Classifying Music Producers and Composers

NLP Models Using Reddit Data

Background and Data Science Problem

- Music producers use Digital Audio Workstations (DAWs) such as Ableton

- Composers use scorewriter software such as Sibelius

- DAW market size in 2021: **$2.49 Billion**[1], with CAGR estimated at **9%**

- Problem: Using message data from persons interested in making music, determine whether they're a **"Producer" or a "Composer"** so that we can properly market software

1. https://www.fortunebusinessinsights.com/industry-reports/digital-audio-workstation-market-100150

Data and Methods

- We train classification models to guess whether a Reddit post came from **r/composer** or **r/musicproduction**

- Using **PRAW**, we scrape over 1000 posts from each subreddit

- We use posts' **title texts and body texts** to build "bag of words" models

  - **URL preprocessing** using Regular Expressions
  - Count vectorization

- Scoring based on cross-val **accuracy**; validation with test data accuracy
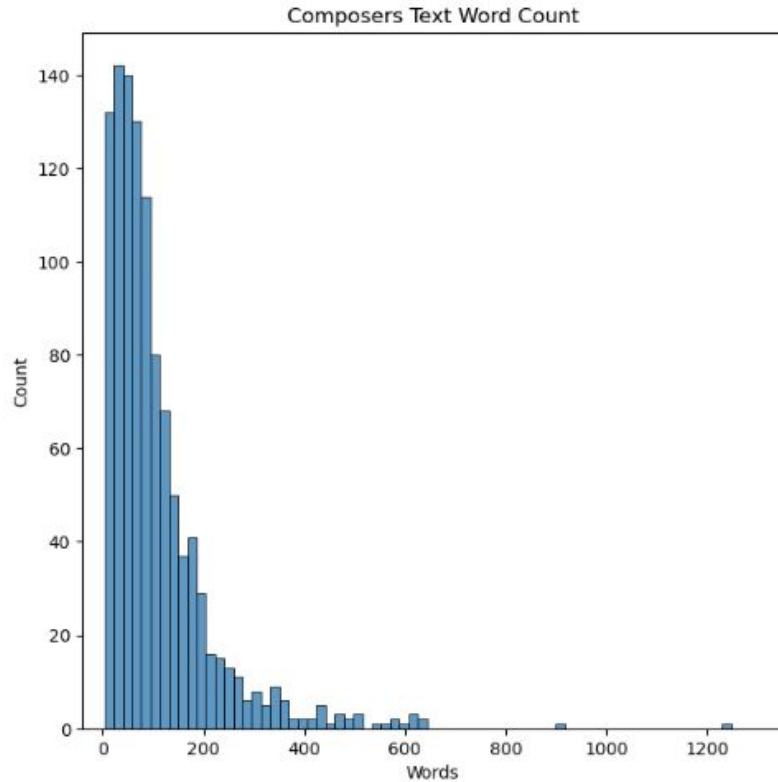
Example Post: Composer or Producer?

help with evolving

==
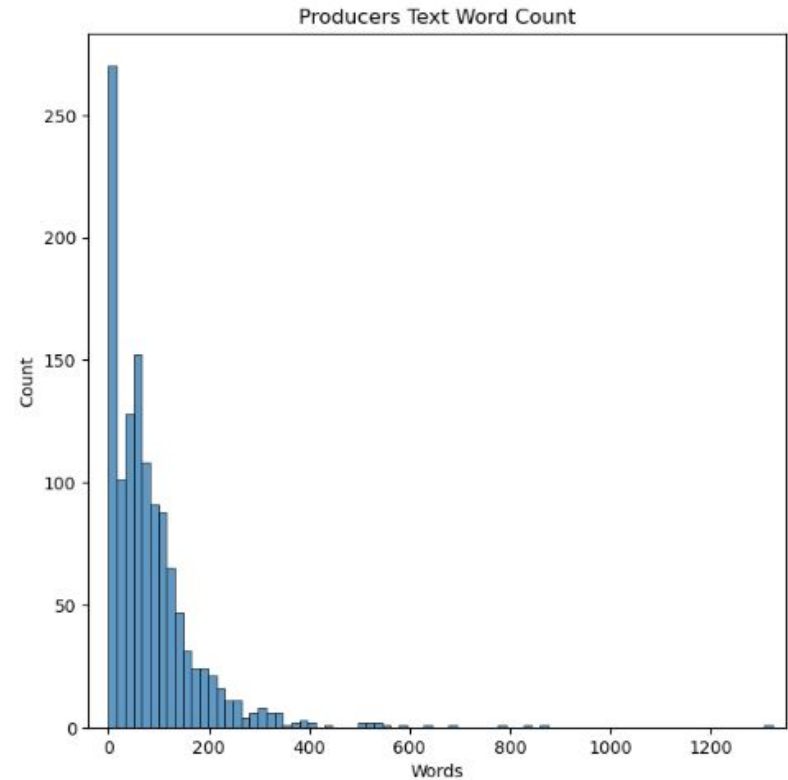
i have a problem. i can make a melody and so. but when im done with the melody, i often find it hard to continue on it. what do you guys do