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NAME: BHAVIK RANSUBHE
          CLASS: TE(B) COMP
          ROLL NO: 39055
          Course Name – Data Science Honours
          PROBLEM STATEMNET
          Title: - Case Study on open source visualization tool.
            1. Download the dataset from standard repositories like UCM, kaggle etc.
            2. Import the dataset.
            3. Apply preprocessing and visualization techniques to explore the dataset.
          Google PlayStore Dataset Analysis (From Kaggle):
          IMPORTING PACKAGES:
 In [1]: import numpy as np # linear algebra
          import pandas as pd # data processing, CSV file I/O (e.g. pd.read_csv)
          import matplotlib.pyplot as plt #plotting charts
          import seaborn as sns #plotting good-looking charts
          #To hide Warning messages.
          import warnings
          warnings.filterwarnings('ignore')
          READING DATA:
 In [2]: | df = pd.read_csv("C:\\Users\\bhavi\\Downloads\\archive\\googleplaystore.csv")
          df.head(10)
 Out[2]:
                                                                                                           Last Cur
                                                                                 Content
                               Category Rating Reviews Size
                                                               Installs Type Price
                                                                                               Genres
                  App
                                                                                                        Updated
                                                                                  Rating
                 Photo
                Editor &
                Candy
                                                                                                       January 7,
                       ART_AND_DESIGN
                                          4.1
                                                 159 19M
                                                              10,000+ Free
                                                                              0 Everyone
                                                                                            Art & Design
              Camera &
                                                                                                           2018
                 Grid &
              ScrapBook
                Coloring
                                                                                                 Art &
                                                                                                         January
                       ART_AND_DESIGN
                  book
                                                 967 14M
                                                             500,000+ Free
                                                                              0 Everyone Design;Pretend
                                                                                                        15, 2018
                                                                                                 Play
                moana
               Launcher
                 Lite –
                                                                                                        August 1,
           2 FREE Live ART_AND_DESIGN
                                                                                            Art & Design
                                                87510 8.7M 5,000,000+ Free
                                                                              0 Everyone
                                                                                                           2018
                  Cool
               Themes,
                Hide ...
                Sketch -
                                                                                                         June 8,
                Draw & ART AND DESIGN
                                          4.5 215644 25M 50,000,000+ Free
                                                                                    Teen
                                                                                            Art & Design
                                                                                                           2018
                 Paint
              Pixel Draw

    Number

                                                                                                 Art &
                                                                                                        June 20,
                                                  967 2.8M
                                                             100,000+ Free
                   Art ART_AND_DESIGN
                                                                              0 Everyone
                                                                                        Design;Creativity
                                                                                                           2018
                Coloring
                  Book
                 Paper
                                                                                                       March 26,
                       ART AND DESIGN
                flowers
                                                  167 5.6M
                                                              50,000+ Free
                                                                              0 Everyone
                                                                                            Art & Design
             instructions
                Smoke
                 Effect
                 Photo
                                                                                                         April 26,
           6
                       ART_AND_DESIGN
                                          3.8
                                                  178 19M
                                                              50,000+
                                                                     Free
                                                                              0 Everyone
                                                                                            Art & Design
                Maker -
                                                                                                           2018
                Smoke
                 Editor
                                                                                                        June 14,
                        ART_AND_DESIGN
                                                            1,000,000+
                                                                                                                6.1.
