

akash-project-13

April 28, 2023

1 Google App Store Data Analysis

Project Title : Google App Store Data Analysis

Technologies : Data Science

Domain : Technology

Project Difficulties level : Intermediate

1.0.1 Author : AKASH.V

2 Import Libraries

The following libraries will be used: - 1. numpy: numerical analysis - 2. pandas: data analysis
- 3. seaborn and matplotlib: data vizualisation - 4. opendatasets: to download dataset

```
[ ]: import numpy as np
import matplotlib.pyplot as plt
import pandas as pd
import opendatasets as od
import seaborn as sns
import matplotlib.style as sty
import matplotlib.ticker as mtick
import matplotlib.gridspec as grid_specTrue
```

Read the dataset using pandas

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

Let us view the dataset and see the content

```
[4]: df.head()
```

```
[4]:
```

	App	Category	Rating	\
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	4.1	
1	Coloring book moana	ART_AND_DESIGN	3.9	
2	U Launcher Lite - FREE Live Cool Themes, Hide ...	ART_AND_DESIGN	4.7	
3	Sketch - Draw & Paint	ART_AND_DESIGN	4.5	
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	4.3	

	Reviews	Size	Installs	Type	Price	Content Rating	\
0	159	19M	10,000+	Free	0	Everyone	
1	967	14M	500,000+	Free	0	Everyone	
2	87510	8.7M	5,000,000+	Free	0	Everyone	
3	215644	25M	50,000,000+	Free	0	Teen	
4	967	2.8M	100,000+	Free	0	Everyone	

	Genres	Last Updated	Current Ver	\
0	Art & Design	January 7, 2018	1.0.0	
1	Art & Design;Pretend Play	January 15, 2018	2.0.0	
2	Art & Design	August 1, 2018	1.2.4	
3	Art & Design	June 8, 2018	Varies with device	
4	Art & Design;Creativity	June 20, 2018	1.1	

	Android Ver
0	4.0.3 and up
1	4.0.3 and up
2	4.0.3 and up
3	4.2 and up
4	4.4 and up

Overview of the dataset

```
[5]: print(df.info())
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 10841 entries, 0 to 10840
Data columns (total 13 columns):
#   Column          Non-Null Count  Dtype
---  -
0   App             10841 non-null  object
1   Category        10841 non-null  object
2   Rating          9367 non-null   float64
3   Reviews         10841 non-null  object
4   Size            10841 non-null  object
5   Installs        10841 non-null  object
6   Type            10840 non-null  object
7   Price           10841 non-null  object
8   Content Rating  10840 non-null  object
9   Genres          10841 non-null  object
10  Last Updated    10841 non-null  object
11  Current Ver     10833 non-null  object
12  Android Ver     10838 non-null  object
dtypes: float64(1), object(12)
memory usage: 1.1+ MB
None
```

The dataset has 13 columns and 10841 rows

Statistical Summary

```
[6]: df.describe().transpose()
```

```
[6]:
```

	count	mean	std	min	25%	50%	75%	max
Rating	9367.0	4.193338	0.537431	1.0	4.0	4.3	4.5	19.0

As it stands, only Ratings column as numerical values, others are object

```
[7]: # name of columns in the dataset

df.columns
```

```
[7]: Index(['App', 'Category', 'Rating', 'Reviews', 'Size', 'Installs', 'Type',
        'Price', 'Content Rating', 'Genres', 'Last Updated', 'Current Ver',
        'Android Ver'],
        dtype='object')
```

3 Data Cleaning

- ___I will replace the whitespace(s) in the columns name as '_' for better understanding___

```
[8]: df.columns = df.columns.str.replace(' ', '_')
```

Let us check if the changes occur or not

```
[9]: df.columns
```

```
[9]: Index(['App', 'Category', 'Rating', 'Reviews', 'Size', 'Installs', 'Type',
        'Price', 'Content_Rating', 'Genres', 'Last_Updated', 'Current_Ver',
        'Android_Ver'],
        dtype='object')
```

- Next, I will check the unique values in each column

```
[10]: for col in df:
        print(col)
        print(df[col].unique())
        print('-'*20)
```

App

```
['Photo Editor & Candy Camera & Grid & ScrapBook' 'Coloring book moana'
 'U Launcher Lite - FREE Live Cool Themes, Hide Apps' ...
 'Parkinson Exercices FR' 'The SCP Foundation DB fr nn5n'
 'iHoroscope - 2018 Daily Horoscope & Astrology']
```

