

```

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#Final Project: AAI 511
#11 August 2025

#import necessary packages
import pretty_midi
import pandas as pd
import numpy as np
from google.colab import drive
import os
from sklearn.model_selection import train_test_split
from tensorflow.keras.utils import to_categorical
from tensorflow.keras.models import Sequential
from tensorflow.keras.layers import Conv2D, MaxPooling2D, Flatten, Dense, Dropout
from tensorflow.keras.layers import LSTM, TimeDistributed
from sklearn.metrics import accuracy_score, precision_score, recall_score

#initialize connection to google drive data
drive.mount('/content/drive')

↗ Drive already mounted at /content/drive; to attempt to forcibly remount, call drive.mount("/content/drive", force_remount=True)

#create main dataframe for piano rolls and composer id
main_music = pd.DataFrame(columns = ['song', 'composer_id'])

#initialize standard midi & piano roll parameters
hz = 100
timesteps = 4000
pitchrange = 128

#define function to get piano roll from midi file
#function created by LLM (xAI, 2025)
def get_piano_roll(midi_path, fs=100, fixed_length=4000):
    try:
        midi_data = pretty_midi.PrettyMIDI(midi_path)
        piano_roll = midi_data.get_piano_roll(fs=fs)
        piano_roll = piano_roll / 127.0
        current_length = piano_roll.shape[1]
        if current_length < fixed_length:
            padded = np.zeros((pitchrange, fixed_length))
            padded[:, :current_length] = piano_roll
            return padded
        else:
            return piano_roll[:, :fixed_length]
    except Exception as e:
        print(f"Error processing {midi_path}: {e}")
        return None

#previous dataset append function - not used in final
piano_roll = get_piano_roll(midi_path, hz, pitchrange)
if piano_roll is not None:
    new_row = pd.DataFrame({
        'song': [piano_roll],
        'composer_id': [composer_id]
    })
    main_music = pd.concat([main_music, new_row], ignore_index=True)
print(main_music)
print("\nDataFrame Info:")
print(main_music.dtypes)
print("\nShape of first piano roll:", main_music['song'][0].shape if not main_music.empty else "No data")
print(main_music.head())

↗
      song composer_id
0  [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1

DataFrame Info:
song          object
composer_id   object
dtype: object

Shape of first piano roll: (128, 128)
      song composer_id

```


```
0 [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,... 1
```

```
#define function to evaluate final model
#function created by LLM (xAI, 2025)
def evaluate_model(model, X_test, y_test, model_name):
    y_pred = model.predict(X_test)
    y_pred_classes = np.argmax(y_pred, axis=1)
    y_test_classes = np.argmax(y_test, axis=1)
    accuracy = accuracy_score(y_test_classes, y_pred_classes)
    precision = precision_score(y_test_classes, y_pred_classes, average='weighted')
    recall = recall_score(y_test_classes, y_pred_classes, average='weighted')
    print(f"{model_name} Performance:")
    print(f"Accuracy: {accuracy:.4f}")
    print(f"Precision: {precision:.4f}")
    print(f"Recall: {recall:.4f}")
    print()
    return accuracy, precision, recall
```

```
#establish data file path, specifiy piano roll hyper param, initialize list for
#data, iterate through directory and convert midi files to piano rolls
#bach data
data_dir = '/content/drive/My Drive/Bach'
data = []
fs = 100
fixed_length = 4000
compid = 1
for file_name in os.listdir(data_dir):
    midi_path = os.path.join(data_dir, file_name)
    piano_roll = get_piano_roll(midi_path, fs, fixed_length)
    if piano_roll is not None:
        composer_id = compid
        data.append({'song': piano_roll, 'composer_id': composer_id})
```

```
#establish data file path, specifiy piano roll hyper param, initialize list for
#data, iterate through directory and convert midi files to piano rolls
#beethoven data
data_dir = '/content/drive/My Drive/Beethoven'
fs = 100
fixed_length = 4000
compid = 2
max_entries = 20
for file_name in os.listdir(data_dir):
    midi_path = os.path.join(data_dir, file_name)
    piano_roll = get_piano_roll(midi_path, fs, fixed_length)
    if piano_roll is not None:
        composer_id = compid
        data.append({'song': piano_roll, 'composer_id': composer_id})
    if len(data) >= max_entries: # Stop after collecting 10 valid entries
        break
```

```
#establish data file path, specifiy piano roll hyper param, initialize list for
#data, iterate through directory and convert midi files to piano rolls
#chopin data
data_dir = '/content/drive/My Drive/Chopin'
fs = 100
fixed_length = 4000
compid = 3
max_entries = 30
for file_name in os.listdir(data_dir):
    midi_path = os.path.join(data_dir, file_name)
    piano_roll = get_piano_roll(midi_path, fs, fixed_length)
    if piano_roll is not None:
        composer_id = compid
        data.append({'song': piano_roll, 'composer_id': composer_id})
    if len(data) >= max_entries: # Stop after collecting 10 valid entries
        break
```