                                                36815 29M
                                                                              0 Everyone
                                                                                            Art & Design
                Painter
                                                                                                           2018
                Garden
                                                                                                       September
           8
               Coloring
                       ART_AND_DESIGN
                                          4.4
                                                13791 33M 1,000,000+ Free
                                                                              0 Everyone
                                                                                            Art & Design
                                                                                                        20, 2017
                  Book
              Kids Paint
                                                                                                          July 3,
                 Free -
                                                                                                 Art &
                       ART_AND_DESIGN
                                                  121 3.1M
                                                              10,000+
                                                                     Free
                                                                                         Design;Creativity
               Drawing
                                                                                                           2018
                  Fun
In [3]: | df.tail(10)
 Out[3]:
                                App
                                                   Category Rating Reviews
                                                                           Size
                                                                                    Installs Type Price
                                                                                                                Geı
                                                                                                        Rating
                                      MAPS_AND_NAVIGATION
           10831 payermonstationnement.fr
                                                                       38
                                                                           9.8M
                                                                                     5,000+
                                                                                                   0 Everyone
                                                                                                              Naviga
           10832
                                                                           582k
                             FR Tides
                                                  WEATHER
                                                              3.8
                                                                     1195
                                                                                   100,000+
                                                                                           Free
                                                                                                   0 Everyone
                                                                                                                Wea
                                                                                                                Boo
           10833
                           Chemin (fr) BOOKS_AND_REFERENCE
                                                              4.8
                                                                           619k
                                                                                    1,000+
                                                                                           Free
                                                                                                   0 Everyone
                                                                                                              Refere
           10834
                          FR Calculator
                                                                           2.6M
                                                    FAMILY
                                                              4.0
                                                                                      500+
                                                                                           Free
                                                                                                   0 Everyone
                                                                                                              Educa
           10835
                                                  BUSINESS
                                                             NaN
                                                                           9.6M
                            FR Forms
                                                                                       10+
                                                                                           Free
                                                                                                   0 Everyone
                                                                                                               Busir
           10836
                                                                            53M
                       Sya9a Maroc - FR
                                                    FAMILY
                                                              4.5
                                                                       38
                                                                                     5,000+
                                                                                           Free
                                                                                                   0 Everyone Educa
                   Fr. Mike Schmitz Audio
           10837
                                                    FAMILY
                                                              5.0
                                                                           3.6M
                                                                                      100+
                                                                                           Free
                                                                                                   0 Everyone
                                                                                                              Educa
                            Teachings
           10838
                  Parkinson Exercices FR
                                                   MEDICAL
                                                                           9.5M
                                                             NaN
                                                                                    1,000+
                                                                                           Free
                                                                                                   0 Everyone
                                                                           Varies
                  The SCP Foundation DB
                                                                                                        Mature
                                                                                                                Boo
           10839
                                     BOOKS_AND_REFERENCE
                                                              4.5
                                                                                    1,000+ Free
                                                                      114
                                                                           with
                              fr nn5n
                                                                                                          17+
                                                                                                              Refere
                                                                          device
                  iHoroscope - 2018 Daily
           10840
                                                 LIFESTYLE
                                                              4.5
                                                                   398307
                                                                           19M 10,000,000+ Free
                                                                                                   0 Everyone
                                                                                                                Life
                   Horoscope & Astrology
          Data Cleaning & Preprocessing:
 In [4]: #drop off irrelevant columns
          df = df.drop(columns=['Last Updated', 'Current Ver', 'Content Rating'])
 In [5]: #check out the type and counts for each attribute
          df.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 10841 entries, 0 to 10840
          Data columns (total 10 columns):
                           10841 non-null object
          App
                           10841 non-null object
          Category
                           9367 non-null float64
          Rating
          Reviews
                           10841 non-null object
          Size
                           10841 non-null object
                           10841 non-null object
          Installs
                           10840 non-null object
          Type
                           10841 non-null object
          Price
          Genres
                          10841 non-null object
          Android Ver
                          10838 non-null object
          dtypes: float64(1), object(9)
          memory usage: 847.1+ KB
 In [6]: print(df.isnull().sum())
          df.dropna(inplace=True) #Dropping Rows with Null values
          App
          Category
          Rating
                           1474
          Reviews
          Size
          Installs
          Type
          Price
          Genres
          Android Ver
                              3
          dtype: int64
 In [7]: #Removing Duplicate entries
          df.drop_duplicates(inplace=True)
 In [8]: | #fill the missing values of Rating by the mean value of their corresponding app categories
          df['Rating'] = df.groupby("Category").Rating.transform(lambda x: x.fillna(x.mean()))
 In [9]: #Double check if any nan value still exist
          df.Rating.isna().sum()
 Out[9]: 0
In [10]: print(df.isnull().sum())
                           0
          Category
          Rating
          Reviews
          Size
          Installs
          Type
          Price
          Genres
          Android Ver
          dtype: int64
In [11]: df.shape
Out[11]: (8888, 10)
          The data types of each feature must be changed to a proper format that can be used for
          analysis.
