$Spotify_EDA_Project$

April 16, 2023

0.1 Importing Libraries

```
[1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

[2]: sns.set_style("darkgrid") #Setting the style as darkgrid

0.2 Loading Dataset

0.2.1 Spotify API Reference

https://developer.spotify.com/documentation/web-api/reference/get-audio-features

```
[3]: df = pd.read_csv('data.csv')
```

[]: df

[]:		Unnamed: 0 aco	usticnes	ss dancea	bility d	uration_m	s energy	\	
	0	0	0.0102	20	0.833	20460	0 0.434		
	1	1	0.1990	00	0.743	32693	3 0.359		
	2	2	0.0344	10	0.838	18570	7 0.412		
	3	3	0.6040	00	0.494	19941	3 0.338		
	4	4	0.1800	00	0.678	39289	3 0.561		
	•••	•••	•••	•••	•••	•••			
	2012	2012	0.0010	06	0.584	27440	4 0.932		
	2013	2013	0.0877	70	0.894	18218	2 0.892		
	2014	2014	0.0085	57	0.637	20720	0 0.935		
	2015	2015	0.0016	34	0.557	18560	0 0.992		
	2016	2016	0.0028	31	0.446	20452	0 0.915		
		instrumentalnes	s key	liveness	loudness	mode s	peechiness	tempo	\
	0	0.02190	•	0.1650	-8.795		0.4310	150.062	
	1	0.00611	0 1	0.1370	-10.401	1	0.0794	160.083	
	2	0.00023	4 2	0.1590	-7.148	1	0.2890	75.044	
	3	0.51000	0 5	0.0922	-15.236	1	0.0261	86.468	
	4	0.51200	0 5	0.4390	-11.648	0	0.0694	174.004	

```
2013
                    0.001670
                                      0.0528
                                                 -2.663
                                                                     0.1310
                                                                             110.041
     2014
                                                 -2.467
                                                                     0.1070
                                                                              150.082
                    0.003990
                                      0.2140
     2015
                    0.677000
                                      0.0913
                                                 -2.735
                                                             1
                                                                     0.1330
                                                                             150.011
                                 1
     2016
                                                 -6.221
                                                                             190.013
                    0.000039
                                 9
                                      0.2180
                                                             1
                                                                     0.1410
           time_signature
                           valence
                                      target
                                                                           song_title
                              0.286
     0
                       4.0
                                           1
                                                                             Mask Off
     1
                       4.0
                              0.588
                                           1
                                                                             Redbone
     2
                       4.0
                              0.173
                                           1
                                                                        Xanny Family
     3
                       4.0
                              0.230
                                           1
                                                                      Master Of None
                                                                      Parallel Lines
     4
                       4.0
                               0.904
                                           1
                       4.0
                               0.211
                                           0
                                                Like A Bitch - Kill The Noise Remix
     2012
                       4.0
                                           0
     2013
                              0.867
     2014
                       4.0
                                           0
                                              Habit - Dack Janiels & Wenzday Remix
                              0.470
     2015
                       4.0
                              0.623
                                           0
                                                                       First Contact
                                           0
     2016
                       4.0
                               0.402
                                                                  I Wanna Get Better
                      artist
     0
                      Future
     1
           Childish Gambino
                      Future
     2
     3
                 Beach House
     4
                 Junior Boys
     2012
             Kill The Noise
     2013
             Dillon Francis
     2014
                    Rain Man
     2015
                  Twin Moons
     2016
                   Bleachers
     [2017 rows x 17 columns]
[5]: #Droping the column as it same as index value and not important for the analysis
     df.drop("Unnamed: 0", axis=1, inplace=True)
[6]: df.head()
[6]:
        acousticness
                       danceability
                                      duration_ms
                                                    energy
                                                            instrumentalness
                                                                                key
     0
              0.0102
                               0.833
                                           204600
                                                     0.434
                                                                     0.021900
     1
              0.1990
                               0.743
                                           326933
                                                     0.359
                                                                     0.006110
                                                                                  1
     2
                              0.838
                                                     0.412
                                                                                  2
              0.0344
                                           185707
                                                                     0.000234
     3
              0.6040
                              0.494
                                                     0.338
                                                                     0.510000
                                                                                  5
                                           199413
     4
                                                     0.561
              0.1800
                              0.678
                                           392893
                                                                     0.512000
                                                                                  5
```

2012

0.002690

0.1290

-3.501

1

0.3330

74.976