 /usr/local/lib/python3.11/dist-packages/pretty\_midi/pretty\_midi.py:100: RuntimeWarning: Tempo, Key or Time signature change warnings.warn()

```
#establish data file path, specifiy piano roll hyper param, initialize list for
#data, iterate through directory and convert midi files to piano rolls
#mozart data
```

```

data_dir = '/content/drive/My Drive/Mozart'
fs = 100
fixed_length = 4000
compid = 4
max_entries = 40
for file_name in os.listdir(data_dir):
    midi_path = os.path.join(data_dir, file_name)
    piano_roll = get_piano_roll(midi_path, fs, fixed_length)
    if piano_roll is not None:
        composer_id = compid
        data.append({'song': piano_roll, 'composer_id': composer_id})
    if len(data) >= max_entries: # Stop after collecting 10 valid entries
        break

```

```

#inspect dataframe
main_music = pd.DataFrame(data)

```

```

#inspect/evaluate dataframe
print(main_music)
print(main_music.dtypes)

```

```

0      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
1      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
2      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
3      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
4      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
5      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
6      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
7      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
8      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
9      [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 1
10     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
11     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
12     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
13     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
14     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
15     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
16     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
17     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
18     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
19     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 2
20     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
21     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
22     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
23     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
24     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
25     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
26     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
27     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
28     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
29     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 3
30     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
31     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
32     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
33     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
34     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
35     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
36     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
37     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
38     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4
39     [[0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0, 0.0,...] 4

song      object
composer_id  int64
dtype: object

```

```

#define X and Y vars for training
#one-hot encode y vars for training clarity
x = np.array(main_music['song'].tolist())
y = main_music['composer_id'].values - 1
y = to_categorical(y, num_classes=4)
#investigate format
print(y)
print(x.shape)

```

```

[[1.  0.  0.  0.]
 [1.  0.  0.  0.]
 [1.  0.  0.  0.]
 [1.  0.  0.  0.]

```

[illegible]

```
#split train/test data
xtrain, xtest, ytrain, ytest = train_test_split(x, y, test_size=0.2, random_state=42)
```

```
#format data for CNN expansion (additional channel for CNN format)
#both training and test data
xtraincnn = np.expand_dims(xtrain, axis=-1)
xtestcnn = np.expand_dims(xtest, axis=-1)
```

```
#initialize CNN model, sequential with multiple layers and activation functions
cnn_model = Sequential([
    Conv2D(32, (3, 3), activation='relu', input_shape=(xtrain.shape[1], xtrain.shape[2], 1)),
    MaxPooling2D((2, 2)),
    Conv2D(64, (3, 3), activation='relu'),
    MaxPooling2D((2, 2)),
    Flatten(),
    Dense(128, activation='relu'),
    Dropout(0.5),
    Dense(4, activation='softmax')
])
```

```
→ /usr/local/lib/python3.11/dist-packages/keras/src/layers/convolutional/base_conv.py:113: UserWarning: Do not pass an `input_
super().__init__(activity_regularizer=activity_regularizer, **kwargs)
```

```
#initialize LSTM model, sequential with multiple layers and activation functions
lstm_model = Sequential([
    LSTM(128, input_shape=(xtrain.shape[1], xtrain.shape[2]), return_sequences=True),
    LSTM(64),
    Dense(64, activation='relu'),
    Dropout(0.5),
    Dense(4, activation='softmax')
])
```

```

➡ /usr/local/lib/python3.11/dist-packages/keras/src/layers/rnn/rnn.py:199: UserWarning: Do not pass an `input_shape`/`input_dim`
  super().__init__(**kwargs)