In [12]: | df['Installs']=df['Installs'].str.replace(',','').str.replace('+','').astype('int')
In [13]: # converting review to int
          df['Reviews']=df['Reviews'].astype('int')
In [14]: | df['Price']=df['Price'].str.replace('$','').astype('float')
In [15]: # Changing the feature, Android Ver
          newVer = []
          for row in df['Android Ver']:
                   newrow = float(row[:2])
              except:
                   newrow = 0 # When the value is - Varies with device
              newVer.append(newrow)
          df['Android Ver'] = newVer
          df['Android Ver'].value_counts()
Out[15]: 4.0
                  5604
          0.0
                  1178
          2.0
                  1160
          5.0
                   499
          3.0
                   246
          1.0
                   105
          6.0
                    46
          7.0
                    45
          8.0
                     5
          Name: Android Ver, dtype: int64
In [16]: df.head(10)
Out[16]:
                                                                                                           Android
                                             Category Rating Reviews Size
                                                                           Installs Type Price
                                 App
                                                                                                               Ver
               Photo Editor & Candy Camera
                                      ART_AND_DESIGN
                                                                            10000 Free
                                                         4.1
                                                                159 19M
                                                                                         0.0
                                                                                                Art & Design
                                                                                                               4.0
                      & Grid & ScrapBook
                                                                                                      Art &
                                                                967 14M
                                                                                              Design;Pretend
           1
                     Coloring book moana ART_AND_DESIGN
                                                         3.9
                                                                            500000 Free
                                                                                         0.0
                                                                                                               4.0
               U Launcher Lite – FREE Live ART_AND_DESIGN
                                                              87510 8.7M
                                                                          5000000 Free
                                                                                         0.0
                                                                                                Art & Design
                                                                                                               4.0
                     Cool Themes, Hide ...
           3
                     Sketch - Draw & Paint ART_AND_DESIGN
                                                        4.5
                                                             215644 25M
                                                                          50000000 Free
                                                                                                Art & Design
                                                                                                               4.0
                   Pixel Draw - Number Art ART_AND_DESIGN
                                                                967 2.8M
                                                                           100000 Free
                                                                                         0.0
                                                                                                               4.0
                          Coloring Book
                                                                                             Design;Creativity
           5
                  Paper flowers instructions ART_AND_DESIGN
                                                                167 5.6M
                                                                            50000 Free
                                                                                                Art & Design
                                                        4.4
                                                                                         0.0
                                                                                                               2.0
                Smoke Effect Photo Maker - Smoke Editor ART_AND_DESIGN
                                                                178 19M
                                                         3.8
                                                                            50000 Free
                                                                                                Art & Design
                                                                                                               4.0
                          Infinite Painter ART_AND_DESIGN
                                                               36815 29M
                                                                           1000000 Free
                                                                                                Art & Design
                                                                                                               4.0
                                                         4.1
                     Garden Coloring Book ART_AND_DESIGN
                                                              13791 33M
                                                                           1000000 Free
                                                                                                 Art & Design
                                                                                                               3.0
               Kids Paint Free - Drawing Fun ART_AND_DESIGN
                                                         4.7
                                                                121 3.1M
                                                                            10000 Free
                                                                                                               4.0
                                                                                             Design;Creativity
          DATA VISUALIZATION
          1. Displaying all the categories and their counts
In [17]: | df.Category.value_counts()
Out[17]: FAMILY
                                   1718
                                    1074
          GAME
          T00LS
                                     733
          PRODUCTIVITY
                                     334
          FINANCE
                                     317
          PERSONALIZATION
                                     308
          COMMUNICATION
                                     307
          LIFESTYLE
                                     305
          PHOTOGRAPHY
                                     304
                                     302
          MEDICAL
          SP0RTS
                                     286
          BUSINESS
                                     270
                                     262
          HEALTH_AND_FITNESS
          SOCIAL
                                     244
          NEWS_AND_MAGAZINES
                                     214
          TRAVEL_AND_LOCAL
                                     205
          SHOPPING
                                     201
          BOOKS AND REFERENCE
                                     177
          VIDEO_PLAYERS
                                     160
          DATING
                                     159
                                     129
          EDUCATION
          MAPS AND NAVIGATION
                                     124
          ENTERTAINMENT
                                     111
          FOOD_AND_DRINK
                                     106
                                      75
          WEATHER
          AUTO AND VEHICLES
                                      73
          HOUSE_AND_HOME
                                      68
          LIBRARIES_AND_DEMO
                                      65
          ART_AND_DESIGN
                                      62
          COMICS
                                      58
          PARENTING
                                      50
          EVENTS
                                      45
                                      42
          BEAUTY
          Name: Category, dtype: int64
In [18]: | df.Category.value_counts().plot(kind='barh', figsize= (12,8))
Out[18]: <matplotlib.axes._subplots.AxesSubplot at 0x1d9f7221a88>
                      EVENTS -
                    PARENTING
                      COMICS
               ART_AND_DESIGN
             LIBRARIES_AND_DEMO
              HOUSE AND HOME
             AUTO_AND_VEHICLES
               FOOD AND DRINK
                ENTERTAINMENT
            MAPS_AND_NAVIGATION
                   EDUCATION
                 VIDEO PLAYERS
           BOOKS_AND_REFERENCE
                     SHOPPING
              TRAVEL_AND_LOCAL
            NEWS_AND_MAGAZINES
                      SOCIAL
             HEALTH_AND_FITNESS
                     BUSINESS
                      SPORTS
                     MEDICAL
                 PHOTOGRAPHY
                     LIFESTYLE
                COMMUNICATION
               PERSONALIZATION
                     FINANCE
                  PRODUCTIVITY
                       TOOLS
                       GAME
                       FAMILY
                                                                                                             1750
          Insight: Maximum Number of Apps belong to the Family and Game Category.
          2. Rating
In [19]: df.Rating.describe()
Out[19]: count
                    8888.000000
          mean
                       4.187826
          std
                       0.522478
          min
                       1.000000
          50%
                       4.300000
          75%
                        4.500000
                       5.000000
          max
          Name: Rating, dtype: float64
          Distribution Plot of 'Rating'
In [20]: sns.distplot(df.Rating)
Out[20]: <matplotlib.axes._subplots.AxesSubplot at 0x1d9f7848dc8>
           1.4
           1.2
           1.0
           0.6
           0.4
           0.2
                                  Rating
          Insight: Most of the apps, clearly hold a rating above 4.0!
          3. TYPE
In [21]: |plt.pie(df.Type.value_counts(), labels=['Free', 'Paid'], autopct='%1.1f%%')
Out[21]: ([<matplotlib.patches.Wedge at 0x1d9f7748248>,
            <matplotlib.patches.Wedge at 0x1d9f7748d48>],
           [Text(-1.0743632425327427, 0.23610087482796627, 'Free'),
            Text(1.074363237006403, -0.23610089997525263, 'Paid')],
           [Text(-0.5860163141087688, 0.12878229536070884, '93.1%'),
            Text(0.5860163110944014, -0.1287823090774105, '6.9%')])
           Free
          Insight: 93% of the Apps are Free in the Play Store
          4. Android Version
In [22]: df['Android Ver'].value_counts()
Out[22]: 4.0
                  5604
          0.0
                  1178
          2.0
                  1160
          5.0
                   499
          3.0
                   246
          1.0
                   105
          6.0
                    46
          7.0
                    45
                     5
          8.0
          Name: Android Ver, dtype: int64
          Count Plot of the various Versions
In [23]: sns.countplot(df['Android Ver'])
Out[23]: <matplotlib.axes._subplots.AxesSubplot at 0x1d9f7758988>
             5000
             4000
             3000
             2000
             1000
                      1.0
                           2.0
                                 3.0
                                      4.0
                                           5.0
                                                6.0
                                                    7.0
                  0.0
                                   Android Ver
          Insight: Most of the apps support Android 4.0 and above
          5. Most Popular Game in Play Store
In [24]: | data_cat=df[df['Category']=='GAME'].sort_values(['Installs'], ascending=0)[:20]
          ax = sns.barplot(x = 'Installs' , y = 'App' , data = data_cat )
          ax.set_xlabel('APPs')
          ax.set_ylabel('Most INSTALLED APP IN GAME CATO.')
          ax.set_title("Most Popular Game in Play Store", size = 20)
Out[24]: Text(0.5, 1.0, 'Most Popular Game in Play Store')
                           Most Popular Game in Play Store
               Subway Surfers
           APP IN GAME CATO.
                Temple Run 2
             Candy Crush Saga
               My Talking Tom
                       Pou
          T to S Angry Birds Classic
                                  0.2
                                                   0.6
                                                           0.8
                                                                    1.0
                         0.0
                                                                    le9
          Insight: Subway Surfer is the most popolar and installed app in game category
          6. Furthur Analysis
          Looking at the Apps with 5.0 ratings:
In [25]: df_full = df[df.Rating == 5]
          df_full.head()
Out[25]:
                                          App Category Rating Reviews Size Installs Type Price Genres Android Ver
           329
                        Hojiboy Tojiboyev Life Hacks
                                               COMICS
                                                          5.0
                                                                  15 37M
                                                                             1000 Free
                                                                                         0.0 Comics
                                                                                                           4.0
           612
                                               DATING
                                                                                             Dating
                      American Girls Mobile Numbers
                                                         5.0
                                                                   5 4.4M
                                                                             1000 Free
                                                                                                           4.0
                                                                                         0.0
           615
                                               DATING
                                                                              100 Free
                                   Awake Dating
                                                         5.0
                                                                   2 70M
                                                                                         0.0
                                                                                             Dating
                                                                                                           4.0
           633
                                               DATING
                             Spine- The dating app
                                                         5.0
                                                                   5 9.3M
                                                                              500 Free
                                                                                         0.0
                                                                                             Dating
                                                                                                           4.0
           636 Girls Live Talk - Free Text and Video Chat
                                               DATING
                                                          5.0
                                                                   6 5.0M
                                                                              100 Free
                                                                                         0.0 Dating
                                                                                                           4.0
          Insight: There are many Apps that have full ratings but less downloads/installs. So we can't really consider those apps as the
          best ones
          Therefore we consider the Apps with 5.0 Ratings and Maximum Installs :
In [26]: | df_full_maxinstalls = df_full[df.Installs > 1000]
          df_full_maxinstalls[['App', 'Category', 'Installs']]
Out[26]:
                                                  App
                                                        Category Installs
           7514
                      CL Keyboard - Myanmar Keyboard (No Ads)
                                                          TOOLS
                                                                   5000
```

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Tools

Genres

Insight: Apps related to Education, LifeStyle and Tools seem to fetch full Ratings with sufficient number of reviews.

Lifestyle

Productivity

Finance

Education

Oración CX LIFESTYLE

100 120 140

Ek Bander Ne Kholi Dukan

COMICS

FAMILY

Apps with very few reviews easily managed to get 5.0 ratings which can be misleading. So let's filter out the ones with more

print("No. of Apps having 5.0 Rating with sufficient Reviews: ",df_full.App.count())

5000

5000

10000

8058

9511

0.16 0.14 0.12 0.10 0.08 0.06 0.04 0.02 0.00

8260 Superheroes, Marvel, DC, Comics, TV, Movies News

In [27]: #Checking the No. of Reviews of 5.0 Rating Apps

Out[27]: <matplotlib.axes._subplots.AxesSubplot at 0x1d9f7a2dd48>

Reviews

Out[29]: <matplotlib.axes._subplots.AxesSubplot at 0x1d9f7b38f08>

No. of Apps having 5.0 Rating with sufficient Reviews: 11

sns.distplot(df_full.Reviews)

20

In [28]: df_full = df_full[df.Reviews > 40]

sns.countplot(df_full.Genres)

News & Magazines Photography

than 40 reviews.

In [29]: plt.figure(figsize=(12,5))

4.0

3.5

3.0

2.5

110 2.0

1.5

1.0

0.5