band       | -0.920644        | -0.920644        | -0.920644      |   |
| EEG_Beta_band        | -0.941563        | -0.941563        | -0.941563      |   |
| heart_rate           | -1.000000        | -1.000000        | -1.000000      |   |
| skin_conductance     | 1.000000         | 1.000000         | 1.000000       |   |
| skin_temperature     | 1.000000         | 1.000000         | 1.000000       |   |
| cortisol_level       | 1.000000         | 1.000000         | 1.000000       |   |
| Systolic_BP          | 1.000000         | 1.000000         | 1.000000       |   |
| Diastolic_BP         | 1.000000         | 1.000000         | 1.000000       |   |
| apnea_Severity       | 0.937604         | 0.937604         | 0.937604       |   |

|                      | Systolic_BP | Diastolic_BP | apnea_Severity |
|----------------------|-------------|--------------|----------------|
| EEG_Signal_Amplitude | -0.931941   | -0.931941    | -0.868084      |
| EEG_Delta_band       | -0.942607   | -0.942607    | -0.884335      |
| EEG_Theta_band       | -0.944144   | -0.944144    | -0.878918      |
| EEG_Alpha_band       | -0.920644   | -0.920644    | -0.865113      |
| EEG_Beta_band        | -0.941563   | -0.941563    | -0.885964      |
| heart_rate           | -1.000000   | -1.000000    | -0.937604      |
| skin_conductance     | 1.000000    | 1.000000     | 0.937604       |
| skin_temperature     | 1.000000    | 1.000000     | 0.937604       |
| cortisol_level       | 1.000000    | 1.000000     | 0.937604       |
| Systolic_BP          | 1.000000    | 1.000000     | 0.937604       |
| Diastolic_BP         | 1.000000    | 1.000000     | 0.937604       |
| apnea_Severity       | 0.937604    | 0.937604     | 1.000000       |



```
In [32]: # Split the dataset into features and target
X = df.drop(columns=['apnea_Severity']).values
y = df['apnea_Severity'].values
```

```
In [33]: # Perform feature scaling
scaler = StandardScaler()
X_scaled = scaler.fit_transform(X)
```

```
In [34]: # Split the dataset into training and testing sets
X_train, X_test, y_train, y_test = train_test_split(X_scaled, y, test_size=0.2, random_state=42)
```

```
In [35]: # Convert data to PyTorch tensors
X_train_tensor = torch.tensor(X_train, dtype=torch.float32)
X_test_tensor = torch.tensor(X_test, dtype=torch.float32)
y_train_tensor = torch.tensor(y_train, dtype=torch.long)
y_test_tensor = torch.tensor(y_test, dtype=torch.long)
```

```
In [36]: # Defineing the neural network model
class Classifier(nn.Module):
    def __init__(self, input_size, output_size):
        super(Classifier, self).__init__()
        self.fc1 = nn.Linear(input_size, 128)
        self.fc2 = nn.Linear(128, 64)
        self.fc3 = nn.Linear(64, output_size)
        self.dropout = nn.Dropout(0.5) # Adding dropout for regularization

    def forward(self, x):
        x = torch.relu(self.fc1(x))
        x = self.dropout(x)
        x = torch.relu(self.fc2(x))
        x = self.dropout(x)
        x = self.fc3(x)
        return x
```

```
In [37]: # Instantiate the model
input_size = X_train.shape[1]
output_size = len(df['apnea_Severity'].unique())
model = Classifier(input_size, output_size)
```

```
In [38]: # Define the loss function and optimizer, and adjust the learning rate
criterion = nn.CrossEntropyLoss()
optimizer = optim.Adam(model.parameters(), lr=0.001) # Adjusted learning rate
```

```
In [39]: # Training loop
num_epochs = 100
for epoch in range(num_epochs):
    optimizer.zero_grad()
    outputs = model(X_train_tensor)
    loss = criterion(outputs, y_train_tensor)
    loss.backward()
    optimizer.step()
    if (epoch+1) % 10 == 0:
        print(f'Epoch [{epoch+1}/{num_epochs}], Loss: {loss.item():.4f}')
```

```
Epoch [10/100], Loss: 0.8643
Epoch [20/100], Loss: 0.6109
Epoch [30/100], Loss: 0.4788
Epoch [40/100], Loss: 0.4000
Epoch [50/100], Loss: 0.3173
Epoch [60/100], Loss: 0.3046
Epoch [70/100], Loss: 0.2790
Epoch [80/100], Loss: 0.2583
Epoch [90/100], Loss: 0.2497
Epoch [100/100], Loss: 0.2532
```

```
In [40]: # Evaluate the model
model.eval()
with torch.no_grad():
    y_pred = torch.argmax(model(X_test_tensor), dim=1).numpy()
    accuracy = accuracy_score(y_test, y_pred)
    print("Accuracy on test set:", accuracy)
```

```
Accuracy on test set: 0.9407407407407408
```

```
In [41]: # Make predictions on new data
new_data = [[97, 3.2531, 6.4658, 13.1411, 28.3962, 2, 0, 0, 0, 0]]
new_data_scaled = scaler.transform(new_data)
new_data_tensor = torch.tensor(new_data_scaled, dtype=torch.float32)
with torch.no_grad():
    prediction = torch.argmax(model(new_data_tensor)).item()
    print('Predicted apnea severity:', prediction)
```

```
Predicted apnea severity: 0
```

```
In [42]: new_data = [[58, 2.9477, 5.5462, 10.3739, 22.0865, 1, 1, 1, 1, 1, 1]]
new_data_scaled = scaler.transform(new_data)
new_data_tensor = torch.tensor(new_data_scaled, dtype=torch.float32)
with torch.no_grad():
    prediction = torch.argmax(model(new_data_tensor)).item()
    print('Predicted apnea severity:', prediction)
```

Predicted apnea severity: 1

```
In [43]: new_data = [[22, 1.9366, 4.3574, 8.9079, 18.7077, 0, 2, 2, 2, 2, 2]]
new_data_scaled = scaler.transform(new_data)
new_data_tensor = torch.tensor(new_data_scaled, dtype=torch.float32)
with torch.no_grad():
    prediction = torch.argmax(model(new_data_tensor)).item()
    print('Predicted apnea severity:', prediction)
```

Predicted apnea severity: 2

In [ ]: