```
IMPORT LIBRARIES
In [1]: # import library yang di butuhkan
          import numpy as np
          import pandas as pd
          import matplotlib.pyplot as plt
          import seaborn as sns
          import sqlite3
          KONEKSIKAN KE DATABASE
In [2]: # koneksikan data ke sqlite3 database
          conn = sqlite3.connect('chinook.db')
          print("Database created and Successfully Connected to SQLite")
          Database created and Successfully Connected to SQLite
In [3]: # test koneksi
          test = conn.execute('select * from customers limit 10')
          for i in test :
              print(i)
          (1, 'Luís', 'Gonçalves', 'Embraer - Empresa Brasileira de Aeronáutica S.A.', 'Av. Brigadeiro
          Faria Lima, 2170', 'São José dos Campos', 'SP', 'Brazil', '12227-000', '+55 (12) 3923-5555',
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          4', '+49 0711 2842222', None, 'leonekohler@surfeu.de', 5)
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          2 22', None, 'bjorn.hansen@yahoo.no', 4)
          (5, 'František', 'Wichterlová', 'JetBrains s.r.o.', 'Klanova 9/506', 'Prague', None, 'Czech R
          epublic', '14700', '+420 2 4172 5555', '+420 2 4172 5555', 'frantisekw@jetbrains.com', 4)
          (6, 'Helena', 'Holý', None, 'Rilská 3174/6', 'Prague', None, 'Czech Republic', '14300', '+420
          2 4177 0449', None, 'hholy@gmail.com', 5)
          (7, 'Astrid', 'Gruber', None, 'Rotenturmstraße 4, 1010 Innere Stadt', 'Vienne', None, 'Austria', '1010', '+43 01 5134505', None, 'astrid.gruber@apple.at', 5)
          (8, 'Daan', 'Peeters', None, 'Grétrystraat 63', 'Brussels', None, 'Belgium', '1000', '+32 02
          219 03 03', None, 'daan_peeters@apple.be', 4)
          (9, 'Kara', 'Nielsen', None, 'Sønder Boulevard 51', 'Copenhagen', None, 'Denmark', '1720', '+
          453 3331 9991', None, 'kara.nielsen@jubii.dk', 4)
          (10, 'Eduardo', 'Martins', 'Woodstock Discos', 'Rua Dr. Falcão Filho, 155', 'São Paulo', 'S
In [4]: # query untuk membuat master table
          query = """
          with cte1 as(
          select invoices.InvoiceId, invoice_items.TrackId, invoices.CustomerId, invoices.InvoiceDate,
          customers.FirstName || ' ' || customers.LastName as 'Customer Name',
          employees.FirstName || ' ' || employees.LastName as 'Employee Representative',
          invoices.BillingCountry, invoices.Total
          from invoices
          join invoice_items on invoices.InvoiceId = invoice_items.InvoiceId
          join customers on invoices.CustomerId = customers.CustomerId
          join employees on customers.SupportRepId = employees.EmployeeId
          order by invoices.InvoiceId
          ), cte2 as(
          select playlists.Name as 'Playlist Name', playlist_track.TrackId from playlists
          join playlist_track on playlists.PlaylistId = playlist_track.PlaylistId
          ), cte3 as(
          select artists.ArtistId, artists.Name as 'Artist Name', tracks.TrackId,
          tracks.Name as 'Track Name', albums.Title as 'Album Title',
          cte2.[Playlist Name], tracks.UnitPrice
          from artists
          join albums on artists.ArtistId = albums.ArtistId
          join tracks on albums.AlbumId = tracks.AlbumId
          join cte2 on tracks. TrackId = cte2. TrackId group by tracks. Name order by artists. ArtistId
          select cte1.InvoiceId, cte1.InvoiceDate, cte1.[Customer Name], cte1.[Employee Representativ
          e], cte1.BillingCountry,
          cte3.[Artist Name], cte3.[Track Name], cte3.[Album Title], cte3.[Playlist Name], cte1.Total
          from cte1 join cte3 on cte1.TrackId = cte3.TrackId
In [5]: # eksekusi query master table
          master_table = conn.execute(query)
In [6]: # mengambil semua values kedalam list
          li = []
          for i in master_table:
              li.append(i)
In [7]: # membuat dataframe dari values yang ada pada master table
          colname = ['Invoice Id', 'Invoice Date', 'Customer Name', 'Employee Representative',
                      'Billing Country', 'Artist Name', 'Track Name', 'Album Title', 'Playlist Type',
          'Total Payment']
In [8]: # melihat 5 data teratas pada dataframe
          df.head()
Out[8]:
             Invoice
                       Invoice Customer
                                           Employee
                                                      Billing
                                                             Artist
                                                                       Track
                                                                                                 Playlist
                                                                                                           Total
                                                                                      Album Title
                 ld
                         Date
                                 Name
                                        Representative
                                                     Country
                                                             Name
                                                                       Name
                                                                                                   Type Payment
                                                                    Balls to the
                    2009-01-01
                                 Leonie
          0
                                         Steve Johnson Germany Accept
                                                                                    Balls to the Wall
                                                                                                  Music
                                                                                                           1.98
                       00:00:00
                                 Köhler
                     2009-01-01
                                 Leonie
                                                                      Restless
          1
                                         Steve Johnson Germany Accept
                                                                                  Restless and Wild
                                                                                                  Music
                                                                                                           1.98
                      00:00:00
                                 Köhler
                                                                     and Wild
                                                                     Breaking For Those About To Rock
                    2009-01-02
                                  Bjørn
          2
                                         Margaret Park
                                                     Norway AC/DC
                                                                                                  Music
                                                                                                           3.96
                       00:00:00
                                                                     The Rules
                                                                                     We Salute You
                                Hansen
                    2009-01-02
                                  Bjørn
                                                                             For Those About To Rock
          3
                                                                    Evil Walks
                                         Margaret Park
                                                     Norway AC/DC
                                                                                                  Music
                                                                                                           3.96
                       00:00:00
                                Hansen
                                                                                     We Salute You
                                                                     Inject The For Those About To Rock
                    2009-01-02
                                  Bjørn
                                         Margaret Park
                                                     Norway AC/DC
                                                                                                  Music
                                                                                                           3.96
                       00:00:00
                                                                                     We Salute You
In [9]: # memeriksa info
          df.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 2063 entries, 0 to 2062
          Data columns (total 10 columns):
              Column
                                          Non-Null Count Dtype
           0
              Invoice Id
                                          2063 non-null int64
              Invoice Date
                                          2063 non-null object
               Customer Name
                                          2063 non-null
                                                           object
               Employee Representative 2063 non-null
                                                           object
           3
               Billing Country
                                          2063 non-null
                                                           object
           4
           5
               Artist Name
                                          2063 non-null
                                                            object
               Track Name
                                          2063 non-null
                                                           object
               Album Title
                                          2063 non-null
                                                            object
               Playlist Type
                                          2063 non-null
                                                            object
           9 Total Payment
                                          2063 non-null
                                                            float64
          dtypes: float64(1), int64(1), object(8)
          memory usage: 161.3+ KB
In [10]: # merubah datatype InvoiceId menjadi string
          df['Invoice Id'] = df['Invoice Id'].astype('str')
          print(df['Invoice Id'].dtype)
          object
In [11]: # merubah datatype Invoice Date menjadi datetime
          df['Invoice Date'] = pd.to_datetime(df['Invoice Date'])
          print(df['Invoice Date'].dtype)
          datetime64[ns]
In [12]:
         # memeriksa kembali info
          df.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 2063 entries, 0 to 2062
          Data columns (total 10 columns):
               Column
                                          Non-Null Count Dtype
           0
              Invoice Id
                                                           object
                                          2063 non-null
              Invoice Date
                                          2063 non-null
                                                            datetime64[ns]
           1
                                          2063 non-null
               Customer Name
                                                            object
           3
               Employee Representative 2063 non-null
                                                            object
               Billing Country
           4
                                          2063 non-null
                                                            object
                                          2063 non-null
           5
               Artist Name
                                                            object
               Track Name
                                          2063 non-null
                                                            object
               Album Title
                                          2063 non-null
           7
                                                            object
           8
               Playlist Type
                                          2063 non-null
                                                            object
               Total Payment
                                          2063 non-null
                                                            float64
           9
          dtypes: datetime64[ns](1), float64(1), object(8)
          memory usage: 161.3+ KB
In [13]: # statistik deskriptif untuk data numerical
          df.describe().T
Out[13]:
                       count
                               mean
                                          std min 25% 50% 75%
          Total Payment 2063.0 9.393684 5.122044 0.99 5.94 8.91 13.86 25.86
                Dari analisis deskriptif diatas dapat diketahui bahwa rata - rata Total Payment dalam dollar adalah 9.39,
                dengan standar deviasi 5.12. Transaksi paling minimal adalah 0.99, dengan median 8.91 dan maksimum nya
                adalah 25.86 dollar.
In [14]: # statistik deskriptif untuk data categorical
          df.describe(include = 'object').T
Out[14]:
                               count unique
                                                        top
                                                            freq
                      Invoice Id
                               2063
                                       396
                 Customer Name
                               2063
                                        59
                                                Diego Gutiérrez
           Employee Representative 2063
                                                 Jane Peacock
                  Billing Country
                               2063
                                        24
                                                        USA
                                                             460
                                       164
                     Artist Name
                                2063
                                                  Iron Maiden
                                       1833 Lamento De Carnaval
                                                               2
                     Track Name
                                2063
                                2063
                                        298
                                                 Minha Historia
                     Album Title
                    Playlist Type
                               2063
                                                       Music 1955
                Analisis deskriptif untuk data categorical memberikan gambaran umum mengenai data - data tersebut secara
                general. Misalnya pada kolom Employee Representative yang mewakili karwayan yang melayani
                customer, dimana kita lihat terdapat 3 unique ; artinya hanya terdapat 3 nama employee, dan yang paling
                banyak adalah Jane Peacock sebanyak 732 kali. Pembacaan informasi untuk semua kolom adalah sama.
                Misalnya, Playlist Type yaitu mewakili tipe dari playlist yang di beli. Terdapat 2 unique ; artinya terdapat
                2 jenis tipe, dimana Music adalah merupakan tipe yang paling dominan di beli dengan frekuensi sebanyak
          VISUALISASI DAN ANALISIS
In [15]: # visualisasi customer name
          cust = df['Customer Name'].value_counts().sort_values(ascending=False)
          plt.figure(figsize=(16,6))
          cust.plot(kind = 'bar')
          plt.tight_layout()
          plt.show()
In [16]: cust.describe()
Out[16]: count
                   59.000000
                    34.966102
          mean
                    2.050787
          std
                    30.000000
          min
          25%
                   33.000000
                   35.000000
          50%
          75%
                    36.500000
                   38.000000
          max
          Name: Customer Name, dtype: float64
                Dari visualisasi dan describe pada Customer Name diatas, kita dapat mengetahui bahwa para customer
                melakukan transaksi di range antara 30 sampai 38 kali, dengan rata - rata per customer melakukan transaksi
                sekitar 34 kali.
In [17]: # visualisasi employee representative
          emp = df['Employee Representative'].value_counts().sort_values()
          plt.figure(figsize=(12,6))
          ax = emp.plot(kind = 'barh')
          plt.tight_layout()
          for i, j in enumerate(emp):
              ax.text(j + 2, i, str(j))
          plt.show()
                                                                                                           732
           Jane Peacock
                                                                                                      694
           Margaret Park
                                                                                               637
           Steve Johnson
                              100
                                          200
                                                                  400
                                                                              500
                                                                                          600
                                                      300
                                                                                                     700
                Dari visualisasi Employee Representative diatas dapat disimpulkan bahwa memang benar hanya
                terdapat 3 nama, dimana Jane Peacock melayani lebih banyak pelanggan sebanyak 732 kali, di ikuti oleh
                Margaret Park sebanyak 694, dan Steve Johnson sebanyak 637 kali.
In [18]: # visualisasi top 10 billing country
          cou = df['Billing Country'].value_counts().head(10).sort_values(ascending = False)
          plt.figure(figsize=(12,6))
          ax = cou.plot(kind = 'bar')
          plt.tight_layout()
          for i in ax.patches:
                   ax.annotate('{}'.format(i.get_height()), (i.get_x()+0.15, i.get_height()+8))
          plt.show()
           400
           300
           200
                                                                  102
           100
                                                                            72
                                                                                     71
                Visualisasi diatas adalah top 10 Billing Country, dan dapat diketahui bahwa memang sebagian besar
                customer berasal atau berdomisili dari USA sebanyak 460 transaksi, selanjutnya Canada dengan 272
                transaksi, France dengan 180 transaksi, Brazil dengan 176 transaksi, dst.
```

