

In [1]:

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
```

In [2]:

```
tracks = pd.read_csv('C:/Users/Bae/Desktop/4th Semester/Data Science Lab/Datasets/tracks.cs
```

In [3]:

```
tracks.head()
```

Out[3]:

	<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>	
0	35iwgR4jXetl318WEWsa1Q	Carve	6	126903	0	['Uli']	['Uli']
1	021ht4sdgPcrDgSk7JTbKY	Capítulo 2.16 - Banquero Anarquista	0	98200	0	['Fernando Pessoa']	['14jtP
2	07A5yehtSnoedViJAZkNnc	Vivo para Quererte - Remasterizado	0	181640	0	['Ignacio Corsini']	['5LiOo
3	08FmqUhxtLyTn6pAh6bk45	EI Prisionero - Remasterizado	0	176907	0	['Ignacio Corsini']	['5LiOo
4	08y9GfoqCWfOGsKdwojr5e	Lady of the Evening	0	163080	0	['Dick Haymes']	['3BiJ

In [4]:

tracks.head(20)

Out[4]:

	<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
<b>0</b>	35wgR4jXetI318WEWsa1Q	Carve	6	126903	0	['Uli']
<b>1</b>	021ht4sdgPcrDgSk7JTbKY	Capítulo 2.16 - Banquero Anarquista	0	98200	0	['Fernando Pessoa']
<b>2</b>	07A5yehtSnoedViJAZkNnc	Vivo para Quererte - Remasterizado	0	181640	0	['Ignacio Corsini']
<b>3</b>	08FmqUhxtLyTn6pAh6bk45	El Prisionero - Remasterizado	0	176907	0	['Ignacio Corsini']
<b>4</b>	08y9GfoqCWfOGsKdwojr5e	Lady of the Evening	0	163080	0	['Dick Haymes']
<b>5</b>	0BRXJHRNGQ3W4v9frnSfhu	Ave Maria	0	178933	0	['Dick Haymes']
<b>6</b>	0Dd9ImXtAtGwsmsAD69KZT	La Butte Rouge	0	134467	0	['Francis Marty']
<b>7</b>	0IA0Hju8CAgYfV1hwhidBH	La Java	0	161427	0	['Mistinguett']
<b>8</b>	0lgI1UCz84pYeVetnI1IGP	Old Fashioned Girl	0	310073	0	['Greg Fieler']
<b>9</b>	0JV4iqw2ISKJaHBQZ0e5zK	Martín Fierro - Remasterizado	0	181173	0	['Ignacio Corsini']
<b>10</b>	0OYGe21oScKJfanLyM7daU	Capítulo 2.8 - Banquero Anarquista	0	99100	0	['Fernando Pessoa']
<b>11</b>	0PE42H6tsIQuyMMiGRiqtb	Capítulo 2.25 - Banquero Anarquista	0	132700	0	['Fernando Pessoa']
<b>12</b>	0PH9AACae1f957JAavhOl2	Lazy Boi	0	157333	0	['Uli']
<b>13</b>	0QiT0Oo5QdLXdFw6RDOj7h	Tu Verras Montmartre	1	186800	0	['Lucien Boyer']
<b>14</b>	0TWsNj5iSvbMTtbEDP7A4V	Elle Prend L'boulevard Magenta	0	172027	0	['Félix Mayol']
<b>15</b>	0cC9CYjLRlwchQ42xVnq6	Capítulo 1.23 - Banquero Anarquista	0	96600	0	['Fernando Pessoa']
<b>16</b>	0eb1PfHxT6HnXvvdUOzmME	Capítulo 1.18 - Banquero Anarquista	0	103200	0	['Fernando Pessoa']
<b>17</b>	0grXU6GKVNCVMJbseA0Uhe	Capítulo 1.10 - Banquero Anarquista	0	95800	0	['Fernando Pessoa']
<b>18</b>	0kCB1bDVBC8gWCFcnJylZc	Ca C'est Une Chose	0	188000	0	['Victor Boucher']
<b>19</b>	0l3BQsVJ7F76wIN5QhJzaP	El Vendaval - Remasterizado	0	153533	0	['Ignacio Corsini']

In [5]:

```
tracks.shape
```

Out[5]:

```
(586672, 20)
```

In [6]:

```
tracks.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 586672 entries, 0 to 586671
Data columns (total 20 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   id               586672 non-null   object 
 1   name              586601 non-null   object 
 2   popularity        586672 non-null   int64  
 3   duration_ms       586672 non-null   int64  
 4   explicit          586672 non-null   int64  
 5   artists            586672 non-null   object 
 6   id_artists        586672 non-null   object 
 7   release_date       586672 non-null   object 
 8   danceability       586672 non-null   float64
 9   energy             586672 non-null   float64
 10  key               586672 non-null   int64  
 11  loudness          586672 non-null   float64
 12  mode              586672 non-null   int64  
 13  speechiness        586672 non-null   float64
 14  acousticness       586672 non-null   float64
 15  instrumentalness  586672 non-null   float64
 16  liveness           586672 non-null   float64
 17  valence            586672 non-null   float64
 18  tempo              586672 non-null   float64
 19  time_signature     586672 non-null   int64  
dtypes: float64(9), int64(6), object(5)
memory usage: 89.5+ MB
```

In [7]:

```
tracks.groupby ('popularity').size()
```

Out[7]:

```
popularity
0      44690
1      12024
2      9639
3      8154
4      7733
...
96      2
97      2
98      1
99      1
100     1
Length: 101, dtype: int64
```

In [8]:

```
popularity_num=tracks.groupby ('popularity').size()
```

In [9]:

```
popularity_num.tail(30)
```

Out[9]:

```
popularity
71      968
72      846
73      732
74      673
75      571
76      485
77      391
78      314
79      279
80      218
81      158
82      136
83      116
84       91
85       60
86       53
87       38
88       19
89       16
90       12
91       11
92       10
93        2
94        6
95        1
96        2
97        2
98        1
99        1
100       1
dtype: int64
```

In [10]:

tracks.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 586672 entries, 0 to 586671
Data columns (total 20 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   id               586672 non-null   object  
 1   name              586601 non-null   object  
 2   popularity        586672 non-null   int64  
 3   duration_ms       586672 non-null   int64  
 4   explicit          586672 non-null   int64  
 5   artists            586672 non-null   object  
 6   id_artists        586672 non-null   object  
 7   release_date       586672 non-null   object  
 8   danceability       586672 non-null   float64 
 9   energy             586672 non-null   float64 
 10  key               586672 non-null   int64  
 11  loudness          586672 non-null   float64 
 12  mode               586672 non-null   int64  
 13  speechiness        586672 non-null   float64 
 14  acousticness       586672 non-null   float64 
 15  instrumentalness  586672 non-null   float64 
 16  liveness           586672 non-null   float64 
 17  valence            586672 non-null   float64 
 18  tempo               586672 non-null   float64 
 19  time_signature     586672 non-null   int64  
dtypes: float64(9), int64(6), object(5)
memory usage: 89.5+ MB
```

In [11]:

tracks.describe()

Out[11]:

	popularity	duration_ms	explicit	danceability	energy	key
count	586672.000000	5.866720e+05	586672.000000	586672.000000	586672.000000	586672.000000
mean	27.570053	2.300512e+05	0.044086	0.563594	0.542036	5.221600
std	18.370642	1.265261e+05	0.205286	0.166103	0.251923	3.519410
min	0.000000	3.344000e+03	0.000000	0.000000	0.000000	0.000000
25%	13.000000	1.750930e+05	0.000000	0.453000	0.343000	2.000000
50%	27.000000	2.148930e+05	0.000000	0.577000	0.549000	5.000000
75%	41.000000	2.638670e+05	0.000000	0.686000	0.748000	8.000000
max	100.000000	5.621218e+06	1.000000	0.991000	1.000000	11.000000

In [12]:

```
tracks.isnull().sum()
```

Out[12]:

```
id          0  
name        71  
popularity  0  
duration_ms 0  
explicit    0  
artists     0  
id_artists  0  
release_date 0  
danceability 0  
energy       0  
key          0  
loudness     0  
mode         0  
speechiness  0  
acousticness 0  
instrumentalness 0  
liveness     0  
valence      0  
tempo         0  
time_signature 0  
dtype: int64
```

In [13]:

```
tracks=tracks.dropna(axis=0)
```

In [14]:

```
tracks.isnull().sum()
```

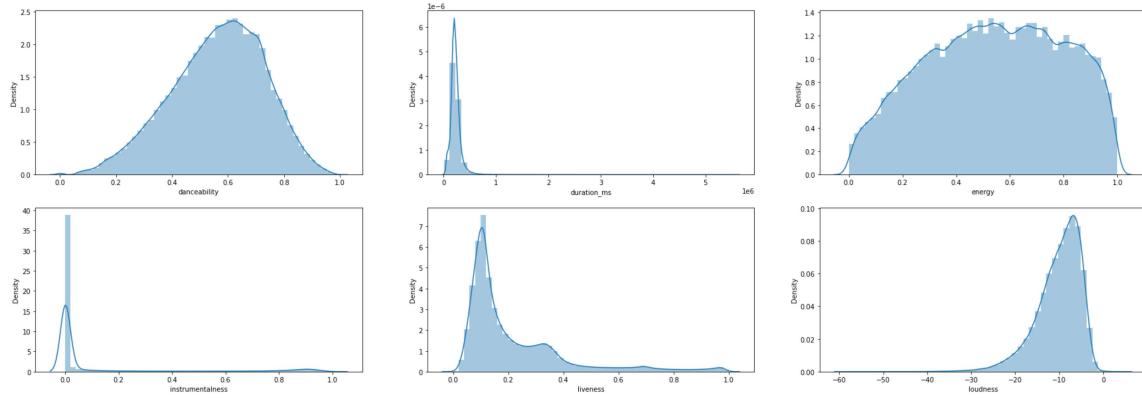
Out[14]:

```
id          0
name        0
popularity 0
duration_ms 0
explicit    0
artists     0
id_artists 0
release_date 0
danceability 0
energy      0
key         0
loudness    0
mode        0
speechiness 0
acousticness 0
instrumentalness 0
liveness    0
valence     0
tempo       0
time_signature 0
dtype: int64
```

In [15]:

```
plt.figure(figsize = (30, 10))
plt.subplot(231)
sns.distplot(tracks['danceability'])
plt.subplot(232)
sns.distplot(tracks['duration_ms'])
plt.subplot(233)
sns.distplot(tracks['energy'])
plt.subplot(234)
sns.distplot(tracks['instrumentalness'])
plt.subplot(235)
sns.distplot(tracks['liveness'])
plt.subplot(236)
sns.distplot(tracks['loudness'])
plt.show()
```

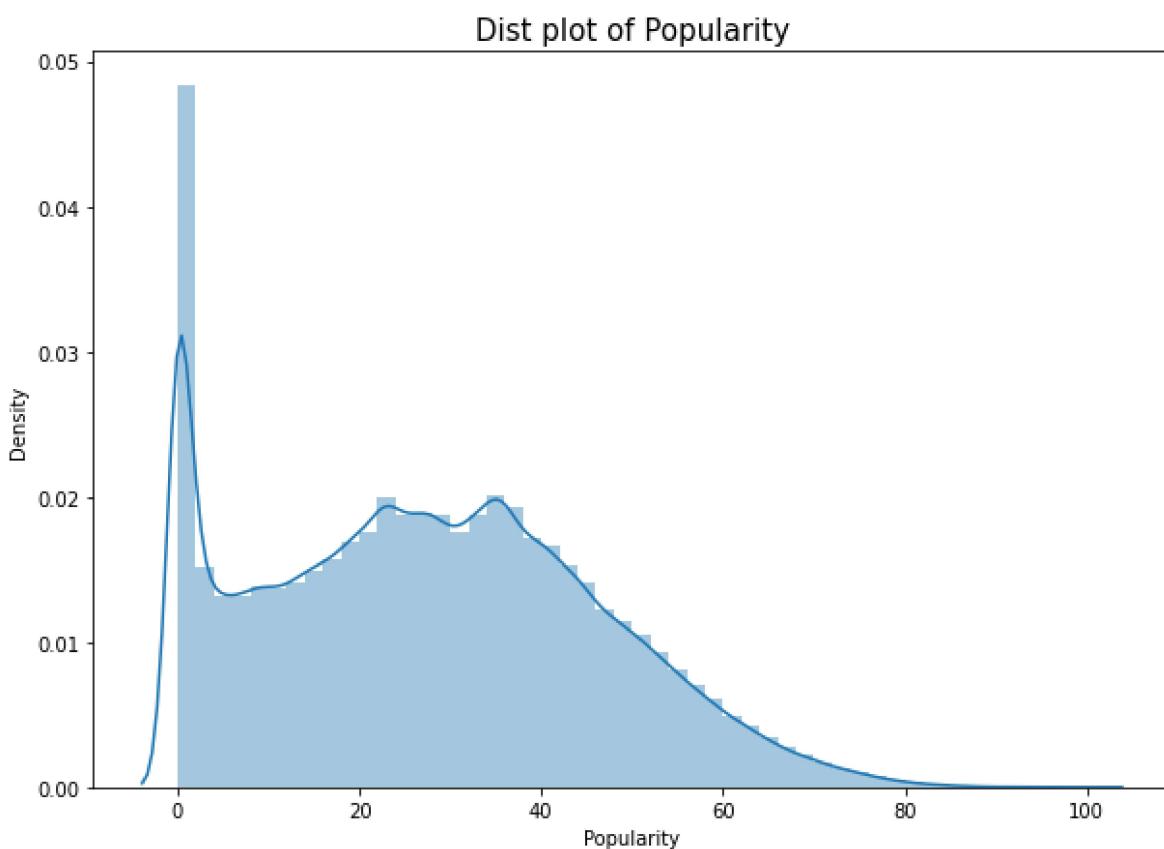
```
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\distributions.py:2557: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).
    warnings.warn(msg, FutureWarning)
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\distributions.py:2557: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).
    warnings.warn(msg, FutureWarning)
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\distributions.py:2557: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).
    warnings.warn(msg, FutureWarning)
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\distributions.py:2557: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).
    warnings.warn(msg, FutureWarning)
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\distributions.py:2557: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).
    warnings.warn(msg, FutureWarning)
```



In [16]:

```
plt.figure(figsize = (10, 7))
sns.distplot(tracks.popularity)
plt.title("Dist plot of Popularity", fontdict = {'fontsize' : 15})
plt.xlabel('Popularity')
plt.show()
```

c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\distributions.py:2557: FutureWarning: `distplot` is a deprecated function and will be removed in a future version. Please adapt your code to use either `displot` (a figure-level function with similar flexibility) or `histplot` (an axes-level function for histograms).  
warnings.warn(msg, FutureWarning)

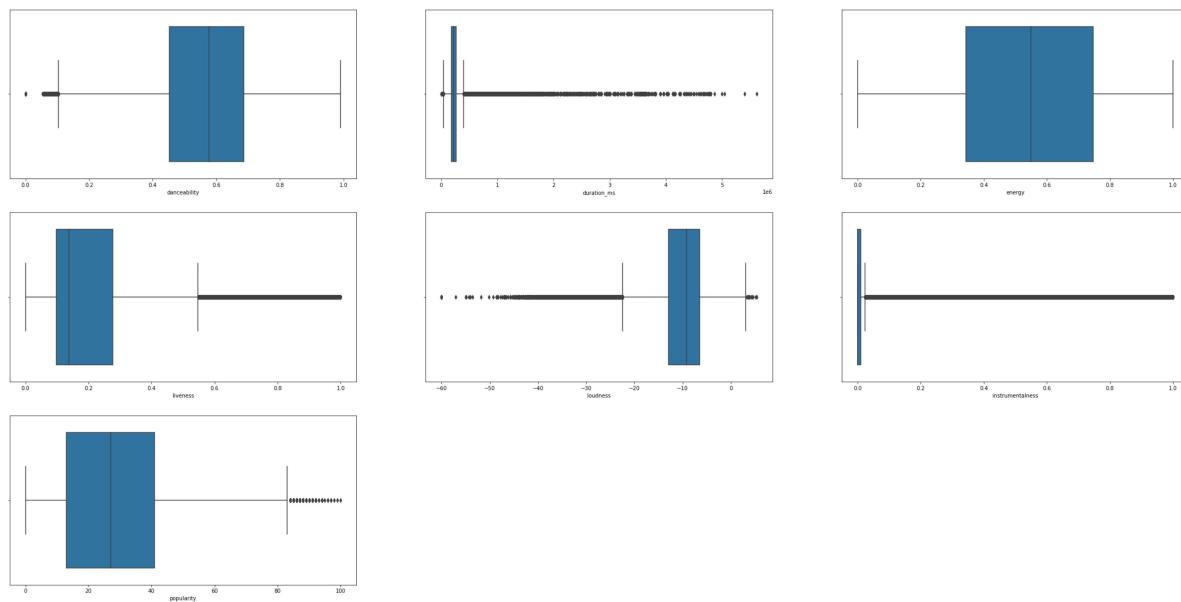


In [17]:

```
plt.figure(figsize = (40, 20))
plt.subplot(331)
sns.boxplot(tracks[ 'danceability' ])
plt.subplot(332)
sns.boxplot(tracks[ 'duration_ms' ])
plt.subplot(333)
sns.boxplot(tracks[ 'energy' ])
plt.subplot(334)
sns.boxplot(tracks[ 'liveness' ])
plt.subplot(335)
sns.boxplot(tracks[ 'loudness' ])
plt.subplot(336)
sns.boxplot(tracks[ 'instrumentalness' ])
plt.subplot(337)
sns.boxplot(tracks[ 'popularity' ])
plt.show()
```

```
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\_decorators.py:36: FutureWarning: Pass the following variable as a key word arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
    warnings.warn(
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\_decorators.py:36: FutureWarning: Pass the following variable as a key word arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
    warnings.warn(
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\_decorators.py:36: FutureWarning: Pass the following variable as a key word arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
    warnings.warn(
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\_decorators.py:36: FutureWarning: Pass the following variable as a key word arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
    warnings.warn(
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\_decorators.py:36: FutureWarning: Pass the following variable as a key word arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
    warnings.warn(
c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\_decorators.py:36: FutureWarning: Pass the following variable as a key word arg: x. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.
```

t in an error or misinterpretation.  
 warnings.warn(



In [18]:

```
print(tracks.groupby('artists').size().sort_values(ascending=False))
```

artists	
['Die drei ???']	3856
['TKKG Retro-Archiv']	2006
['Benjamin Blümchen']	1503
['Bibi Blocksberg']	1472
['Lata Mangeshkar']	1373
...	
['Jess Penner']	1
['Jess Ingerslev', 'Tritonus Koret']	1
['Jess Ingerslev', 'Bendt Reiner', 'Niels Weyde', 'Tritonus Koret']	1
['Jess Glynne', 'Jonas Blue']	1
['최진희']	
1	