when you have something you wanna work on but dont know how to continue or what to do next?
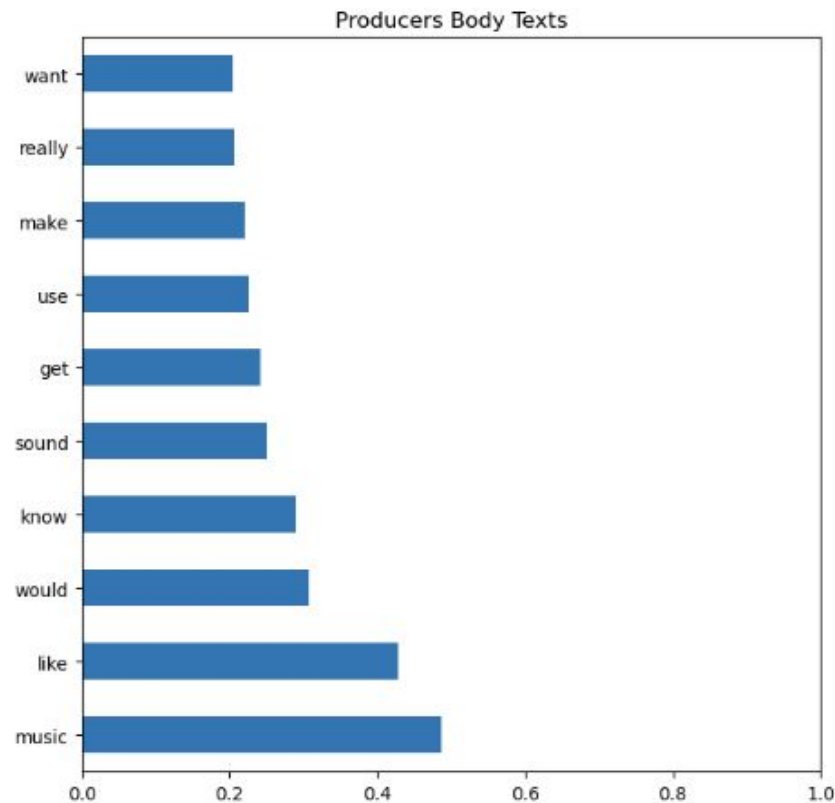
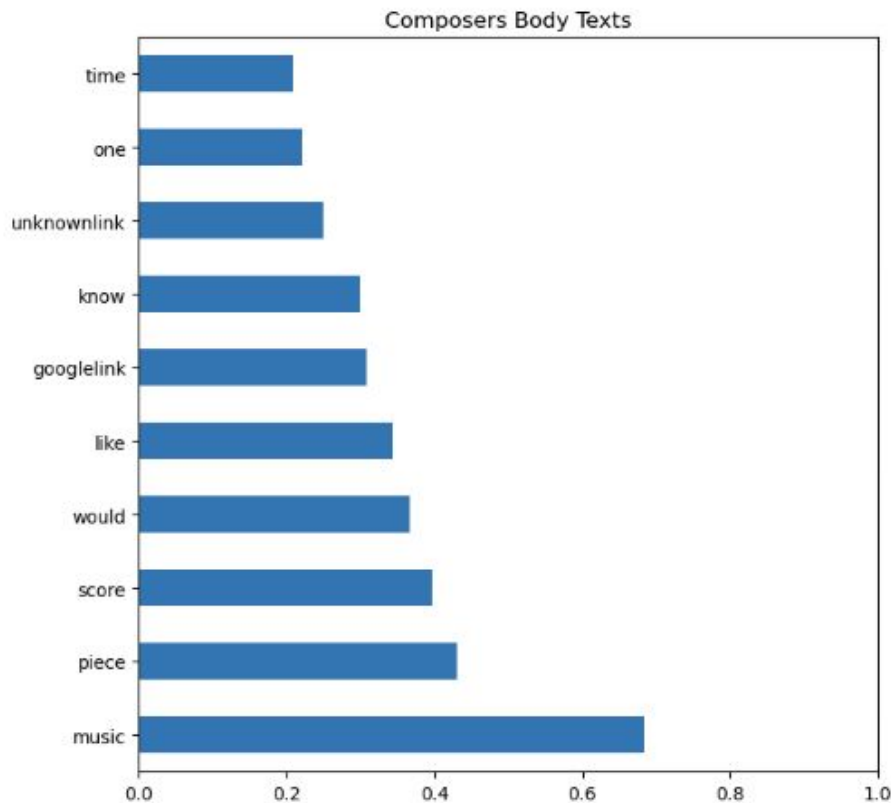# Exploratory Data Analysis