```

```
#compile models with adam optimizer and CEntropy
#include epoch accuracy metric for real time data monitoring
cnn_model.compile(optimizer='adam', loss='categorical_crossentropy', metrics=['accuracy'])
```

```
lstm_model.compile(optimizer='adam', loss='categorical_crossentropy', metrics=['accuracy'])
cnn_model.fit(xtraincnn, ytrain, epochs=10, batch_size=32, validation_split=0.2)
lstm_model.fit(xtrain, ytrain, epochs=10, batch_size=32, validation_split=0.2)
```

↗ Epoch 1/10

#evaluation metrics CNN

```
cnn_accuracy, cnn_precision, cnn_recall = evaluate_model(cnn_model, xtestcnn, ytest, "CNN Model")
```

↗ 1/1 ————— 1s 529ms/step

```
CNN Model Performance:
Accuracy: 1.0000
Precision: 1.0000
Recall: 1.0000
```

#evaluation metrics LSTM

```
lstm_accuracy, lstm_precision, lstm_recall = evaluate_model(lstm_model, xtest, ytest, "LSTM Model")
```

↗ 1/1 ————— 1s 800ms/step

```
LSTM Model Performance:
Accuracy: 0.0000
Precision: 0.0000
Recall: 0.0000
```

```
/usr/local/lib/python3.11/dist-packages/sklearn/metrics/_classification.py:1565: UndefinedMetricWarning: Precision is ill-de
_warn_prf(average, modifier, f"{metric.capitalize()} is", len(result))
/usr/local/lib/python3.11/dist-packages/sklearn/metrics/_classification.py:1565: UndefinedMetricWarning: Recall is ill-defin
_warn_prf(average, modifier, f"{metric.capitalize()} is", len(result))
```

#hyperparam adjustments and retraining for CNN:

```
from tensorflow.keras.layers import BatchNormalization, Activation, AveragePooling2D
```

```
cnn_model2 = Sequential([
    Conv2D(32, (3, 3), input_shape=(xtrain.shape[1], xtrain.shape[2], 1)),
    BatchNormalization(),
    Activation('relu'),
    AveragePooling2D((2, 2)),
    Conv2D(64, (3, 3)),
    BatchNormalization(),
    Activation('relu'),
    AveragePooling2D((2, 2)),
    Conv2D(128, (3, 3)),
    BatchNormalization(),
    Activation('relu'),
    AveragePooling2D((2, 2)),
    Flatten(),
    Dense(128, activation='relu'),
    Dropout(0.5),
    Dense(4, activation='softmax')
])
```

#adjusted epochs 10→20

```
cnn_model2.compile(optimizer='adam', loss='categorical_crossentropy', metrics=['accuracy'])
cnn_model2.fit(xtraincnn, ytrain, epochs=20, batch_size=32, validation_split=0.2)
cnn_accuracy, cnn_precision, cnn_recall = evaluate_model(cnn_model2, xtestcnn, ytest, "CNN Model 2")
```

#hyperparam adjustments and retraining for LSTM:

```
lstm_model2 = Sequential([
    LSTM(128, input_shape=(xtrain.shape[1], xtrain.shape[2]),
        return_sequences=True, dropout=0.3),
    LSTM(128, dropout=0.3),
    Dense(64, activation='relu'),
    Dropout(0.5),
    Dense(4, activation='softmax')
])
```

#adjusted epochs 10→20

```
lstm_model2.compile(optimizer='adam', loss='categorical_crossentropy', metrics=['accuracy'])
lstm_model2.fit(xtrain, ytrain, epochs=20, batch_size=32, validation_split=0.2)
lstm_accuracy, lstm_precision, lstm_recall = evaluate_model(lstm_model2, xtest, ytest, "LSTM Model 2")
```

