```
from google.colab import drive
drive.mount('/content/drive')
     Mounted at /content/drive
import pandas as pd
import numpy as np
import time
import pandas as pd
import time
start time = time.time()
listening csv path = '/content/drive/MyDrive/dataset/listenings.csv'
listening_df = pd.read_csv(listening_csv_path, error_bad_lines=False)
end time = time.time()
execution_time = end_time - start_time
print(execution_time)
     Skipping line 14591532: expected 7 fields, saw 8
     Skipping line 14591533: expected 7 fields, saw 8
     Skipping line 14591534: expected 7 fields, saw 8
     Skipping line 14591563: expected 7 fields, saw 8
     Skipping line 14592371: expected 7 fields, saw 8
     Skipping line 14592884: expected 7 fields, saw 8
     Skipping line 14594027: expected 7 fields, saw 11
     Skipping line 14597140: expected 7 fields, saw 8
     Skipping line 14597167: expected 7 fields, saw 8
     Skipping line 14597451: expected 7 fields, saw 8
     Skipping line 14599043: expected 7 fields, saw 9
     Skipping line 14599207: expected 7 fields, saw 9
     Skipping line 14601967: expected 7 fields, saw 8
     Skipping line 14604319: expected 7 fields, saw 11
     Skipping line 14605825: expected 7 fields, saw 9
     Skipping line 14606782: expected 7 fields, saw 8
     Skipping line 14606783: expected 7 fields, saw 8
     Skipping line 14606784: expected 7 fields, saw 8
     Skipping line 14606786: expected 7 fields, saw 8
     Skipping line 14606787: expected 7 fields, saw 8
     Skipping line 14606920: expected 7 fields, saw 8
     Skipping line 14606921: expected 7 fields, saw 8
     Skipping line 14606922: expected 7 fields, saw 8
     Skipping line 14606924: expected 7 fields, saw 8
     Skipping line 14606925: expected 7 fields, saw 8
     Skipping line 14609093: expected 7 fields, saw 8
     Skipping line 14609581: expected 7 fields, saw 9
     Skipping line 14610038: expected 7 fields, saw 8
     Skipping line 14611642: expected 7 fields, saw 8
     Skipping line 14612465: expected 7 fields, saw 8
     Skipping line 14612466: expected 7 fields, saw 8
     Skipping line 14612467: expected 7 fields, saw 8
     Skipping line 14612468: expected 7 fields, saw 8
     Skipping line 14612473: expected 7 fields, saw 8
     Skipping line 14612475: expected 7 fields, saw 8
     Skipping line 14612479: expected 7 fields, saw 8
     Skipping line 14612482: expected 7 fields, saw 8
     Skipping line 14613046: expected 7 fields, saw 8
     Skipping line 14613062: expected 7 fields, saw 8
     Skipping line 14613065: expected 7 fields, saw 9
     Skipping line 14613077: expected 7 fields, saw 8
     Skipping line 14613113: expected 7 fields, saw 9
     Skipping line 14613117: expected 7 fields, saw 8
     Skipping line 14613119: expected 7 fields, saw 11
     Skipping line 14613130: expected 7 fields, saw 8
     Skipping line 14613149: expected 7 fields, saw 8
     Skipping line 14613412: expected 7 fields, saw 8
     Skipping line 14614686: expected 7 fields, saw 9
     Skipping line 14614699: expected 7 fields, saw 9
     Skipping line 14615554: expected 7 fields, saw 8
     Skipping line 14616320: expected 7 fields, saw 8
     Skipping line 14617095: expected 7 fields, saw 8
     Skipping line 14619531: expected 7 fields, saw 8
     Skipping line 14619735: expected 7 fields, saw 9 Skipping line 14619765: expected 7 fields, saw 8
     42.33872842788696
```

import pandas as pd
import time

let's check the data:

```
start_time = time.time()
print(listening_df)
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
                  user_id
                                                                 track \
                                                             Price Tag
              000Silenced 1299680100000
              000Silenced 1299679920000
                                          Price Tag (Acoustic Version)
              000Silenced 1299679440000
                                           Be Mine! (Ballad Version)
              000Silenced 1299679200000
     3
                                                              Acapella
              000Silenced 1299675660000
                                                    I'm Not Invisible
     4
     14166904
                  zzzzita 1323117120000
                                                     Purple Light Dub
                  zzzzita 1323117000000
                                                  Pretty Looks Version
     14166905
     14166906
                  zzzzita 1323116820000
                                                  Ting A Ling Dub Wise
     14166907
                  zzzzita 1323116640000
                                                You've Turned Away Dub
     14166908
                  zzzzita 1323116460000
                                               Love Won't Come Dubbing
                    artist
                                                                        album
                                                                  Who You Are
                  Jessie J
                                                                    Price Tag
                  Jessie J
     1
                                                                     Be Mine!
                    Robvn
     3
                     Kelis
                                                                     Acapella
     4
                 The Tease
                                                            I'm Not Invisible
     14166904 The Heptones
                            The Heptones Dub Dictionary: The Backbone Insi...
     14166905 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
                            The Heptones Dub Dictionary: The Backbone Insi...
     14166906
              The Heptones
     14166907 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
     14166908 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
     [13276607 rows x 5 columns]
     0.011649370193481445
# drop the null rows:
start_time = time.time()
listening df = listening df.dropna()
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
     12.903310537338257
# let's check the dataset again:
start_time = time.time()
print(listening_df)
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
                  user id
                                                                 track \
     0
              000Silenced 1299680100000
                                                             Price Tag
              000Silenced 1299679920000
                                          Price Tag (Acoustic Version)
     1
              000Silenced 1299679440000
                                             Be Mine! (Ballad Version)
              000Silenced 1299679200000
                                                             Acapella
     3
              000Silenced 1299675660000
                                                     I'm Not Invisible
     4
                  zzzzita 1323117120000
     14166904
                                                     Purple Light Dub
     14166905
                  zzzzita 1323117000000
                                                  Pretty Looks Version
     14166906
                  zzzzita 1323116820000
                                                  Ting A Ling Dub Wise
                  zzzzita 1323116640000
     14166907
                                                You've Turned Away Dub
     14166908
                  zzzzita 1323116460000
                                               Love Won't Come Dubbing
                    artist
                                                                        album
                  Tessie T
                                                                  Who You Are
     0
                                                                    Price Tag
     1
                  Jessie J
     2
                     Robyn
                                                                     Be Mine!
     3
                     Kelis
                                                                     Acapella
     4
                 The Tease
                                                            I'm Not Invisible
     14166904 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
     14166905 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
```

```
14166906 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
     14166907 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
     14166908 The Heptones The Heptones Dub Dictionary: The Backbone Insi...
     [13276607 rows x 5 columns]
     0.009487628936767578
print(listening_df.info())
     <class 'pandas.core.frame.DataFrame'>
     Int64Index: 13276607 entries, 0 to 14166908
    Data columns (total 5 columns):
     # Column Dtype
     0
         user_id object
         date
                  int64
         track
                  object
         artist object
     4 album
                  object
     dtypes: int64(1), object(4)
     memory usage: 607.8+ MB
     None
# let's see the shape of our dataframe:
start_time = time.time()
shape = listening_df.shape
print(shape)
end time = time.time()
execution_time = end_time - start_time
print(execution_time)
     (13276607, 5)
     0.0020542144775390625
# select two columns: track and artist
start time = time.time()
q0 = listening_df[['artist', 'track']]
print(q0)
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
                    artist
                                                    track
     0
                  Jessie J
                                               Price Tag
     1
                   Jessie J Price Tag (Acoustic Version)
                    Robyn
                             Be Mine! (Ballad Version)
                     Kelis
                                                Acapella
                                       I'm Not Invisible
                 The Tease
     14166904 The Heptones
                                        Purple Light Dub
     14166905 The Heptones
                                    Pretty Looks Version
                                    Ting A Ling Dub Wise
     14166906
              The Heptones
                                  You've Turned Away Dub
     14166907 The Heptones
     14166908 The Heptones
                                  Love Won't Come Dubbing
     [13276607 rows x 2 columns]
     0.6459553241729736
# Let's find all of the records of those users who have listened to Rihanna
start_time = time.time()
q1 = listening_df[listening_df['artist'] == 'Rihanna']
print(q1)
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
                    user_id
                                      date \
                000Silenced 1294498440000
     6
     28
                000Silenced 1285438440000
                00williamsl 1361485800000
     1623
                00williamsl 1361485800000
00williamsl 1361048640000
     1635
     1654
```

```
14159311
                    ZueK666 1334970600000
     14162708
                     Zwadzio 1446562980000
     14162788
                    Zwadzio 1446562980000
     14166430 zzzombiebones 1374354060000
                                                             artist \
                                                     track
              Don't Stop The Music (Wideboys Bassline Mix)
                                                            Rihanna
     28
                                                Disturbia
                                                            Rihanna
     1623
                                         Hatin On The Club
                                                            Rihanna
     1635
                                         Hatin On The Club
                                                            Rihanna
     1654
                                               Complicated
                                                            Rihanna
     14159310
                                                  Should I
                                                            Rihanna
                                                            Rihanna
     14159311
                                     Pon De Replay (Remix)
     14162708
                                       Where Have You Been
     14162788
                                       Where Have You Been
                                                            Rihanna
     14166430
                                                       S&M Rihanna
                                        album
                      Addicted 2 Bassline CD1
     6
     28
              Good Girl Gone Bad: The Remixes
     1623
                                       Random
     1635
                                       Random
     1654
                                         Loud
     14159310
             Music Of The Sun [Bonus Track]
               Music Of The Sun [Bonus Track]
     14162708 Talk That Talk (Deluxe Edition)
     14162788 Talk That Talk (Deluxe Edition)
     14166430
                                         Loud
     [41422 rows x 5 columns]
     1.067509651184082
# Let's find top 10 users who are fan of Rihanna
start time = time.time()
q2 = listening_df[listening_df['artist'] == 'Rihanna'].groupby('user_id').size().reset_index(name='count').sort_values(by='count', ascer
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
                  user_id count
                  thiessu
     7851
     4502
              eyessetkyle
                             166
     3102
                             164
                    adxx
     6313 missnumberthree
                             156
     4921 helloiamnatalie
                             128
     6594
                   nmjnb
                             124
     160
                  AndyyyA
                             123
     223
               BIGBANG186
                             121
     6320
               mixedvibes
                             120
     2173 Pinky_von_Pout
     1.902695894241333
# Top 10 famous track
start_time = time.time()
q3 = listening_df.groupby(['artist', 'track']).size().reset_index(name='count').sort_values(by='count', ascending=False).head(10)
print(a3)
end_time = time.time()
execution time = end time - start time
print(execution_time)
                     artist
                                         track count
     884334
              Justin Bieber
                                         Sorry
                                                 3381
     144100 Arctic Monkeys
                              Do I Wanna Know?
                                                 2862
     1870435
                                    PILLOWTALK
                                                 2701
                       Zayn
     1648225
                The Killers
                                 Mr Brightside
                                                 2685
     1357410
                    Rihanna
                                         Work
                                                 2643
     196192
                   Bastille
                                       Pompeii
                                                 2606
     1143458 Mumford & Sons
                              Little Lion Man
                                                 2514
                                Love Yourself
     884208
              Justin Bieber
                                                 2481
     884396
              Justin Bieber What Do You Mean?
                                                 2480
     1143517 Mumford & Sons
                                                 2478
                                      The Cave
     16.40806818008423
```

14159310

ZueK666 1334970780000

```
# find top 10 famous tracks of Rihanna
start time = time.time()
 \texttt{q4} = \texttt{listening\_df[listening\_df['artist'] == 'Rihanna'].groupby(['artist', 'track']).size().reset\_index(name='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').sort\_values(by='count').s
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
                          artist
            931 Rihanna
                                                                                                                                       2643
             408 Rihanna
                                                                      Only Girl (In the World)
            832 Rihanna We Found Love (feat Calvin Harris)
             629 Rihanna
                                                                                                                                         1304
                                                                                                              Rude Boy
            569 Rihanna
                                                                                                                                         1301
             127 Rihanna
                                                                                                              Diamonds
                                                                                                                                         1217
            297 Rihanna
                                                                                              Kiss it Better
                                                                                                                                          938
            889 Rihanna
89 Rihanna
                                                                                                                                        843
                                                                                Where Have You Been
                                                                         Cheers (Drink to That)
                                                                                                                                           697
             364 Rihanna
                                                                                                          Needed Me
                                                                                                                                       675
             1.0711939334869385
# find top 10 famous albums
start_time = time.time()
q5 = listening\_df.groupby(['artist', 'album']).size().reset\_index(name='count').sort\_values(by='count', ascending=False).head(10)
print(q5)
end_time = time.time()
execution_time = end_time - start_time
print(execution_time)
                                                                       artist
                                                                                                                         album count
             494296
                                                          Kanye West The Life Of Pablo 22278
             940552
                                                                          The xx
                                                                                                                                            14131
             91664
                                                    Arctic Monkeys
                                                                                                                                 AM 14088
             1021188
                                                                          alt-J
                                                                                               An Awesome Wave 13613
                                                                                                Sigh No More 13521
                                                Mumford & Sons
             628878
                                                                                                         Art Angels 11628
             391411
                                                                        Grimes
                                                                                                          Lungs 11341
             345310 Florence + the Machine
             54501
                                                                         Adele
                                                                                                                             21 11198
                                                                                             Born to Die 9984
The Suburbs 9793
                                                        Lana Del Rey
             527507
            Arcade Fire 14.446802139282227
```