EDA: Word Count

Composers Text Word Count

Producers Text Word Count

Mean: 106, SD: 108

Mean: 86, SD: 100

EDA: Most Common Words (after only URL processing)

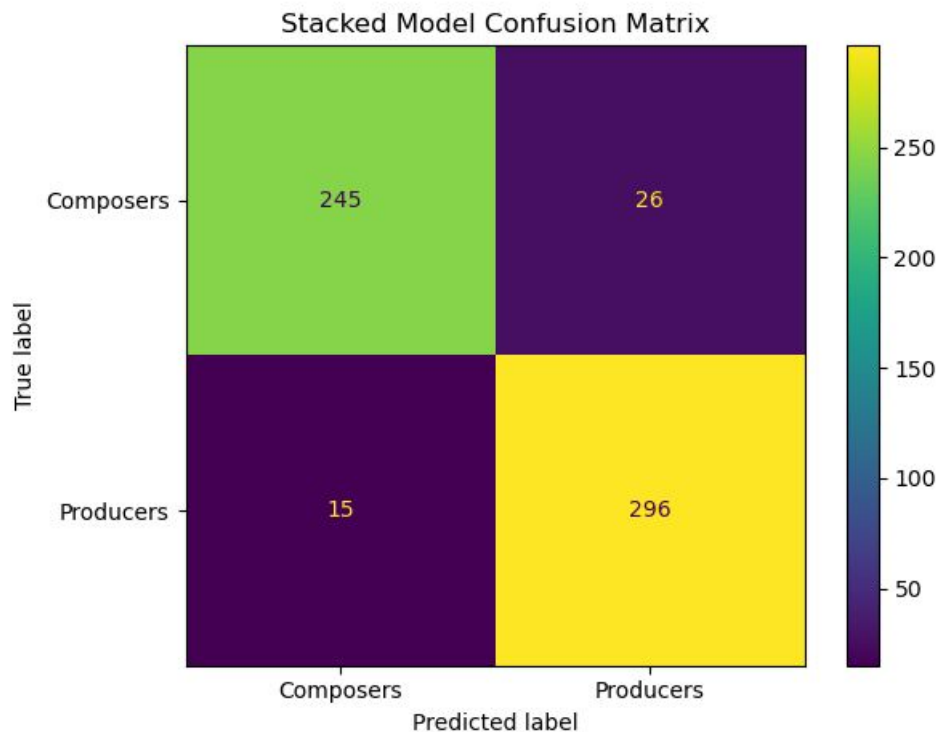x-Axis = Average Frequency Per Post

Modeling

Modeling Techniques

- Gridsearch to tune hyperparameters

- Some methods of preprocessing/modeling helped a lot:
    - **Preprocessing URLs**:   misclassification ⬇️ **15-25%**
    - **Stacking best models**:   misclassification ⬇️ **15%**
    - Removing stop words

- Others did not help:
    - Stemming / Lemmatizing
    - TF-IDF word encoding
    - Adding bigrams
    - Including word counts as features
    - Considering only titles (no body text)

Best Models

Test Data Classifications

	Crossval Score	Test Data Score
Stacked Model	0.940325	0.929553
Naive Bayes	0.936311	0.917526
Random Forest	0.922524	0.914089
Gradient Boost	0.913938	0.908935
Logistic Regression	0.911074	0.903780

Stacked Model Confusion Matrix

Example Classifications (Stacked Model)

Looking for a virtual instrument like this. Can anyone tell me what it is (video link)
==
Looking to buy a a virtual instrument to whatever that is being played in video? Anyone know which instrument and what's a good library that carries this?
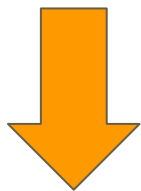
[SIDEWAYS](https://youtube.com/clip/UgkxypJBTTWFtamIb6OWBQEb8KZznanwNw8D)

Prediction

"Composers" (52.7%) ✔

Example Classifications (Stacked Model)

help with evolving
==
i have a problem. i can make a melody and so. but when im done with the melody, i often find it hard
to continue on it. what do you guys do when you have something you wanna work on but dont know how t
o continue or what to do next?

Prediction

"Producers" (94.4%) ✔

Room for Improvement?

Failed Classification (Stacked Model)

Question about Metropolis Ark 1 choirs
==
If anyone here has used Metropolis Ark 1, you'll notice the excellent choir samples, both Male and F
emale. But the thing I wanted to point attention to is the Marcato and Staccato, where with each not
e is punctuated with a different syllable, It doesn't seem to be "Do re me la...", and I just wanted
to know if there's a specific name for this style of singing? Okay, obviously when you choose the no
te it choses a random syllable, but it sounds impressive and I want to learn a bit more about it, an
d if there's a way to notate such singing (or would you consider it chanting?)

Prediction

"Producers" (97.2%) ✖

What went wrong?