Metallica

art = df['Artist Name'].value_counts().head(10).sort_values()

In [19]: # visualisasi top 10 artist name

plt.tight_layout()

plt.show()

plt.figure(figsize=(12,6)) ax = art.plot(kind = 'barh')

for i, j in enumerate(art):

plt.figure(figsize=(8,6))

plt.show()

ax.text(j+0.5, i-0.05, str(j))

```
Iron Maiden
                      Led Zeppelin
                      Faith No More
                       Deep Purple
             Os Paralamas Do Sucesso
                           R.E.M.
                       Eric Clapton
                                                                                                                  80
                                                    20
                                                                         40
                                                                                              60
                    Melalui plot di atas dapat kita lihat bahwa dari transaksi seluruh customer, U2 dan Iron Maiden merupakan
                    nama artist yang paling laris, dengan jumlah transaksi pembelian yang sama yaitu 93 kali, di ikuti dengan
                    Metallica dengan 83 kali, dst.
In [20]: # visualisasi playlist type
            pla = df['Playlist Type'].value_counts().sort_values(ascending = False)
```

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ax = pla.plot(kind = 'bar') plt.tight_layout() **for** i in ax.patches: ax.annotate('{}'.format(i.get_height()), (i.get_x()+0.2, i.get_height()+8))

```
2000
                            1955
1750
1500
1000
 750
 500
 250
                                                                               Shows
                                                                               \geq
```