```
loudness mode
                                   speechiness
                                                          time_signature
                                                                          valence
        liveness
                                                  tempo
     0
          0.1650
                    -8.795
                                        0.4310
                                                150.062
                                                                     4.0
                                                                             0.286
                                                                     4.0
     1
          0.1370
                   -10.401
                                        0.0794
                                                160.083
                                                                             0.588
     2
          0.1590
                    -7.148
                                1
                                        0.2890
                                                 75.044
                                                                     4.0
                                                                             0.173
     3
          0.0922
                   -15.236
                                1
                                        0.0261
                                                 86.468
                                                                     4.0
                                                                             0.230
     4
          0.4390
                   -11.648
                                0
                                        0.0694 174.004
                                                                     4.0
                                                                             0.904
                    song_title
                                           artist
        target
     0
                      Mask Off
                                           Future
             1
     1
             1
                       Redbone Childish Gambino
     2
             1
                  Xanny Family
                                           Future
     3
             1
                Master Of None
                                      Beach House
             1
                Parallel Lines
                                      Junior Boys
    ## Data Cleaning
[7]: #Checking for missing values
     df.isna().sum()
[7]: acousticness
                          0
                         0
     danceability
     duration_ms
                          0
     energy
                          0
     instrumentalness
                          0
                          0
    key
                          0
     liveness
     loudness
                          0
    mode
                          0
     speechiness
                          0
     tempo
                          0
     time_signature
                          0
     valence
                          0
                          0
     target
     song_title
                          0
                          0
     artist
     dtype: int64
[8]: df.info() #Print a concise summary of a DataFrame.
    <class 'pandas.core.frame.DataFrame'>
    RangeIndex: 2017 entries, 0 to 2016
    Data columns (total 16 columns):
         Column
                            Non-Null Count Dtype
                            _____
     0
         acousticness
                            2017 non-null
                                             float64
```

float64

2017 non-null

1

danceability

```
duration_ms
      3
          energy
                                             float64
                             2017 non-null
      4
          instrumentalness
                            2017 non-null
                                             float64
      5
          key
                             2017 non-null
                                              int64
      6
          liveness
                             2017 non-null
                                              float64
      7
          loudness
                             2017 non-null
                                             float64
      8
          mode
                             2017 non-null
                                             int64
      9
          speechiness
                             2017 non-null
                                             float64
          tempo
                             2017 non-null
                                             float64
      10
                                             float64
          time_signature
                             2017 non-null
      12
                             2017 non-null
                                             float64
          valence
      13
          target
                             2017 non-null
                                              int64
      14
          song_title
                             2017 non-null
                                             object
                             2017 non-null
          artist
                                              object
     dtypes: float64(10), int64(4), object(2)
     memory usage: 252.2+ KB
               #Dimensionality of the DataFrame.
 [9]: df.shape
 [9]: (2017, 16)
[68]:
      df.size
[68]: 32272
[10]: df.columns
[10]: Index(['acousticness', 'danceability', 'duration_ms', 'energy',
             'instrumentalness', 'key', 'liveness', 'loudness', 'mode',
             'speechiness', 'tempo', 'time_signature', 'valence', 'target',
             'song_title', 'artist'],
            dtype='object')
[12]: df.describe() #Generating descriptive statistics
[12]:
             acousticness
                           danceability
                                           duration ms
                                                              energy
      count
              2017.000000
                            2017.000000
                                          2.017000e+03
                                                        2017.000000
      mean
                 0.187590
                                0.618422
                                          2.463062e+05
                                                           0.681577
      std
                 0.259989
                                0.161029 8.198181e+04
                                                           0.210273
     min
                 0.000003
                                0.122000
                                          1.604200e+04
                                                           0.014800
      25%
                 0.009630
                               0.514000
                                          2.000150e+05
                                                           0.563000
      50%
                                0.631000
                                          2.292610e+05
                 0.063300
                                                           0.715000
      75%
                 0.265000
                                0.738000
                                          2.703330e+05
                                                           0.846000
                 0.995000
                               0.984000 1.004627e+06
      max
                                                           0.998000
             instrumentalness
                                                liveness
                                                              loudness
                                        key
                                                                               mode
      count
                  2017.000000
                              2017.000000
                                             2017.000000 2017.000000
                                                                        2017.000000
```

2017 non-null

int64

2

mean	0.13	3286 5.3	42588	0.190844	1 -7.08562	4 0.612295
std	0.27	3162 3.6	48240	0.155453	3.76168	4 0.487347
min	0.00	0.00	00000	0.018800	-33.09700	0.000000
25%	0.00	0000 2.0	00000	0.092300	-8.39400	0.000000
50%	0.00	0076 6.0	00000	0.127000	-6.24800	0 1.000000
75%	0.05	4000 9.0	00000	0.247000	-4.74600	0 1.000000
max	0.97	6000 11.0	00000	0.969000	-0.30700	0 1.000000
	speechiness	tempo	time_	signature	valence	target
count	2017.000000	2017.000000	20	17.000000	2017.000000	2017.000000
mean	0.092664	121.603272		3.968270	0.496815	0.505702
std	0.089931	26.685604		0.255853	0.247195	0.500091
min	0.023100	47.859000		1.000000	0.034800	0.000000
25%	0.037500	100.189000		4.000000	0.295000	0.000000
50%	0.054900	121.427000		4.000000	0.492000	1.000000
75%	0.108000	137.849000		4.000000	0.691000	1.000000
max	0.816000	219.331000		5.000000	0.992000	1.000000

0.3 Data Analysis

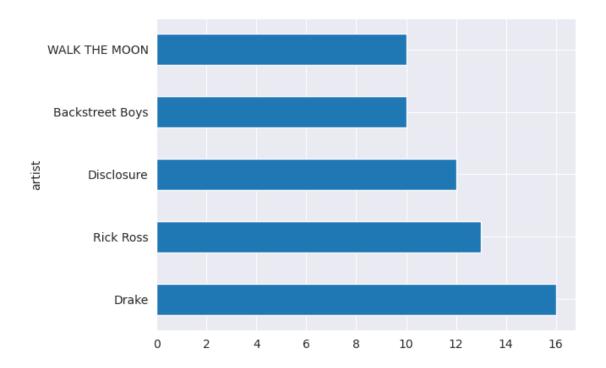
0.3.1 Top 5 most popular artists

[13]: artist

Drake 16
Rick Ross 13
Disclosure 12
Backstreet Boys 10
WALK THE MOON 10

Name: song_title, dtype: int64

[14]: top_five_artists.plot.barh()
plt.show()



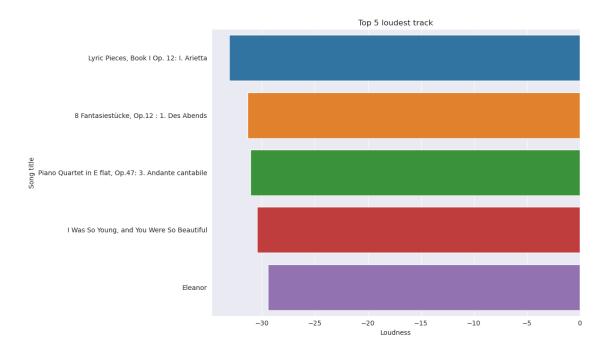
0.4 Top 5 loudest tracks

```
[15]: top_five_loudest_tracks = df[["loudness", "song_title"]].sort_values(by = \text{"loudness", ascending = True)[:5]} top_five_loudest_tracks
```

```
[15]:
            loudness
                                                              song_title
      1594
            -33.097
                                Lyric Pieces, Book I Op. 12: I. Arietta
      1596
             -31.367
                                8 Fantasiestücke, Op.12 : 1. Des Abends
             -31.082 Piano Quartet in E flat, Op.47: 3. Andante can...
      1598
             -30.447
                              I Was So Young, and You Were So Beautiful
      1531
      1549
             -29.460
                                                                 Eleanor
```

```
[16]: plt.figure(figsize = (12,7))
    sns.barplot(x ="loudness", y = "song_title", data = top_five_loudest_tracks )
    plt.title("Top 5 loudest track")
    plt.xlabel("Loudness")
    plt.ylabel("Song title")
    plt.tight_layout()
    plt.savefig("top_five_loudest_tracks.png")
    plt.show()

#More negative in values means the loudest
```



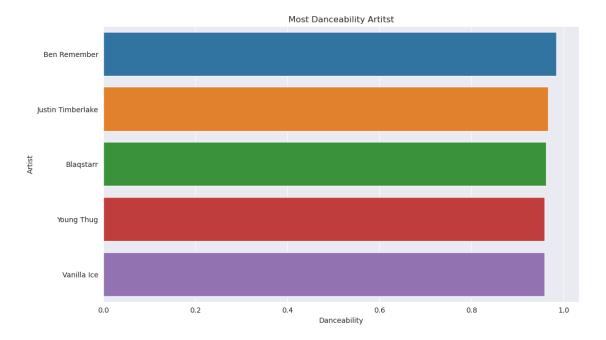
0.5 Artist with the most danceability song

```
[17]: top_five_artists_danceable_songs = df[["danceability", "song_title", "artist"]].

sort_values(by = "danceability", ascending = False)[:5]

top_five_artists_danceable_songs
```

```
Γ17]:
            danceability
                                      song_title
                                                              artist
      1433
                   0.984 Flashwind - Radio Edit
                                                        Ben Remember
      1901
                   0.967
                                        SexyBack Justin Timberlake
      604
                   0.962
                               Check Me Out Like
                                                           Blaqstarr
      32
                   0.959
                                     Best Friend
                                                          Young Thug
      1957
                   0.959
                                    Ice Ice Baby
                                                         Vanilla Ice
```



0.6 Top 10 instrumental tracks

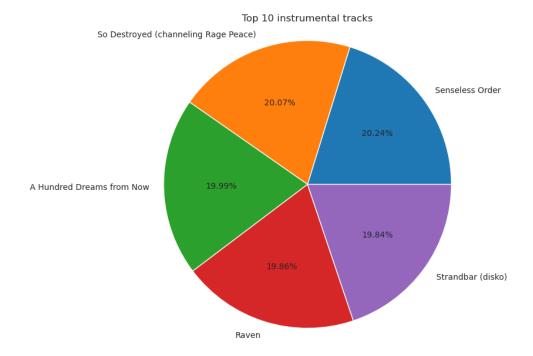
```
[19]: top_ten_instrumental_tracks = df[["instrumentalness", "song_title", "artist"]].

sort_values(by = "instrumentalness", ascending = False)[:5]

top_ten_instrumental_tracks
```

```
[19]:
                                                         song_title \
            instrumentalness
      1313
                       0.976
                                                    Senseless Order
      271
                       0.968
                              So Destroyed (channeling Rage Peace)
      1575
                       0.964
                                          A Hundred Dreams from Now
      1619
                       0.958
                                                               Raven
      725
                       0.957
                                                  Strandbar (disko)
                        artist
            Signs of the Swarm
      1313
      271
                   Prince Rama
      1575
                    Ray Bryant
      1619
                 John Dahlbäck
      725
                    Todd Terje
```

plt.show()

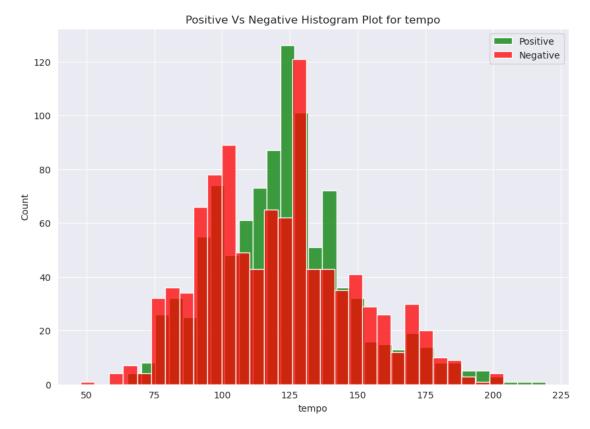


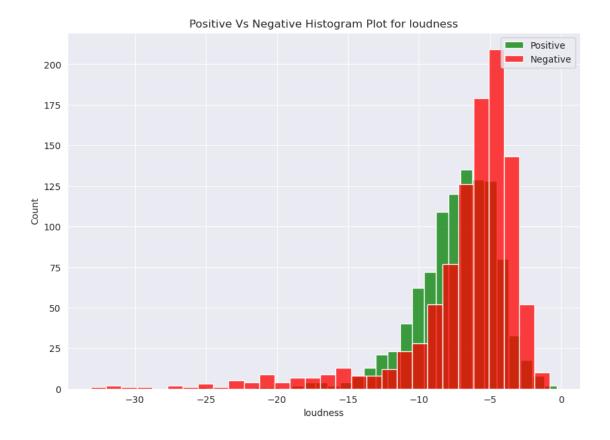
0.7 Multiple feature Plots

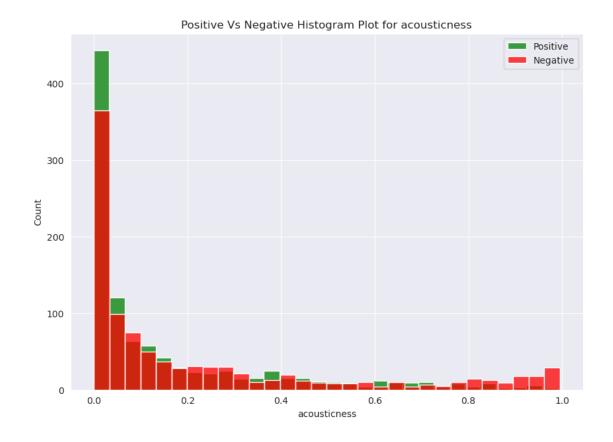
```
sns.histplot(positive_data, bins = 30, label = "Positive", color = "green")
#Giving features
sns.histplot(negative_data, bins = 30, label = "Negative", color = "red")

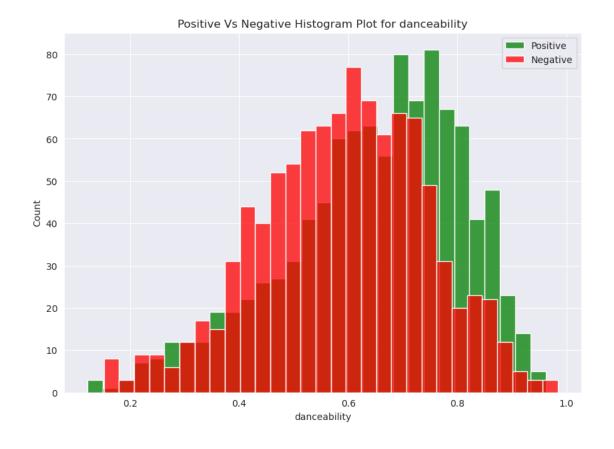
#sns.distplot(positive_data, bins = 30, label = "Positive", color =
""green",kde=True) #Giving features
#sns.distplot(negative_data, bins = 30, label = "Negative", color =
""red",kde=True)

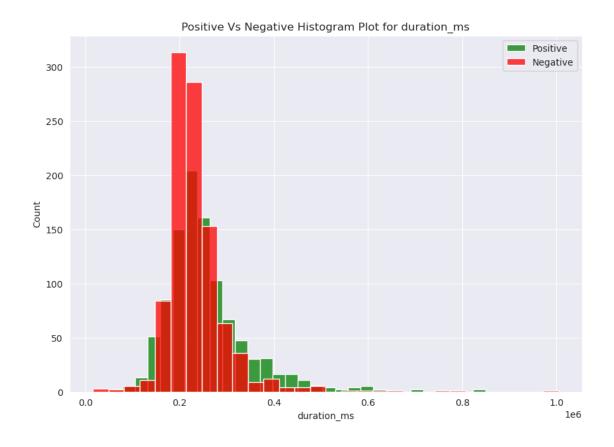
#Decorating the figures/Graphs
plt.legend(loc = "upper right")
plt.title(f"Positive Vs Negative Histogram Plot for {feature_col}")
plt.show()
```

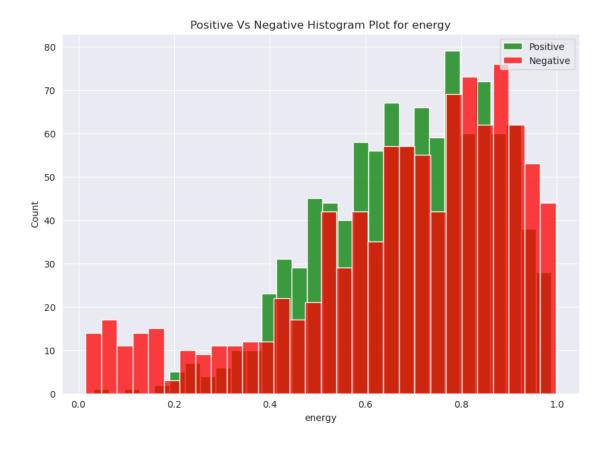


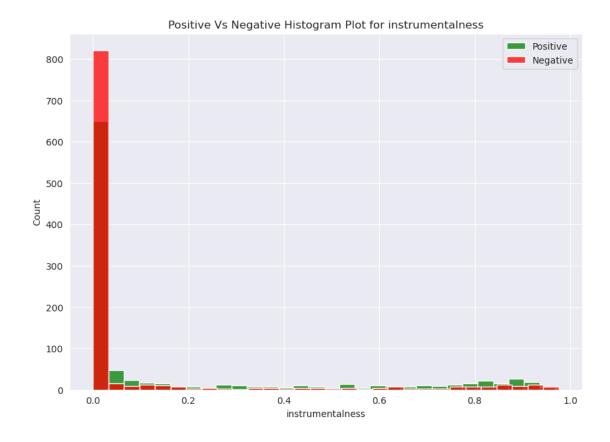


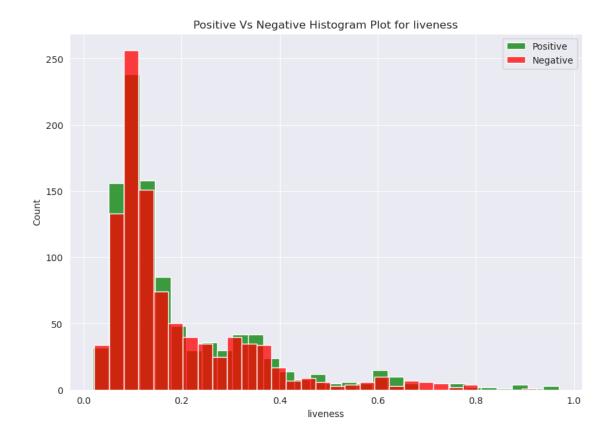


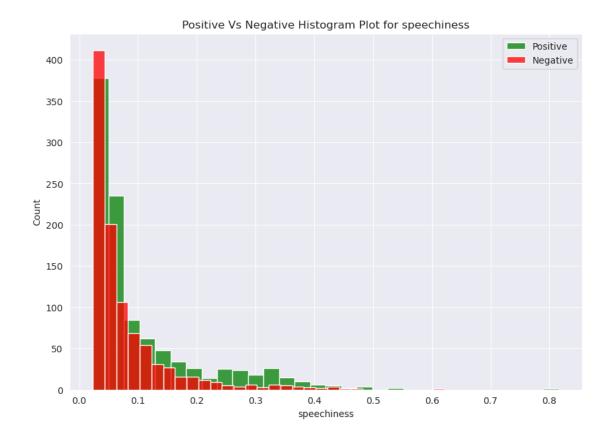


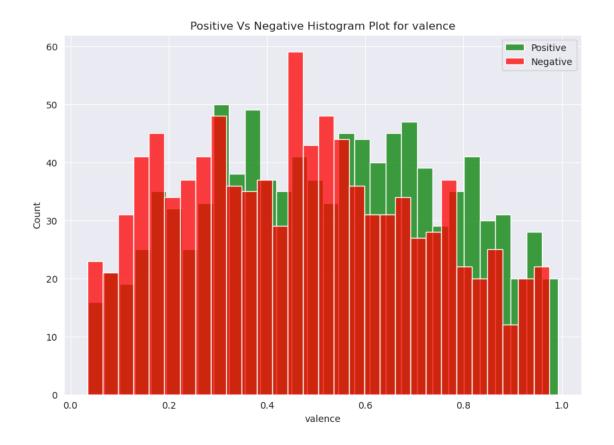












0.8 Most Trending Genre