Question about Metropolis Ark 1 choirs
===
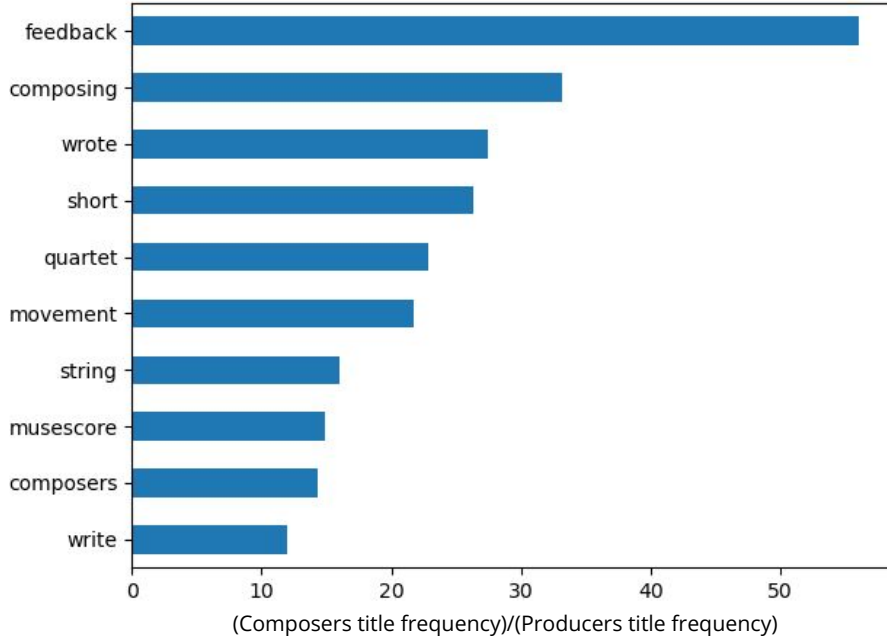If anyone here has used Metropolis Ark 1, you'll notice the excellent choir samples, both Male and F
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Rare in corpus (not selected as a feature)
but *__relatively__ more common among Composers*
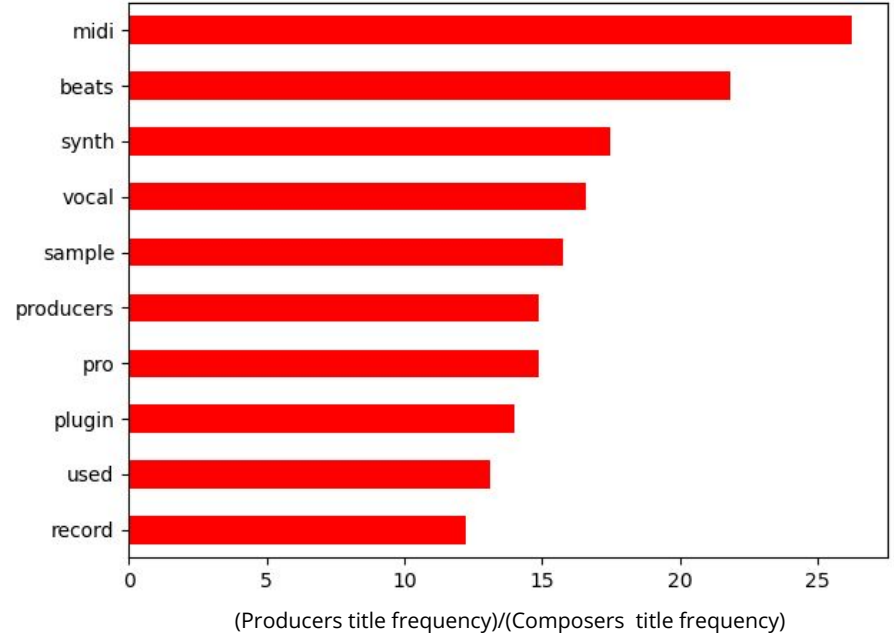
Common among Producers

Words with Top Frequency Ratios

Frequency Ratios of Top Composers Words
(among words that appear in at least 1% of titles)

(Composers title frequency)/(Producers title frequency)

Frequency Ratios of Top Producers Words
(among words that appear in at least 1% of titles)

(Producers title frequency)/(Composers title frequency)

Infinite Ratio Words: fugue, sonata, love, theme, piece, score, wind, prelude, composer, violin, symphony, flute, composition, orchestra, concerto, minor, quintet

Infinite Ratio Words: artists, plugins, mix, effect, producer, beat, ableton, interface, FL, laptop, samples, production, got, logic, vocals, headphones, mixing, DAW, mic

Conclusions

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- "Bag of words" NLP classification models can perform well with < 1000 data points in each class

- Potential music makers can be sorted into "Producers" or "Composers" with over 93% accuracy based on their Reddit posts

- Tuning different models then stacking them improves performance

- Proper preprocessing is essential
  - URL processing for Reddit posts
  - Frequency ratios rather than overall frequencies?