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1  import os
2  import numpy as np
3  from sklearn.ensemble import RandomForestClassifier
4  from sklearn.model_selection import train_test_split
5  from sklearn.metrics import classification_report, confusion_matrix
6  import matplotlib.pyplot as plt
7  import seaborn as sns
8  from sklearn.preprocessing import LabelEncoder, StandardScaler, OneHotEncoder
9  from tensorflow.keras.models import Sequential
10 from tensorflow.keras.layers import Dense, Dropout
11 from tensorflow.keras.optimizers import Adam
12 from tensorflow.keras.preprocessing.image import ImageDataGenerator
13
14 # Directories and Parameters
15 base_dir = "/content/drive/MyDrive/spectrograms_Images"
16 IMG_HEIGHT, IMG_WIDTH = 128, 128
17
18 # Data Loading and Preprocessing
19 datagen = ImageDataGenerator(rescale=1.0 / 255)
20 data = datagen.flow_from_directory(
21     base_dir,
22     target_size=(IMG_HEIGHT, IMG_WIDTH),
23     batch_size=1,
24     class_mode='categorical',
25     shuffle=False
26 )
27
28 # Convert images and labels to arrays
29 images = []
30 labels = []
31
32 for i in range(len(data)):
33     img, label = data[i]
34     images.append(img[0])
35     labels.append(label[0])
36
37 images = np.array(images).reshape(len(images), -1) # Flatten images
38 labels = np.argmax(labels, axis=1) # Convert one-hot labels to integers
39
40 # Standardize Features
41 scaler = StandardScaler()
42 images_scaled = scaler.fit_transform(images)
43
44 # One-Hot Encode Labels for Neural Network
45 encoder = OneHotEncoder(sparse_output=False)
46 labels_onehot = encoder.fit_transform(labels.reshape(-1, 1))
47
48 # Train-Test Split
49 X_train, X_test, y_train, y_test = train_test_split(images_scaled, labels,
50     test_size=0.2, random_state=42)
51
52 X_train_nn, X_test_nn, y_train_nn, y_test_nn = train_test_split(images_scaled,
53     labels_onehot, test_size=0.2, random_state=42)
54
55 # Random Forest Classifier
56 print("Training Random Forest Classifier...")
57 rf_model = RandomForestClassifier(n_estimators=200, max_depth=20,
58     random_state=42)
59 rf_model.fit(X_train, y_train)
60
61 # Evaluate Random Forest
62 y_pred_rf = rf_model.predict(X_test)
63 rf_acc = np.mean(y_pred_rf == y_test) * 100
64 print(f"\nRandom Forest Test Accuracy: {rf_acc:.2f}%")
65 print("Random Forest Classification Report:")
66 print(classification_report(y_test, y_pred_rf))
67
68 # Confusion Matrix for Random Forest
69 cm_rf = confusion_matrix(y_test, y_pred_rf)
70 plt.figure(figsize=(8, 6))
71 sns.heatmap(cm_rf, annot=True, fmt='d', cmap='Blues', xticklabels=data.
72     class_indices.keys(), yticklabels=data.class_indices.keys())

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68 plt.title("Confusion Matrix - Random Forest")
69 plt.xlabel("Predicted")
70 plt.ylabel("Actual")
71 plt.show()
72
73 # Neural Network Model
74 print("Training Neural Network...")
75 nn_model = Sequential([
76     Dense(1024, activation='relu', input_shape=(X_train_nn.shape[1],)),
77     Dropout(0.4),
78     Dense(512, activation='relu'),
79     Dropout(0.3),
80     Dense(256, activation='relu'),
81     Dropout(0.2),
82     Dense(y_train_nn.shape[1], activation='softmax') # Output layer
83 ])
84
85 # Compile the model
86 nn_model.compile(optimizer=Adam(learning_rate=5e-4),
87                 loss='categorical_crossentropy', metrics=['accuracy'])
88
89 # Train the model
90 history = nn_model.fit(X_train_nn, y_train_nn, validation_data=(X_test_nn,
91 y_test_nn), epochs=30, batch_size=64)
92
93 # Evaluate the Neural Network
94 nn_loss, nn_acc = nn_model.evaluate(X_test_nn, y_test_nn)
95 print(f"\nNeural Network Test Accuracy: {nn_acc * 100:.2f}%")
96
97 # Plot Accuracy and Loss for Neural Network
98 def plot_nn_history(history):
99     plt.figure(figsize=(14, 6), dpi=100)
100     plt.subplot(1, 2, 1)
101     plt.plot(history.history['accuracy'], label='Training Accuracy',
102             color='blue')
103     plt.plot(history.history['val_accuracy'], label='Validation Accuracy',
104             color='orange')
105     plt.title('Training and Validation Accuracy')
106     plt.xlabel('Epochs')
107     plt.ylabel('Accuracy')
108     plt.legend()
109
110     plt.subplot(1, 2, 2)
111     plt.plot(history.history['loss'], label='Training Loss', color='blue')
112     plt.plot(history.history['val_loss'], label='Validation Loss',
113             color='orange')
114     plt.title('Training and Validation Loss')
115     plt.xlabel('Epochs')
116     plt.ylabel('Loss')
117     plt.legend()
118
119     plt.tight_layout()
120     plt.show()
121
122 plot_nn_history(history)
123
124 # Confusion Matrix for Neural Network
125 y_pred_nn_probs = nn_model.predict(X_test_nn)
126 y_pred_nn = np.argmax(y_pred_nn_probs, axis=1)
127 y_true_nn = np.argmax(y_test_nn, axis=1)
128
129 cm_nn = confusion_matrix(y_true_nn, y_pred_nn)
130 plt.figure(figsize=(8, 6))
131 sns.heatmap(cm_nn, annot=True, fmt='d', cmap='Blues', xticklabels=data.
132 class_indices.keys(), yticklabels=data.class_indices.keys())
133 plt.title("Confusion Matrix - Neural Network")
134 plt.xlabel("Predicted")
135 plt.ylabel("Actual")
136 plt.show()
137
138 print("\nNeural Network Classification Report:")
139 print(classification_report(y_true_nn, y_pred_nn, target_names=data.
140 class_indices.keys()))

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class_instances.keys())
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