Length: 114029, dtype: int64

In [19]:

```

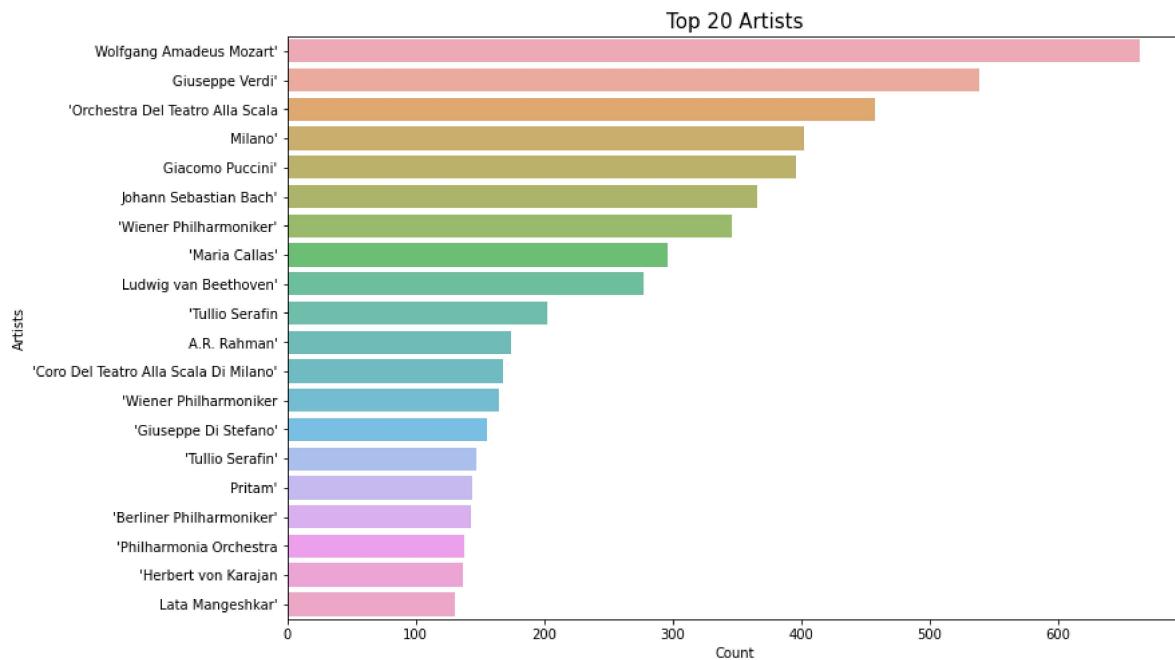
l = []
for i in tracks.artists:
    a=i[2:-2]
    l.append(a)
l = list(set(l))
lst = []
for i in l:
    res = i.strip('][').split(', ')
    lst.append(res)
d=[]
for i in lst:
    for j in i:
        d.append(j)
dff=pd.DataFrame(d)
dff = dff[0].value_counts()

dff = dff[:20, ]
plt.figure(figsize = (12, 8))
sns.barplot(dff.values, dff.index, alpha = 0.8)
plt.title("Top 20 Artists", fontdict = {'fontsize' : 15})
plt.ylabel("Artists")
plt.xlabel("Count")
plt.show()

```

c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\\_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
```



In [20]:

```
tracks.head()
```

Out[20]:

	<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
0	35iwgR4jXetl318WEWsa1Q	Carve	6	126903	0	['Ulí']
1	021ht4sdgPcrDgSk7JTbKY	Capítulo 2.16 - Banquero Anarquista	0	98200	0	['Fernando Pessoa']
2	07A5yehtSnoedViJAZkNnc	Vivo para Quererte - Remasterizado	0	181640	0	['Ignacio Corsini']
3	08FmqUhxtLyTn6pAh6bk45	EI Prisionero - Remasterizado	0	176907	0	['Ignacio Corsini']
4	08y9GfoqCWfOGsKdwojr5e	Lady of the Evening	0	163080	0	['Dick Haymes']

In [21]:

```
tracks['release_date'] = pd.to_datetime(tracks['release_date'])
```

In [22]:

```
tracks.head()
```

Out[22]:

	<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
0	35iwgR4jXetl318WEWsa1Q	Carve	6	126903	0	['Ulí']
1	021ht4sdgPcrDgSk7JTbKY	Capítulo 2.16 - Banquero Anarquista	0	98200	0	['Fernando Pessoa']
2	07A5yehtSnoedViJAZkNnc	Vivo para Quererte - Remasterizado	0	181640	0	['Ignacio Corsini']
3	08FmqUhxtLyTn6pAh6bk45	EI Prisionero - Remasterizado	0	176907	0	['Ignacio Corsini']
4	08y9GfoqCWfOGsKdwojr5e	Lady of the Evening	0	163080	0	['Dick Haymes']

In [23]:

```
tracks['year']=tracks['release_date'].dt.year
```

In [24]:

tracks.head()

Out[24]:

	<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
0	35iwgR4jXetl318WEWsa1Q	Carve	6	126903	0	['Ulí']
1	021ht4sdgPcrDgSk7JTbKY	Capítulo 2.16 - Banquero Anarquista	0	98200	0	['Fernando Pessoa']
2	07A5yehtSnoedViJAZkNnc	Vivo para Quererete - Remasterizado	0	181640	0	['Ignacio Corsini']
3	08FmqUhxtLyLTn6pAh6bk45	El Prisionero - Remasterizado	0	176907	0	['Ignacio Corsini']
4	08y9GfoqCWfOGsKdwojr5e	Lady of the Evening	0	163080	0	['Dick Haymes']

5 rows × 21 columns



In [25]:

```
latesttracks = tracks[tracks['year'] > 2016]

latesttracks.head()
```

Out[25]:

			<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
39511	6Pkt6qVikqPBt9bEQy8iTz			A Lover's Concerto	41	159560	0	['The Toys']
39529	1hx7X9cMXHWJknb9O6Ava			The September Of My Years - Live At The Sands	26	187333	0	['Frank Sinatra']
39533	19oquivXf3bc65GSqtPYA5S			It Was A Very Good Year - Live At The Sands Ho...	25	236800	0	['Frank Sinatra']
39581	55qyghODi24yaDgKBI6Ix0			The Circle Game - Live at The 2nd Fret, Philad...	18	313093	0	['Joni Mitchell']
39583	00xemFYjQNRpOlPhVaLAHa			Urge For Going - Live at The 2nd Fret, Philade...	18	295093	0	['Joni Mitchell']

5 rows × 21 columns

In [26]:

```
latesttracks.groupby('year').size()
```

Out[26]:

year	
2017	9889
2018	10936
2019	11907
2020	13937
2021	6281
<b>dtype:</b>	<b>int64</b>

In [27]:

```

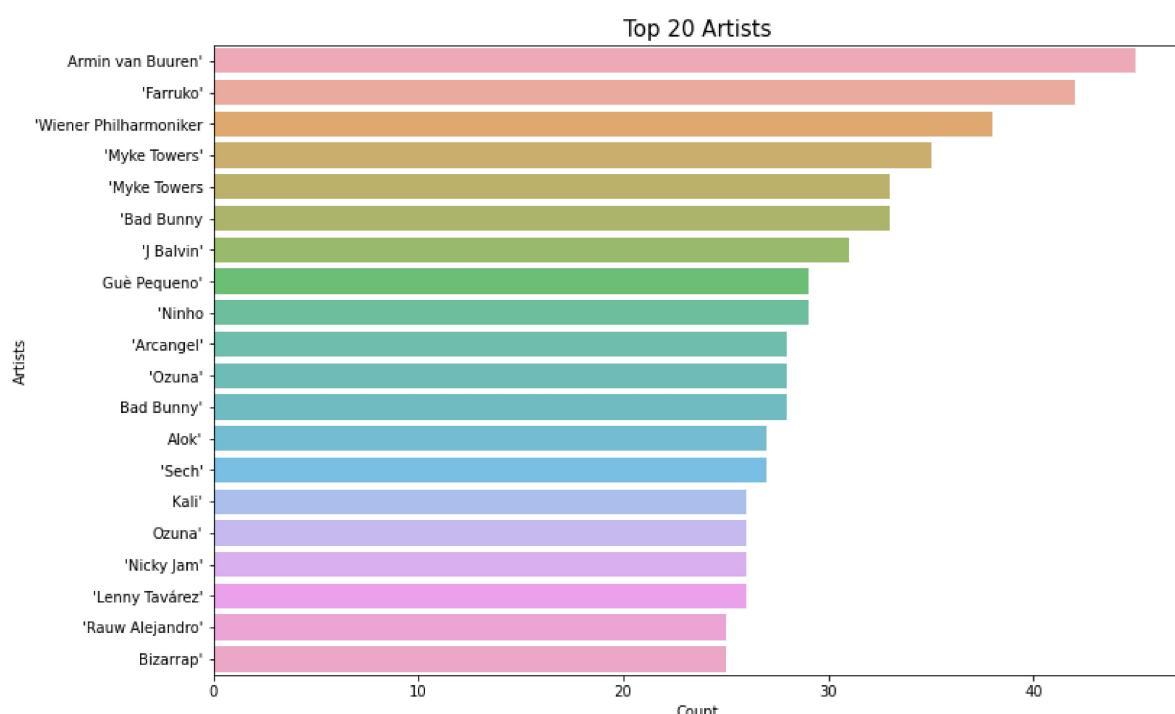
l = []
for i in latesttracks.artists:
    a=i[2:-2]
    l.append(a)
l = list(set(l))
lst = []
for i in l:
    res = i.strip('][').split(', ')
    lst.append(res)
d=[]
for i in lst:
    for j in i:
        d.append(j)
dff=pd.DataFrame(d)
dff = dff[0].value_counts()

dff = dff[:20, ]
plt.figure(figsize = (12, 8))
sns.barplot(dff.values, dff.index, alpha = 0.8)
plt.title("Top 20 Artists", fontdict = {'fontsize' : 15})
plt.ylabel("Artists")
plt.xlabel("Count")
plt.show()

```

c:\users\bae\appdata\local\programs\python\python39\lib\site-packages\seaborn\\_decorators.py:36: FutureWarning: Pass the following variables as keyword args: x, y. From version 0.12, the only valid positional argument will be `data`, and passing other arguments without an explicit keyword will result in an error or misinterpretation.