```
[24]: df.columns
[24]: Index(['acousticness', 'danceability', 'duration_ms', 'energy',
             'instrumentalness', 'key', 'liveness', 'loudness', 'mode',
             'speechiness', 'tempo', 'time_signature', 'valence', 'target',
             'song_title', 'artist'],
            dtype='object')
[25]: Most_trending_genre = df[["artist", "song_title"]].sort_values(by = "artist", "
       ⇒ascending = True)[:5]
      Most_trending_genre
[25]:
                                                            song_title
            artist
      388
               !!!
                                                                 Slyd
      1739
           *NSYNC
                                                  Pop - Radio Version
      1740
                                     Tearin' up My Heart - Radio Edit
           *NSYNC
      1738 *NSYNC
                                         I Want You Back - Radio Edit
      1737 *NSYNC God Must Have Spent a Little More Time on You ...
```

0.9 Top 10 tracks with most valence

plt.title("Top 10 tracks with valence")

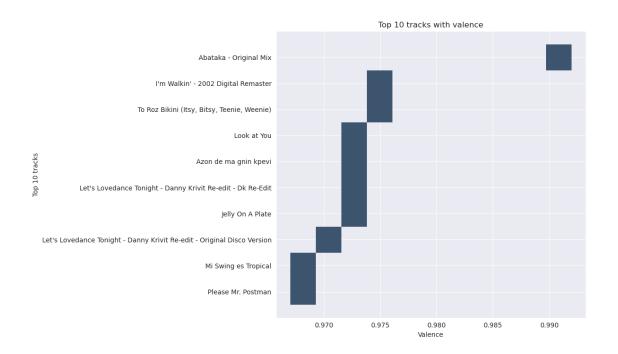
plt.savefig("top_tracks_valence.png")

plt.ylabel("Top 10 tracks")

plt.xlabel("Valence")
plt.tight_layout()

plt.show()

```
[26]: top_tracks_valence = df[["valence", "song_title"]].sort_values(by = "valence", "
       ⇒ascending = False)[:10]
      11 11 11
      Describing the musical positiveness conveyed by a track.
      Tracks with high valence sound more positive (e.g. happy, cheerful, euphoric),,,
       ⇒while tracks with low valence sound more negative (e.g. sad, depressed, ⊔
       \hookrightarrow angry).
      Example value: 0.428
      Range: 0 - 1
      top_tracks_valence
[26]:
            valence
                                                              song_title
      460
              0.992
                                                 Abataka - Original Mix
      912
              0.975
                                    I'm Walkin' - 2002 Digital Remaster
      1966
                            To Roz Bikini (Itsy, Bitsy, Teenie, Weenie)
              0.974
      207
              0.973
                                                             Look at You
      48
              0.973
                                                   Azon de ma gnin kpevi
              0.972 Let's Lovedance Tonight - Danny Krivit Re-edit...
      337
      1590
              0.972
                                                        Jelly On A Plate
      838
              0.971 Let's Lovedance Tonight - Danny Krivit Re-edit...
      497
              0.968
                                                    Mi Swing es Tropical
      112
              0.967
                                                      Please Mr. Postman
[27]: plt.figure(figsize = (12,7))
      sns.histplot(y ="song_title", x = "valence", data = top_tracks_valence)
```



0.10 Top 10 energetic & Least energetic tracks

No Absolution

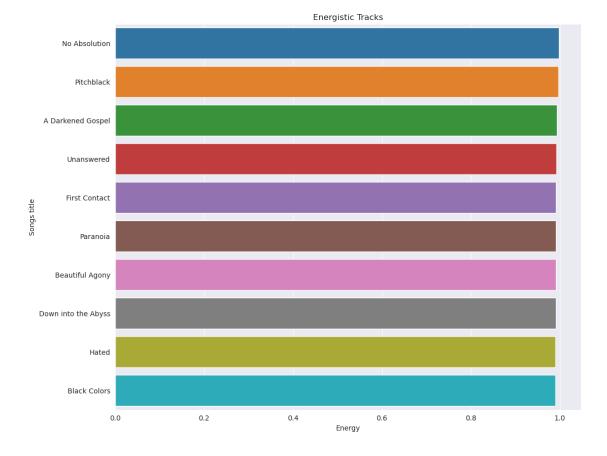
1299

```
[28]: df.columns
[28]: Index(['acousticness', 'danceability', 'duration_ms', 'energy',
             'instrumentalness', 'key', 'liveness', 'loudness', 'mode',
             'speechiness', 'tempo', 'time_signature', 'valence', 'target',
             'song_title', 'artist'],
            dtype='object')
[29]: top_energetic_tracks = df [["song_title", "energy"]].sort_values(by = "energy", ___
       →ascending = False)[:10]
      Energy is a measure from 0.0 to 1.0 and represents a perceptual measure of \Box
       ⇒intensity and activity.
      Typically, energetic tracks feel fast, loud, and noisy. For example, death \sqcup
       smetal has high energy, while a Bach prelude scores low on the scale.
      11 11 11
      top_energetic_tracks
[29]:
                     song_title energy
```

0.998

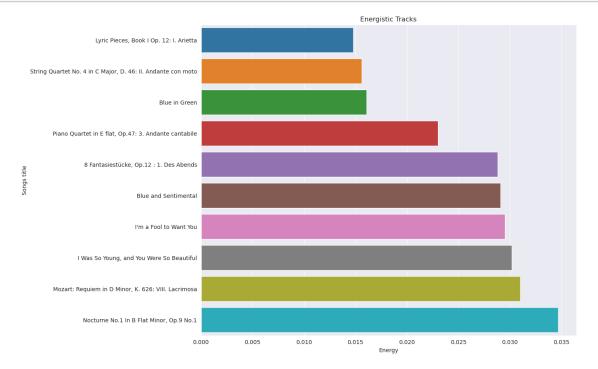
```
1322
                            0.997
               Pitchblack
1297
        A Darkened Gospel
                            0.994
1347
               Unanswered
                            0.993
2015
            First Contact
                            0.992
1680
                 Paranoia
                            0.992
1332
          Beautiful Agony
                            0.992
1328 Down into the Abyss
                            0.991
1681
                    Hated
                            0.990
1296
             Black Colors
                            0.990
```

```
[30]: plt.figure(figsize = (12,10))
    sns.barplot(x = "energy", y = "song_title", data = top_energetic_tracks)
    plt.title('Energistic Tracks')
    plt.xlabel('Energy')
    plt.ylabel('Songs title')
    plt.show()
```



```
[31]:
                                                   song_title energy
                     Lyric Pieces, Book I Op. 12: I. Arietta 0.0148
      1594
      1595 String Quartet No. 4 in C Major, D. 46: II. An... 0.0156
      1537
                                                Blue in Green 0.0161
      1598 Piano Quartet in E flat, Op.47: 3. Andante can... 0.0230
      1596
                      8 Fantasiestücke, Op.12: 1. Des Abends 0.0288
      1545
                                         Blue and Sentimental 0.0291
                                       I'm a Fool to Want You 0.0295
      1530
                    I Was So Young, and You Were So Beautiful 0.0302
      1531
      817
           Mozart: Requiem in D Minor, K. 626: VIII. Lacr... 0.0310
      1876
                     Nocturne No.1 In B Flat Minor, Op.9 No.1 0.0347
[32]: plt.figure(figsize = (12,10))
```





0.11 Danceability Vs Tempo insights

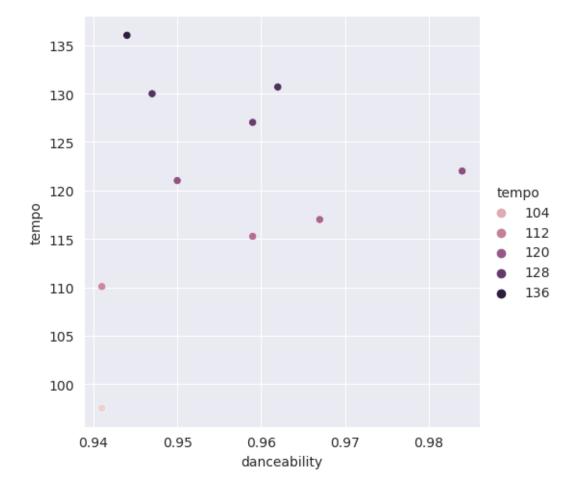
```
[58]:
           danceability
                           tempo
     1433
                  0.984 122.003
     1901
                  0.967 117.000
     604
                  0.962 130.684
     32
                  0.959 127.029
                  0.959 115.266
     1957
     1136
                  0.950 121.019
                  0.947 129.991
     1977
     138
                  0.944 136.019
     623
                  0.941
                         97.524
     1591
                  0.941 110.082
```

```
[66]: sns.relplot(x = df.danceability, y = df.tempo, data = Danceability_insights, u

→hue = "tempo")

# Danceability of the song is high when tempo is between mid range. Higher the tempo lower the danceability
```

[66]: <seaborn.axisgrid.FacetGrid at 0x7f4fc1789210>



	0.12	Thankyou for reading. Happy Coding! (~lamkd99)
[]:		