1 Introduction

In 2018, two of my favorite bands – The Front Bottoms and Manchester Orchestra – released a song they collaborated on called "Allentown." In a statement to Noisey (Ross, 2018) – the music arm of Vice – Andy Hull of Manchester Orchestra recalled that the creation of this track started when Nate Hussey of All Get Out sent him the first four lines of the track. Andy Hull worked out the melody and music and shared it with Brian Sella of The Front Bottoms, who then helped develop the chorus.

This brings us to an interesting question: which band contributed most to the song?

To attempt to answer this question, we purchased all releases before "Allentown" except joint albums, live albums, and single releases contained in a full album or an Extended Play (EP), a release that is more than a single release but shorter than a full album. We have 42 tracks by All Get Out, 77 by Manchester Orchestra, and 61 by The Front Bottoms. This totals 180 tracks; there are 181, including "Allentown."

We aimed to use Essentia (Bogdanov et al., 2013) – an open-source program for music analysis, description, and synthesis – to create data about what each band's tracks "sound like." We had trouble installing the program onto Windows and Linux. However, Essentia provides precompiled versions of the program that you can run on individual tracks using the command line¹. Instead of programming, we can call the executable file to process each track (a .wav file we have). In the previous lab, you wrote code that can be generalized to create a batch file that contains all 181 commands, which we can execute to process all the songs.

The Research and High-Performance Computing group on campus was able to install the Essentia environment on a virtual computer. There, I was able to reproduce the **streaming_music_extractor** calls using the most recent version. I was also able to interface with Essentia models (Alonso-Jiménez et al., 2020), which provide additional features (e.g., moods, contexts, instrumentation, etc.). Unlike the data from the **streaming_music_extractor** calls, the data from the Essentia models are output to a .csv file.

In the coding task below, I provide the details necessary for completing the task of cleaning these data given the 181 .json files and the .csv file with data from the Essentia models. This lab will enable you to practice (1) installing, loading, and learning to use libraries; (2) working with character objects; (3) coding for() loops; and (4) accessing elements of vectors and lists.

2 Lab Coding Task: Compile Data from Essentia

Step 0: Install the stringr (Wickham et al., 2019) and jsonlite (Ooms, 2014) packages for R. Step 1: As an example, work with just the song Au Revoir (Adios) on the Talon Of The Hawk album by The Front Bottoms.

- 1. Create an object called current.filename and set it equal to the character string: The Front Bottoms-Talon Of The Hawk- Au Revoir (Adios).json.
- 2. Use the str_split() function to extract the artist, album, and track from the filename. Note that while you can do this manually for one file, we want to automate this process for all files later.

 Hint: Use str_sub() to remove the trailing .json.
- 3. Load the JSON file into R using the from JSON() function. The resulting object is a large list.
- 4. Extract the overall loudness (loudness_ebu128\$integrated saved as overall_loudness), spectral energy (spectral_energy), dissonance (dissonance), pitch salience (pitch_salience), tempo in beats per minute, (bpm), beat loudness (beats_loudness), danceability (danceability), and tuning frequency (tuning_frequency). You will find the documentation here rather helpful as you explore the list object.

¹https://essentia.upf.edu/extractors/

- Step 2: Load and clean the data from the Essentia models by completing Step 1 for all .JSON files in the EsssentiaOutput folder. Save the resulting vector of data for each .JSON file as a row in a data frame. Step 3: Load and clean the data from the Essentia models by completing the following steps. Note you
- may find the documentation here to be helpful.

 1. Load the EssentiaModelOutput.csv file.
 - 2. Valence and arousal are estimated using three datasets: DEAM, emoMusic, and MuSe. Compute two new columns valence and arousal that are the average of the three estimates of each.
 - 3. Aggressive, happy, party, relaxed, and sad moods are collected using two feature extractors: Discogs-EffNet and MSD-MusiCNN. Compute new columns aggressive, happy, party, relaxed, and sad by averaging the two extractors for each feature.
 - 4. Acoustic and electric sound are collected using two feature extractors: Discogs-EffNet and MSD-MusiCNN. Compute new columns acoustic and electric by averaging the two extractors.
 - 5. Instrumental (absence of voice) is collected using two feature extractors: Discogs-EffNet and MSD-MusiCNN. Compute a new column instrumental that is the average of the two extractors.
 - 6. Timbre is collected using only the Discogs-EffNet extractor. Rename the eff_timbre_bright column to timbreBright.
 - 7. Retain only the features created or renamed above and the artist, album, track columns.
- **Step 4:** I used the collected lyrics for the tracks and ran them through a text analysis tool called LIWC, which provides features that describe thoughts, feelings, and personality traits based on the language used in lyrics by the artists. Load the data from LIWC and compile the full dataset.
 - 1. Load the LIWCOutput.csv file.
 - 2. Use the merge() function to merge the data from the data from the streaming_music_extractor calls, the Essentia models, and LIWC into one data frame.
 - **Hint 1:** You may find that your resulting dataframe "creates" rows. I found this post which describes the issue as being duplicated observations in the by argument. Note that the last example in the documentation for the merge() function enables grouping by more than one column.
 - **Hint 2:** You may find that your resulting dataframe "removes rows. In this case, you may find the all.x or all.y arguments to be helpful.
 - 3. Rename the function column to funct, noting that using function as a column name can cause issues while coding. For example, you'll see that R has already renamed it to function..

Step 5: Create two separate files.

- 1. Write a .csv file called trainingdata.csv that contains all tracks except "Allentown."
- 2. Write a .csv called testingdata.csv that contains just the track "Allentown."

3 Lab Coding Challenge: What Do the Data Tell Us?

The instructions in this lab coding task lead you through creating a complex dataset that merges music and lyrical analyses from multiple programs. Now, we have a lot of data to answer our research question. In the next lab, we will work with these data using tidyverse (Wickham et al., 2019), which will include summarizing the data in ways that provide preliminary information about which band had the largest impact on "Allentown." As a challenge, attempt to create 1-3 plots that give insight into possible answers to this question. As a starting point, you may find the documentation for boxplot() helpful. For a more attractive plot, you might find the Shiny app here to be helpful; note that you download the plots directly or copy the generating R code by clicking the "

References

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