```
warnings.warn(
```



In [28]:

```
latesttracks.groupby('popularity').size()
```

Out[28]:

```
popularity
0      3984
1      1262
2       900
3       648
4       512
...
96       2
97       2
98       1
99       1
100      1
Length: 101, dtype: int64
```

In [29]:

```
latesttracks.popularity.count()
```

Out[29]:

```
52950
```

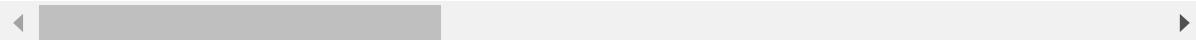
In [30]:

```
popularlatesttracks=latesttracks[latesttracks['popularity'] > 0]
popularlatesttracks.head()
```

Out[30]:

		<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
39511		6Pkt6qVikqPBt9bEQy8iTz	A Lover's Concerto	41	159560	0	['The Toys']
39529		1hx7X9cMXHWJjknb9O6Ava	The September Of My Years - Live At The Sands	26	187333	0	['Frank Sinatra']
39533		19oquivXf3bc65GSqtPYA5S	It Was A Very Good Year - Live At The Sands Ho...	25	236800	0	['Frank Sinatra']
39581		55qyghODi24yaDgKBI6lx0	The Circle Game - Live at The 2nd Fret, Philad...	18	313093	0	['Joni Mitchell']
39583		00xemFYjQNRpOlPhVaLAHa	Urge For Going - Live at The 2nd Fret, Philade...	18	295093	0	['Joni Mitchell']

5 rows × 21 columns



In [31]:

```
popularlatesttracks.count()
```

Out[31]:

```
id           48966  
name         48966  
popularity   48966  
duration_ms  48966  
explicit     48966  
artists      48966  
id_artists   48966  
release_date  48966  
danceability 48966  
energy        48966  
key          48966  
loudness      48966  
mode          48966  
speechiness   48966  
acousticness  48966  
instrumentalness 48966  
liveness      48966  
valence       48966  
tempo          48966  
time_signature 48966  
year          48966  
dtype: int64
```

In [32]:

```
populartracks=tracks[tracks['popularity'] > 0]  
  
populartracks.head()  
populartracks.count()
```

Out[32]:

```
id           541970  
name         541970  
popularity   541970  
duration_ms  541970  
explicit     541970  
artists      541970  
id_artists   541970  
release_date  541970  
danceability 541970  
energy        541970  
key          541970  
loudness      541970  
mode          541970  
speechiness   541970  
acousticness  541970  
instrumentalness 541970  
liveness      541970  
valence       541970  
tempo          541970  
time_signature 541970  
year          541970  
dtype: int64
```

In [33]:

```
popularlatesttracks.groupby('popularity').size()
```

Out[33]:

```
popularity
1      1262
2      900
3      648
4      512
5      478
...
96      2
97      2
98      1
99      1
100     1
Length: 100, dtype: int64
```

In [34]:

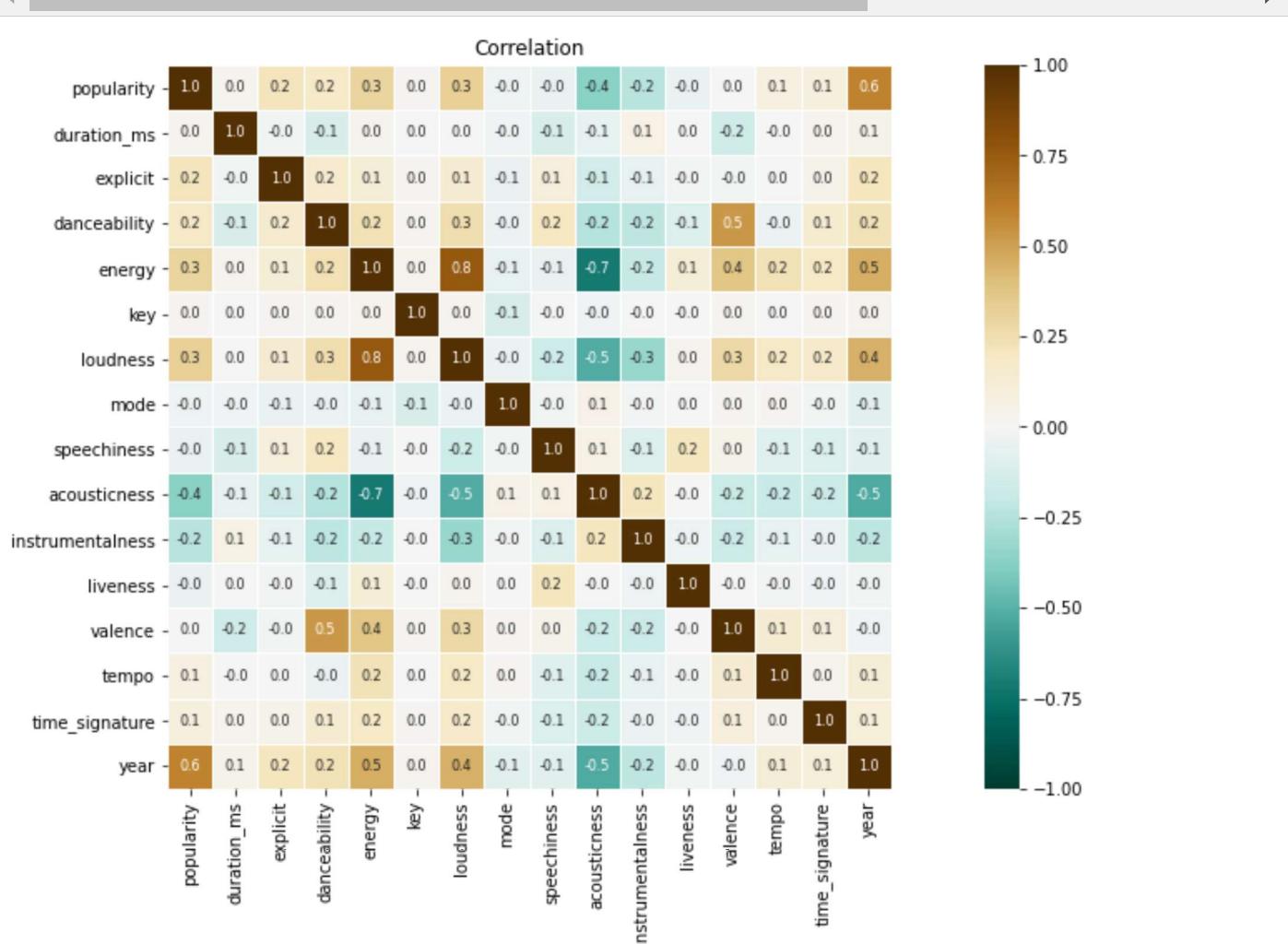
```
populartracks.groupby('popularity').size()
```

Out[34]:

```
popularity
1      12024
2      9634
3      8152
4      7732
5      7730
...
96      2
97      2
98      1
99      1
100     1
Length: 100, dtype: int64
```

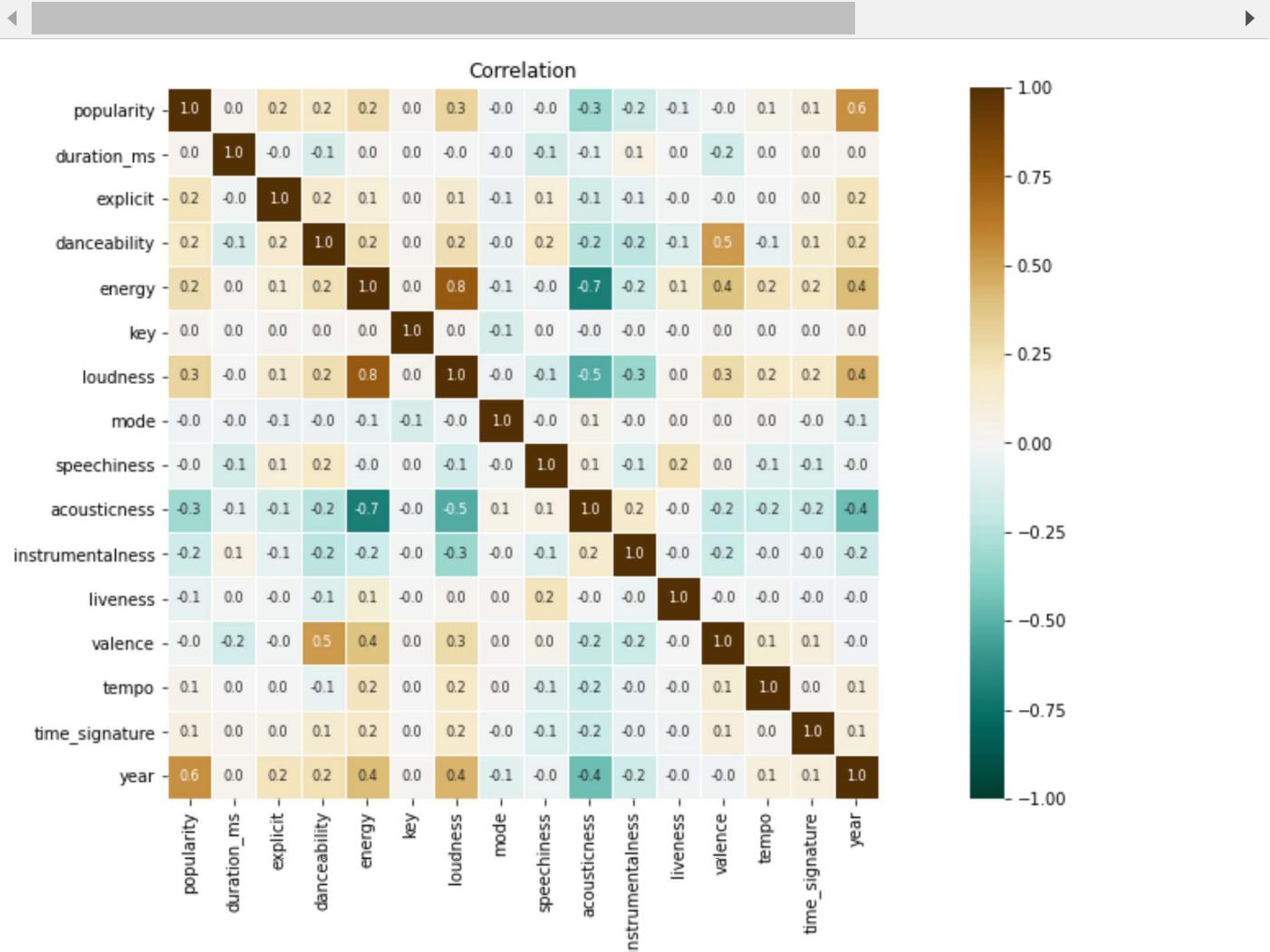
In [35]:

```
corr = tracks.corr()
plt.figure(figsize=(20,8))
sns.heatmap(corr, vmax=1, vmin=-1, center=0, linewidth=.5, square=True, annot = True, annot_kw={"size": 8}, cbar_kw={"shrink": .5}, xticklabels=15, yticklabels=15)
plt.title('Correlation')
plt.show()
```



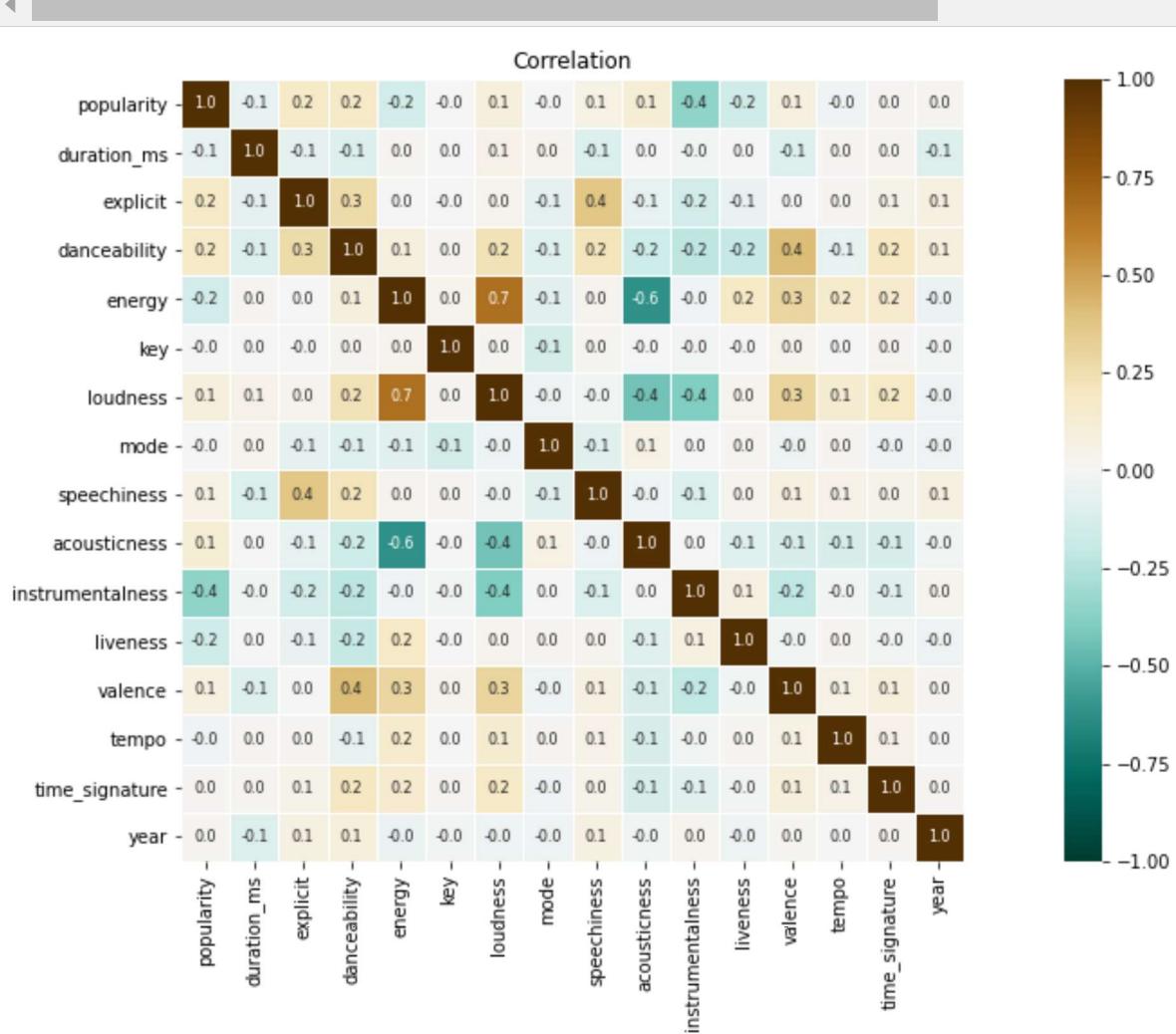
In [36]:

```
corr = populartracks.corr()
plt.figure(figsize=(20,8))
sns.heatmap(corr, vmax=1, vmin=-1, center=0, linewidth=.5, square=True, annot = True, annot_kw={"size": 8}, cbar_kws={"shrink": 0.5})
plt.title('Correlation')
plt.show()
```



In [37]:

```
corr = popularlatesttracks.corr()
plt.figure(figsize=(20,8))
sns.heatmap(corr, vmax=1, vmin=-1, center=0, linewidth=.5, square=True, annot = True, annot_kw={"size": 8}, cbar_kw={"shrink": 0.5})
plt.title('Correlation')
plt.show()
```

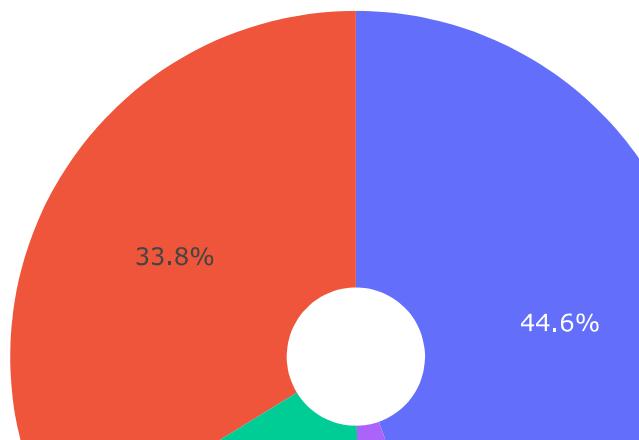


In [38]:

```
import plotly.express as px

def year(yr):
    if yr>1920 and yr<=1945:
        return "Post-Great War"
    if yr>1945 and yr<=1970:
        return "Retro"
    if yr>1970 and yr<=1995:
        return "Modern"
    else:
        return "Post-Modern"
tracks['era'] = tracks['year'].apply(year)
px.pie(data_frame = tracks, names = 'era', hole = 0.2, title = 'Eras of Music')
```

Eras of Music

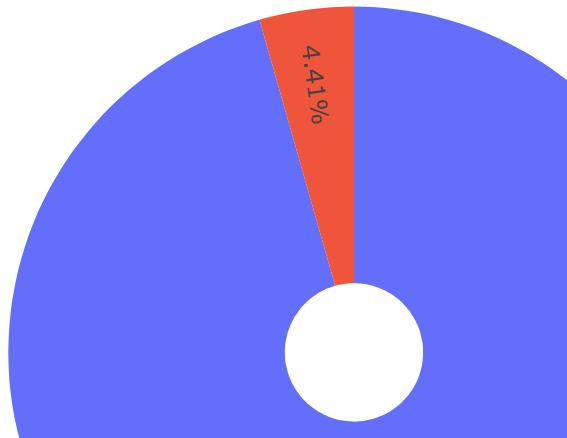


In [39]:

```
def expl(ex):
    if ex == 1:
        return 'Yes'
    else:
        return 'No'

tracks['isExplicit'] = tracks['explicit'].apply(expl)
px.pie(data_frame = tracks, names = 'isExplicit', hole = 0.2, title = 'Explicit')
```

Explicit



In [40]:

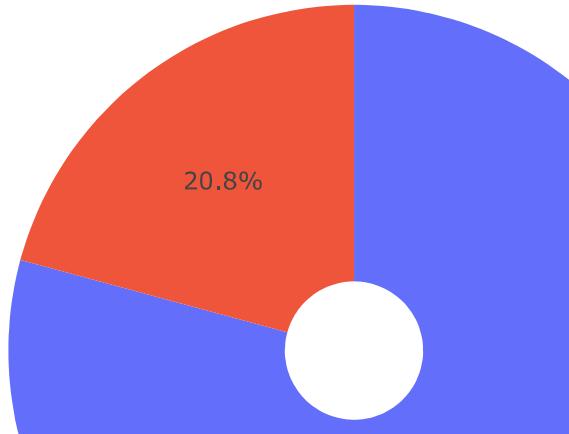
```
latesttracks['isExplicit'] = tracks['explicit'].apply(expl)
px.pie(data_frame = latesttracks, names = 'isExplicit', hole = 0.2, title = 'Explicit')
```

<ipython-input-40-cc4a06656881>:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy) ([https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy))

Explicit



In [41]:

```
popularlatesttracks['isExplicit'] = popularlatesttracks['explicit'].apply(expl)
px.pie(data_frame = popularlatesttracks, names = 'isExplicit', hole = 0.2, title = 'Explicit')
```

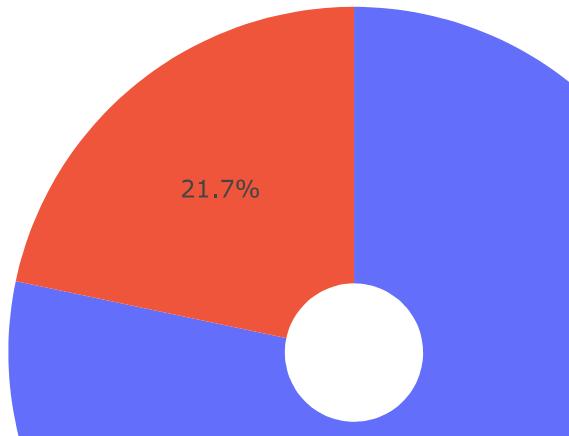
<ipython-input-41-e65aa03eb822>:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.

Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy) ([https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy))

Explicit



In [42]:

```

def loud(row):
    m=popularlatesttracks['loudness'].median()
    sd=popularlatesttracks['loudness'].std()
    if row['loudness']>=m+(1.5*sd):
        return "Extreme"
    elif row['loudness']>=m+(sd):
        return "Very Loud"
    elif row['loudness']>=m+(0.5*sd):
        return "Loud"
    elif row['loudness']>=m-(0.5*sd):
        return "Soft"
    elif row['loudness']>=m-(sd):
        return "Very Soft"
    else:
        return "Mellow"
popularlatesttracks['is_loud']=popularlatesttracks.apply(lambda row: loud(row), axis=1)
px.pie(data_frame = popularlatesttracks, names = 'is_loud', hole = 0.2, title = 'IS LOUD')

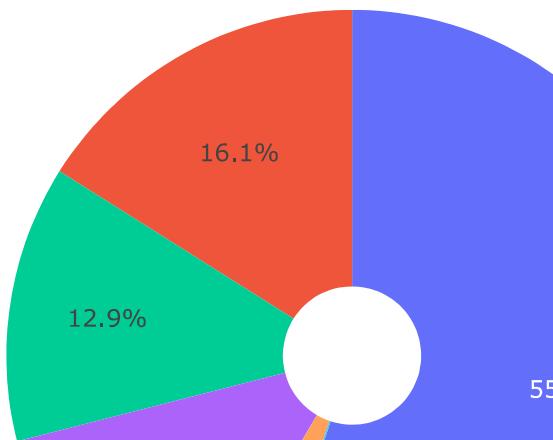
```

&lt;ipython-input-42-05705ead552e&gt;:16: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy) ([https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy))

## IS LOUD



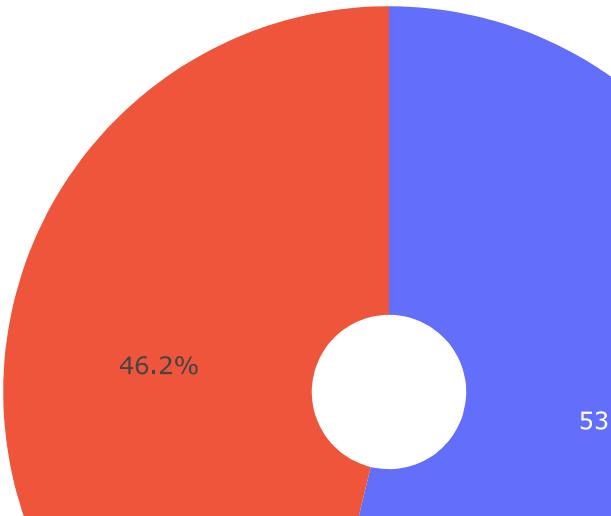
In [43]:

```
def energy(row):
    if row['energy']>=popularlatesttracks['energy'].mean():
        return "High"
    else:
        return "Low"
popularlatesttracks['en_type']=popularlatesttracks.apply(lambda row: energy(row),axis=1)
px.pie(names=popularlatesttracks['en_type'],hole=0.2)
```

<ipython-input-43-a04a82702b0c>:6: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy) ([https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy))



In [44]:

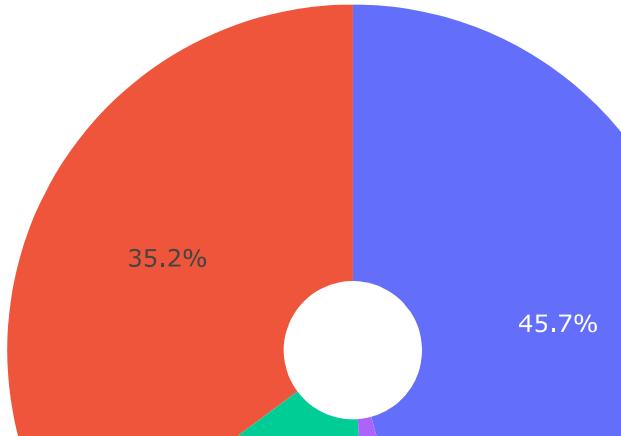
```
def func(df):
    if df > 75:
        return 'Very Popular'
    elif df > 50 and df < 76:
        return 'Popular'
    elif df > 25 and df < 51:
        return 'Average'
    else:
        return 'Not popular'
popularlatesttracks['isPopular'] = popularlatesttracks['popularity'].apply(func)
px.pie(data_frame = popularlatesttracks, names = 'isPopular', hole = 0.2, title = 'Popularity')
```

<ipython-input-44-37419a1483af>:10: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame.  
Try using .loc[row\_indexer,col\_indexer] = value instead

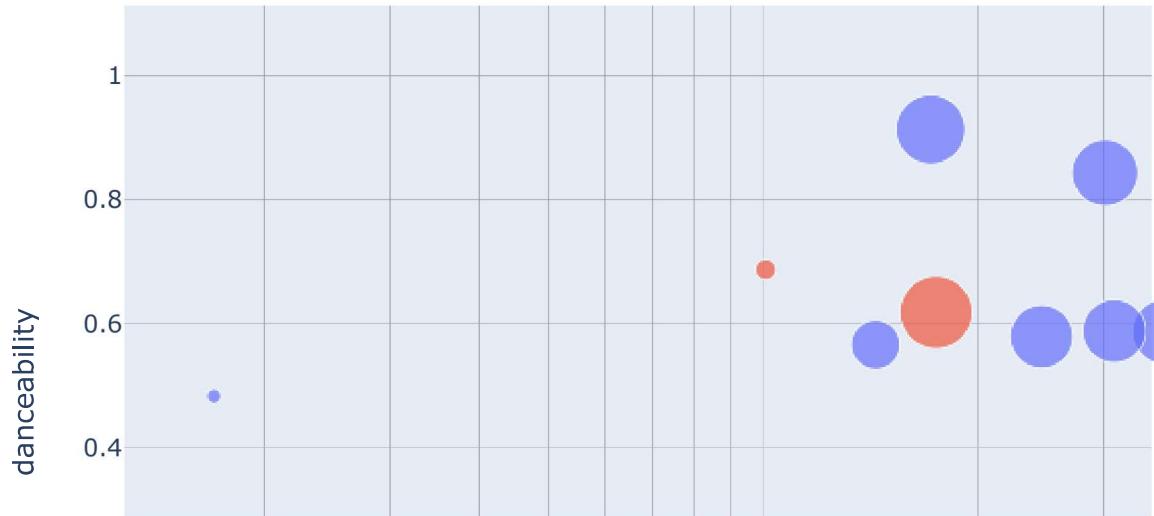
See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy) ([https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy))

## Popularity



In [45]:

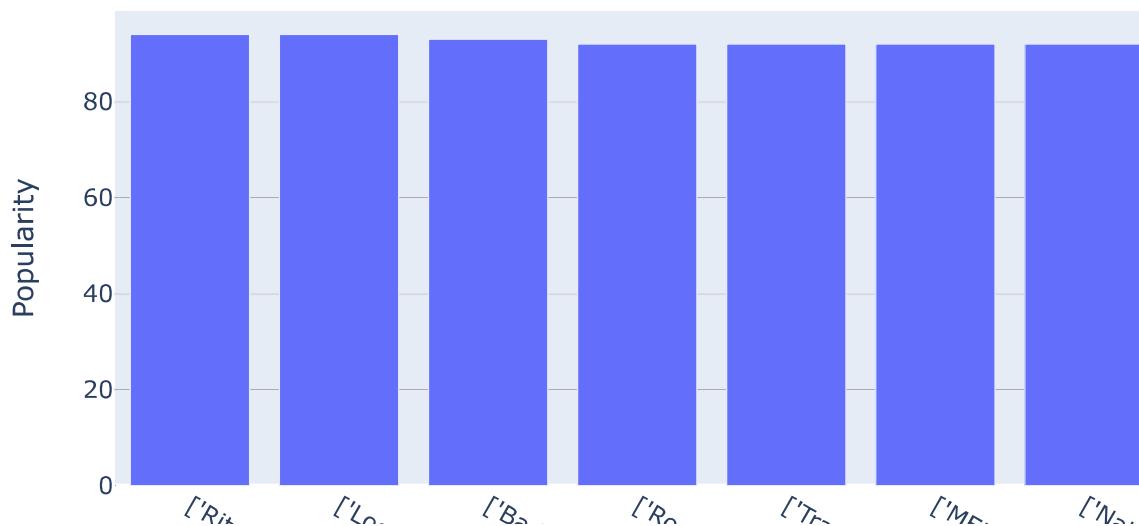
```
fig = px.scatter(popularlatesttracks, x="loudness", y="danceability", size="popularity",
                  color="isExplicit", log_x=True, size_max=30)
fig.show()
```



In [46]:

```
art=latesttracks
n=[]
g=[]
for name, group in art.groupby(['artists'])['popularity']:
    n.append(name)
    g.append(group.mean())
artist_pop=pd.DataFrame(n,g)

artist_pop.columns=['Name']
artist_pop['popularity']=artist_pop.index
artist_pop.sort_values(by='popularity',ascending=False,inplace=True)
px.bar(x=artist_pop['Name'].head(10),y=artist_pop['popularity'].head(10)).update_layout(yax
```



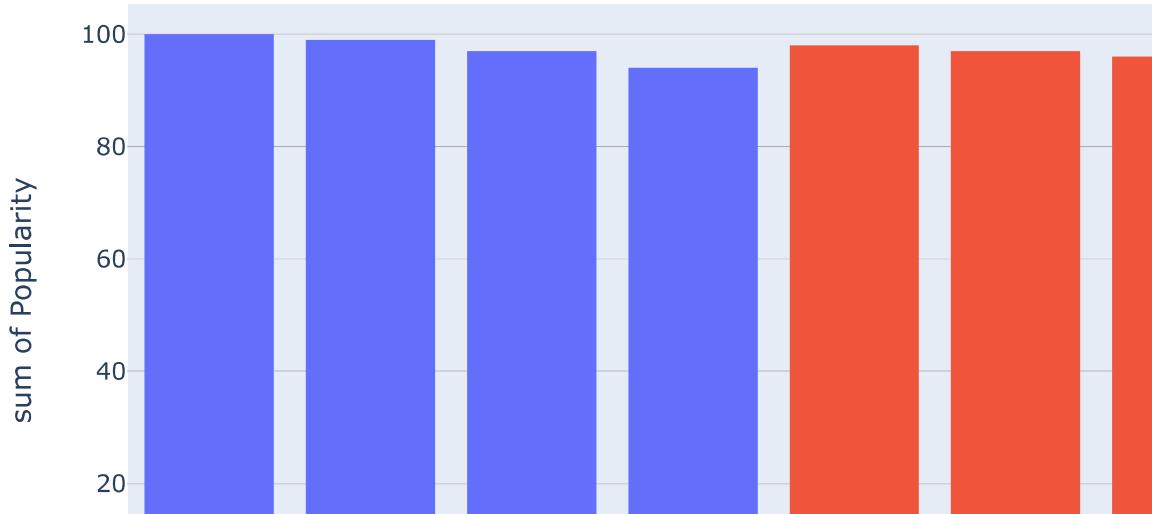
In [47]:

```
latesttracks.sort_values(by='popularity', ascending=False, inplace=True)
dff=latesttracks.head(10)
px.histogram(x=dff.name, y=dff.popularity, color=dff.isExplicit, labels={'x':'Top 10 songs', 'y'}
```

<ipython-input-47-67cd437abf3f>:1: SettingWithCopyWarning:

A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: [https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy) ([https://pandas.pydata.org/pandas-docs/stable/user\\_guide/indexing.html#returning-a-view-versus-a-copy](https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy))



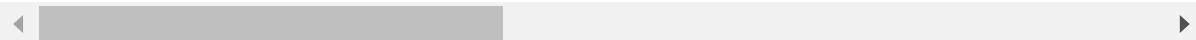
In [48]:

```
isPopular= pd.get_dummies(popularlatesttracks['isPopular'], drop_first=True)
isExplicit= pd.get_dummies(popularlatesttracks['isExplicit'], drop_first=True)
isLoud= pd.get_dummies(popularlatesttracks['is_loud'], drop_first=True)
popularlatesttracks = pd.concat([popularlatesttracks, isPopular, isExplicit, isLoud], axis=1)
popularlatesttracks.head()
```

Out[48]:

		<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
39511		6Pkt6qVikqPBt9bEQy8iTz	A Lover's Concerto	41	159560	0	['The Toys']
			The September Of My Years - Live At The Sands	26	187333	0	['Frank Sinatra']
39529	1hx7X9cMXHWJknb9O6Ava		...				
39533	19oquivXf3bc65GSqtPYA5S		It Was A Very Good Year - Live At The Sands Ho...	25	236800	0	['Frank Sinatra']
39581	55qyghODi24yaDgKBI6Ix0		The Circle Game - Live at The 2nd Fret, Philad...	18	313093	0	['Joni Mitchell']
39583	00xemFYjQNRpOlPhVaLAHa		Urge For Going - Live at The 2nd Fret, Philade...	18	295093	0	['Joni Mitchell']

5 rows × 34 columns



In [49]:

```
popularlatesttracks.head()
```

Out[49]:

		<b>id</b>	<b>name</b>	<b>popularity</b>	<b>duration_ms</b>	<b>explicit</b>	<b>artists</b>
39511		6Pkt6qVikqPBt9bEQy8iTz	A Lover's Concerto	41	159560	0	['The Toys']
39529		1hx7X9cMXHWJknb9O6Ava	The September Of My Years - Live At The Sands	26	187333	0	['Frank Sinatra']
			...				
39533		19oquivXf3bc65GSqtPYA5S	It Was A Very Good Year - Live At The Sands Ho...	25	236800	0	['Frank Sinatra']
39581		55qyghODi24yaDgKBI6Ix0	The Circle Game - Live at The 2nd Fret, Philad...	18	313093	0	['Joni Mitchell']
39583		00xemFYjQNRpOlPhVaLAHa	Urge For Going - Live at The 2nd Fret, Philade...	18	295093	0	['Joni Mitchell']

5 rows × 34 columns

In [50]:

```
popularlatesttracks.drop(['isPopular', 'isExplicit', 'is_loud', 'id', 'name', 'en_type', 'id_
axis = 1, inplace = True)
```

In [51]:

```
popularlatesttracks.head()
```

Out[51]:

	popularity	explicit	danceability	energy	key	loudness	mode	speechiness	acousticness
39511	41	0	0.671	0.867	2	-2.706	1	0.0571	0.4
39529	26	0	0.319	0.201	7	-17.796	1	0.0623	0.1
39533	25	0	0.269	0.129	7	-18.168	0	0.0576	0.1
39581	18	0	0.644	0.212	11	-14.118	1	0.0347	0.1
39583	18	0	0.627	0.184	1	-15.533	1	0.0450	0.1

5 rows × 24 columns



In [52]:

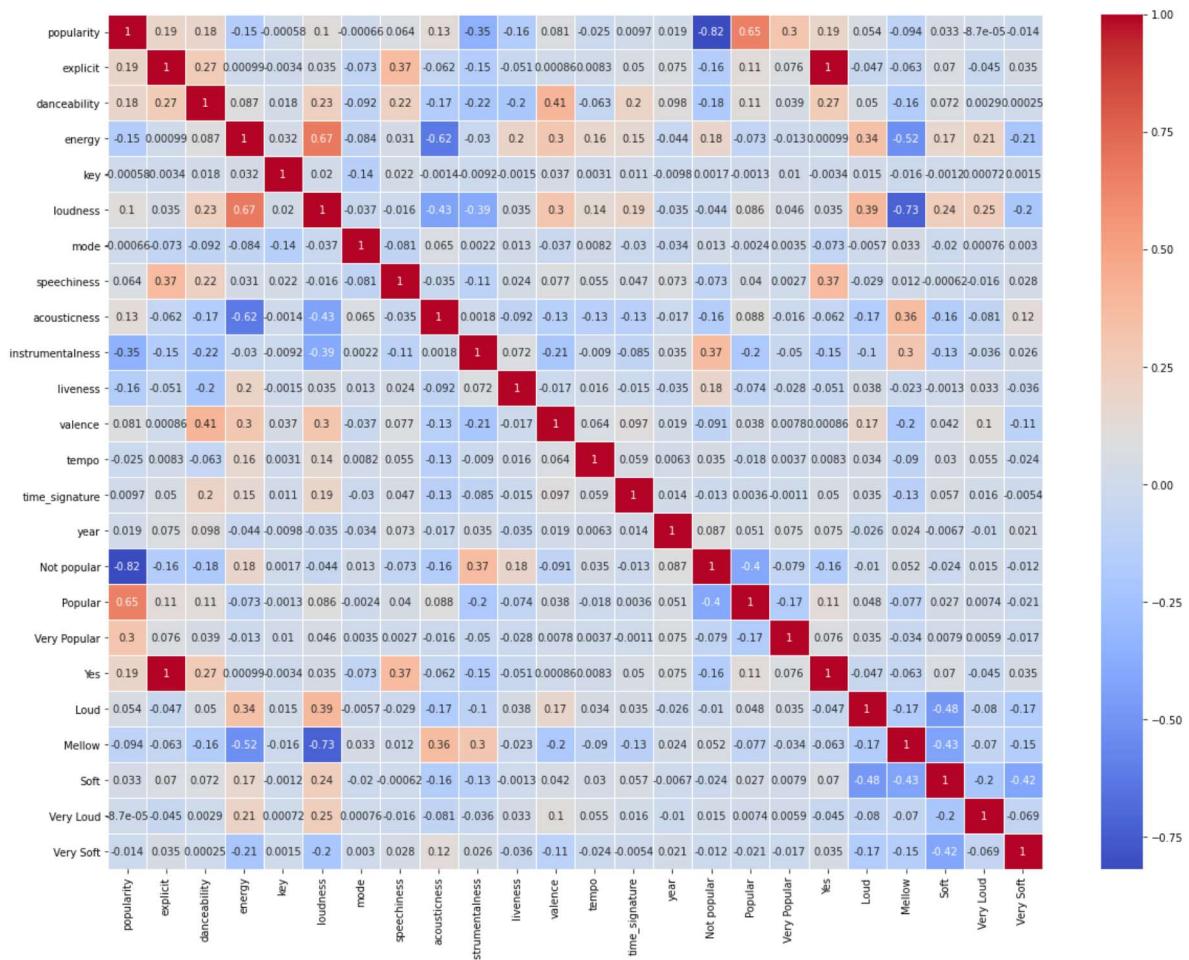
```
popularlatesttracks.columns
```

Out[52]:

```
Index(['popularity', 'explicit', 'danceability', 'energy', 'key', 'loudness',
       'mode', 'speechiness', 'acousticness', 'instrumentalness', 'liveness',
       'valence', 'tempo', 'time_signature', 'year', 'Not popular', 'Popular',
       'Very Popular', 'Yes', 'Loud', 'Mellow', 'Soft', 'Very Loud',
       'Very Soft'],
      dtype='object')
```

In [53]:

```
plt.figure(figsize=(20,15))
sns.heatmap(popularlatesttracks.corr(),linecolor='white',linewidhts=1,cmap='coolwarm',annot=True)
plt.show()
```



In [54]:

```
X= popularlatestracks.loc[:,popularlatestracks.columns!= 'popularity']
y= popularlatestracks.loc[:,popularlatestracks.columns=='popularity']
X.head()
```

Out[54]:

	explicit	danceability	energy	key	loudness	mode	speechiness	acousticness	instrun
39511	0	0.671	0.867	2	-2.706	1	0.0571	0.436	
39529	0	0.319	0.201	7	-17.796	1	0.0623	0.887	
39533	0	0.269	0.129	7	-18.168	0	0.0576	0.938	
39581	0	0.644	0.212	11	-14.118	1	0.0347	0.881	
39583	0	0.627	0.184	1	-15.533	1	0.0450	0.955	

5 rows × 23 columns



In [55]:

```
y.head()
```

Out[55]:

	popularity
39511	41
39529	26
39533	25
39581	18
39583	18

In [56]:

```
from sklearn.preprocessing import StandardScaler
sc_X= StandardScaler()
sc_y= StandardScaler()
X=sc_X.fit_transform(X)
y=sc_y.fit_transform(y)
print(X)
print(y)
```

[[ -0.52616734 0.13316652 1.11410068 ... -1.10598414 5.48179671  
 -0.37903114]  
 [-0.52616734 -2.12145849 -2.19268299 ... -1.10598414 -0.18242194  
 -0.37903114]  
 [-0.52616734 -2.44171772 -2.55017312 ... -1.10598414 -0.18242194  
 -0.37903114]  
 ...  
 [-0.52616734 0.73525388 0.10121199 ... 0.9041721 -0.18242194  
 -0.37903114]  
 [-0.52616734 -0.7379386 -1.6316221 ... -1.10598414 -0.18242194  
 -0.37903114]  
 [-0.52616734 0.29329613 -0.13711476 ... 0.9041721 -0.18242194  
 -0.37903114]]  
 [[-0.25260478]  
 [-0.99588622]  
 [-1.04543832]  
 ...  
 [ 1.28351021]  
 [ 1.18440601]  
 [ 0.58978086]]

In [57]:

```
from sklearn.model_selection import train_test_split
X_train,X_test,y_train,y_test=train_test_split(X,y,test_size=0.25, random_state=0)
```

In [58]:

```
from sklearn.linear_model import LinearRegression
regressor_lin=LinearRegression()
regressor_lin.fit(X_train,y_train)
```

Out[58]:

LinearRegression()

In [59]:

```
y_pred_lin = regressor_lin.predict(X_test)
```

In [60]:

```
from sklearn.metrics import r2_score, mean_squared_error, mean_absolute_error
```

In [61]:

```
print("Training Score of Linear Regression is: {}".format(regressor_lin.score(X_train, y_
print("R2 Score of Linear Regression is: {}".format(r2_score(y_test, y_pred_lin)))
print("Mean Squared Error of Linear Regression is: {}".format(mean_squared_error(y_test,
print("Mean Absolute Error of Linear Regression is: {}".format(mean_absolute_error(y_test
```

Training Score of Linear Regression is: 0.8974998370297538

R2 Score of Linear Regression is: 0.8987325755443236

Mean Squared Error of Linear Regression is: 0.10290762711672685

Mean Absolute Error of Linear Regression is: 0.2667010322333701

In [67]:

```
fig, ax = plt.subplots()
#ax.scatter(y_test, y_pred_lin)
ax.plot([y.min(), y.max()], [y.min(), y.max()], 'k--', lw=4)
ax.set_xlabel('Actual')
ax.set_ylabel('Predicted')
#regression line
y_test, y_predicted = y_test.reshape(-1,1), y_pred_lin.reshape(-1,1)
ax.plot(y_test, LinearRegression().fit(y_test, y_pred_lin).predict(y_test))
ax.set_title('R2: ' + str(r2_score(y_test, y_predicted)))
plt.show()
```

```
File "<ipython-input-67-d37124e0b5ef>", line 10
    plt.show()
    ^
SyntaxError: invalid syntax
```

In [68]:

```
from sklearn.tree import DecisionTreeRegressor
regressor_dt= DecisionTreeRegressor(random_state=0)
regressor_dt.fit(X_train,y_train)

y_pred_dt= regressor_dt.predict(X_test)

print("Training Score of Decision Tree Regressor is: {}".format(regressor_dt.score(X_train)))
print("R2 Score of Decision Tree Regressor is: {}".format(r2_score(y_test, y_pred_dt)))
print("Mean Squared Error of Decision Tree Regressor is: {}".format(mean_squared_error(y_test, y_pred_dt)))
print("Mean Absolute Error of Decision Tree Regressor is: {}".format(mean_absolute_error(y_test, y_pred_dt)))
```

Training Score of Decision Tree Regressor is: 0.9974754575813249

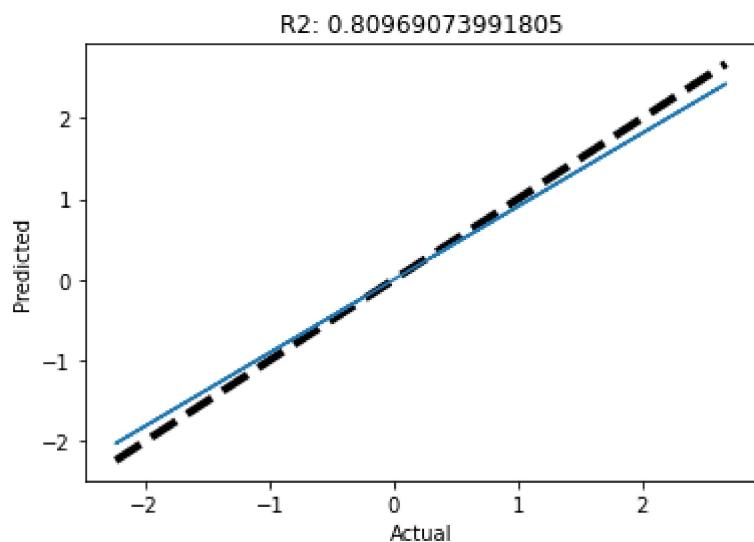
R2 Score of Decision Tree Regressor is: 0.80969073991805

Mean Squared Error of Decision Tree Regressor is: 0.19339165065805858

Mean Absolute Error of Decision Tree Regressor is: 0.3434141196652201

In [69]:

```
fig, ax = plt.subplots()
#ax.scatter(y_test, y_pred_dt)
ax.plot([y_test.min(), y_test.max()], [y_test.min(), y_test.max()], 'k--', lw=4)
ax.set_xlabel('Actual')
ax.set_ylabel('Predicted')
#regression line
y_test, y_predicted = y_test.reshape(-1,1), y_pred_dt.reshape(-1,1)
ax.plot(y_test, LinearRegression().fit(y_test, y_pred_dt).predict(y_test))
ax.set_title('R2: ' + str(r2_score(y_test, y_predicted)))
plt.show()
```



In [70]:

```
from sklearn.ensemble import RandomForestRegressor
regressor_rf=RandomForestRegressor(n_estimators=300, random_state=0)
regressor_rf.fit(X_train,y_train)

y_pred_rf=regressor_rf.predict(X_test)

print("Training Score of Random Forest Regression is: {}".format(regressor_rf.score(X_train)))
print("R2 Score of Random Forest Regression is: {}".format(r2_score(y_test, y_pred_rf)))
print("Mean Squared Error of Random Forest Regression is: {}".format(mean_squared_error(y_test, y_pred_rf)))
print("Mean Absolute Error of Random Forest Regression is: {}".format(mean_absolute_error(y_test, y_pred_rf)))
```

&lt;ipython-input-70-31d6bd563996&gt;:3: DataConversionWarning:

A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n\_samples,), for example using ravel().

Training Score of Random Forest Regression is: 0.9845976814863735

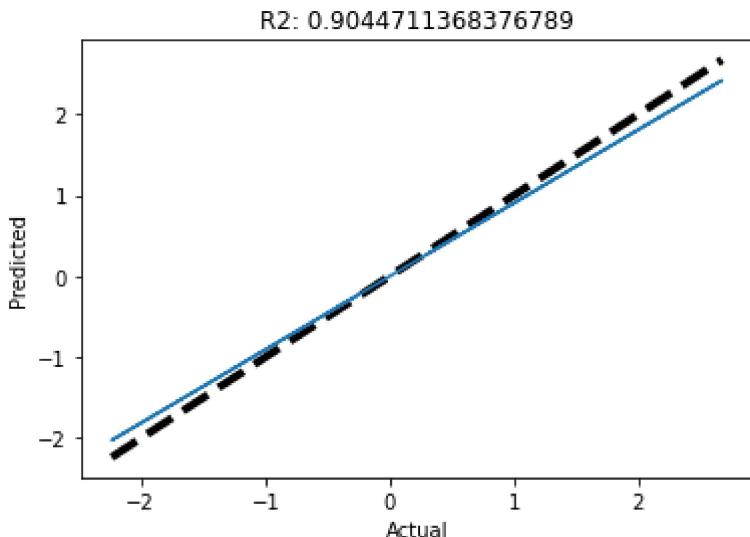
R2 Score of Random Forest Regression is: 0.9044711368376789

Mean Squared Error of Random Forest Regression is: 0.09707611980885064

Mean Absolute Error of Random Forest Regression is: 0.25704854887588974

In [71]:

```
fig, ax = plt.subplots()
#ax.scatter(y_test, y_pred_rf)
ax.plot([y_test.min(), y_test.max()], [y_test.min(), y_test.max()], 'k--', lw=4)
ax.set_xlabel('Actual')
ax.set_ylabel('Predicted')
#regression line
y_test, y_predicted = y_test.reshape(-1,1), y_pred_rf.reshape(-1,1)
ax.plot(y_test, LinearRegression().fit(y_test, y_pred_rf).predict(y_test))
ax.set_title('R2: ' + str(r2_score(y_test, y_predicted)))
plt.show()
```



In [72]:

In [73]:

```
ModuleNotFoundError Traceback (most recent call last)
<ipython-input-73-cec5639e0e8d> in <module>
    11 test_scores = []
    12
--> 13 from imblearn.over_sampling import SMOTE
    14 oversample = SMOTE()
    15 X_balanced, y_balanced = oversample.fit_resample(X_scaled, y_train)

ModuleNotFoundError: No module named 'imblearn'
```

In [74]:

In [ ]: