# Music Data Analysis in R - Shortcourse, Technical report

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**Abstract** Music Information Retrieval (MIR) is a recent study field, with a wide range of applications yet to be explored. It combines computational tools with music theory to amplify the utility of music data of many different formats. Each data format carries dissimilar levels of information, represented as sheet music, audio files, chords, lyrics, and others. On the Music Data Analysis in R short course, we presented some possible applications of MIR using R, including: i) accessing data from APIs; ii) sentiment analysis in music lyrics; iii) harmony analysis; iv) visualization, and v) music popularity prediction with machine learning models. All applications made direct use of R, including especially the tidyverse, vagalumeR, RSpotify and chorrrds package.

#### Introduction

On May 21 to 23, 2019, the IV International Seminar on Statistics with R took place in Niterói, Brazil, with the theme 'R Python collaboration trends'. As a part of the event, there was also a short-course day, on May 20, when the Music Data Analysis in R (Wundervald and Trecenti (2019)) was presented.

Music Information Retrieval (MIR) is a recent study field, with a wide range of applications yet to be explored. It combines computational tools with music theory to amplify the utility of music data of many different formats. Each data format carries dissimilar levels of information, being represented as sheet music, audio files, chords, lyrics, and others.

Since Music Information Retrieval is still mostly done in python, it made sense to bring this short-course to such an event. The main idea of the course is to show how MIR can be done in R (R Core Team (2016)), and still has a lot of space to grow inside the community. We presented some possible applications of MIR using R, including: i) accessing data from APIs; ii) sentiment analysis in music lyrics; iii) harmony analysis; iv) visualization; and v) music popularity prediction with machine learning models.

## **Audience**

This short-course was meant to be for anyone interested in R or music information retrieval. The final audience consisted mainly of students with an intermediate level of R and data analysis.

## Description

All applications of the short-course made direct use of R. For this course, we choose to work with the data of the Brazilain singer Chico Buarque, to demonstrate the content of the course. The main goals of the material presented were, first, to show how to use the packages:

- vagalumeR: lyrics extraction
- chorrrds: chords extraction
- Rspotify: extract variables from the Spotify API

All the 3 packages were used for the data extraction. As the vagalumeR and Rspotify makes use of 2 different APIs, the short-course also covered an introduction about how to connect and handle the access to APIs in R.

With the data in hand, the next task was to learn how to combine data from different sources. The main issue, in this case, was that, in theory, it exists a common key between the 3 data sources, which is the song names, but that might not always be true. Sometimes, the names are written slightly different, or even completely, and this needs to be addressed properly when we are treating the data.

We followed into the understanding and summarising of the obtained data, which comes in various formats:

- Text.
- · Continuous variables,
- Sequences.

For the text data, the lyrics, we focused on visualization, tokenization, sentiment analysis, leading us to find interesting features such as the most common words and bi-grams and in which songs the most positive or negative feelings are.

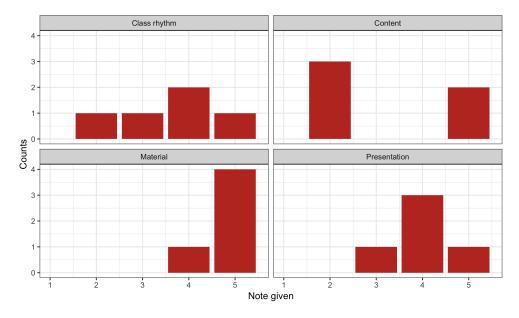
For the chords data, on the other hand, we had a bit more of work related to music theory. We found which were the songs more harmonically "complex", as in evaluating their harmonic structures, number of distinct chords and by extracting harmonic variables. We do the last one because the chords, in reality, are nothing but a string, which does not mean anything quantitatively. Because of this, feature extraction is necessary if we want to make more sense of it. Besides that, we also evaluated the most common or rare chords transitions, seeing how it agreed with music theory rules, that define which transitions make more sense.

Next, we used the variables from the Spotify API to discover how the popularity of the songs varies in the dataset, what are the least and most popular songs and a little of exploratory analysis, to check what is the relationship between the danceability and the other variables originated in the API. This leads us to the final part of the course, which consisted of the creation of prediction models for the popularity of the songs. In this case, we decided to use the random forest model (Breiman (2001)), and the variables that were obtained throughout the course.

The short-course was presented with the help of slides and the RStudio IDE, where the code in the presentation was run. It was originally presented in Portuguese, but an English version of all the material was also made publicly available. The slides in both languages, as well as the data and the code (.R file), are hosted at https://github.com/brunaw/SER2019.

## Course evaluation

In the end, it was asked for the students to fill a quick evaluation form. Not all students answered, and the results are presented in Figure 1. There is quite a good appreciation for the material and the presentation of the short-course, demonstrating the need for R material in the area. Even with that, the students considered the class a little faster than the ideal, meaning that it could have had a better pace. The content has split the opinions, being considered perfect for a few students, but a little hard for some others.



**Figure 1:** Final evaluation of shortcourse. 3 represents perfect for the Class rhythm, and 5 represents perfect for the other questions.

## Next steps

Some reviews about this course are planned, in order to make it clearer/accessible to more people. We would like to produce more material about R regarding music data analysis, as this increase of availability can help strengthen such a young community and the Music Information Retrieval area in general.

## **Bibliography**

- L. Breiman. Random Forests. *Machine Learning*, 2001. ISSN 1098-6596. doi: 10.1017/CBO9781107415324. 004. [p2]
- R Core Team. *R: A Language and Environment for Statistical Computing*. R Foundation for Statistical Computing, Vienna, Austria, 2016. URL https://www.R-project.org/. ISBN 3-900051-07-0. [p1]
- B. Wundervald and J. Trecenti. Music data analysis in r, 2019. URL https://github.com/brunaw/SER2019. [p1]

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