Category

```
[ 'ART_AND_DESIGN' 'AUTO_AND_VEHICLES' 'BEAUTY' 'BOOKS_AND_REFERENCE'
  'BUSINESS' 'COMICS' 'COMMUNICATION' 'DATING' 'EDUCATION' 'ENTERTAINMENT'
  'EVENTS' 'FINANCE' 'FOOD_AND_DRINK' 'HEALTH_AND_FITNESS' 'HOUSE_AND_HOME'
  'LIBRARIES_AND_DEMO' 'LIFESTYLE' 'GAME' 'FAMILY' 'MEDICAL' 'SOCIAL'
  'SHOPPING' 'PHOTOGRAPHY' 'SPORTS' 'TRAVEL_AND_LOCAL' 'TOOLS'
  'PERSONALIZATION' 'PRODUCTIVITY' 'PARENTING' 'WEATHER' 'VIDEO_PLAYERS'
  'NEWS_AND_MAGAZINES' 'MAPS_AND_NAVIGATION' '1.9']
```

Rating

```
[ 4.1 3.9 4.7 4.5 4.3 4.4 3.8 4.2 4.6 3.2 4. nan 4.8 4.9
  3.6 3.7 3.3 3.4 3.5 3.1 5. 2.6 3. 1.9 2.5 2.8 2.7 1.
  2.9 2.3 2.2 1.7 2. 1.8 2.4 1.6 2.1 1.4 1.5 1.2 19. ]
```

Reviews

```
['159' '967' '87510' ... '603' '1195' '398307']
```

Size

```
['19M' '14M' '8.7M' '25M' '2.8M' '5.6M' '29M' '33M' '3.1M' '28M' '12M'
  '20M' '21M' '37M' '2.7M' '5.5M' '17M' '39M' '31M' '4.2M' '7.0M' '23M'
  '6.0M' '6.1M' '4.6M' '9.2M' '5.2M' '11M' '24M' 'Varies with device'
  '9.4M' '15M' '10M' '1.2M' '26M' '8.0M' '7.9M' '56M' '57M' '35M' '54M'
  '201k' '3.6M' '5.7M' '8.6M' '2.4M' '27M' '2.5M' '16M' '3.4M' '8.9M'
  '3.9M' '2.9M' '38M' '32M' '5.4M' '18M' '1.1M' '2.2M' '4.5M' '9.8M' '52M'
  '9.0M' '6.7M' '30M' '2.6M' '7.1M' '3.7M' '22M' '7.4M' '6.4M' '3.2M'
  '8.2M' '9.9M' '4.9M' '9.5M' '5.0M' '5.9M' '13M' '73M' '6.8M' '3.5M'
  '4.0M' '2.3M' '7.2M' '2.1M' '42M' '7.3M' '9.1M' '55M' '23k' '6.5M' '1.5M'
  '7.5M' '51M' '41M' '48M' '8.5M' '46M' '8.3M' '4.3M' '4.7M' '3.3M' '40M'
  '7.8M' '8.8M' '6.6M' '5.1M' '61M' '66M' '79k' '8.4M' '118k' '44M' '695k'
  '1.6M' '6.2M' '18k' '53M' '1.4M' '3.0M' '5.8M' '3.8M' '9.6M' '45M' '63M'
  '49M' '77M' '4.4M' '4.8M' '70M' '6.9M' '9.3M' '10.0M' '8.1M' '36M' '84M'
  '97M' '2.0M' '1.9M' '1.8M' '5.3M' '47M' '556k' '526k' '76M' '7.6M' '59M'
  '9.7M' '78M' '72M' '43M' '7.7M' '6.3M' '334k' '34M' '93M' '65M' '79M'
  '100M' '58M' '50M' '68M' '64M' '67M' '60M' '94M' '232k' '99M' '624k'
  '95M' '8.5k' '41k' '292k' '11k' '80M' '1.7M' '74M' '62M' '69M' '75M'
  '98M' '85M' '82M' '96M' '87M' '71M' '86M' '91M' '81M' '92M' '83M' '88M'
  '704k' '862k' '899k' '378k' '266k' '375k' '1.3M' '975k' '980k' '4.1M'
  '89M' '696k' '544k' '525k' '920k' '779k' '853k' '720k' '713k' '772k'
  '318k' '58k' '241k' '196k' '857k' '51k' '953k' '865k' '251k' '930k'
  '540k' '313k' '746k' '203k' '26k' '314k' '239k' '371k' '220k' '730k'
  '756k' '91k' '293k' '17k' '74k' '14k' '317k' '78k' '924k' '902k' '818k'
  '81k' '939k' '169k' '45k' '475k' '965k' '90M' '545k' '61k' '283k' '655k'
  '714k' '93k' '872k' '121k' '322k' '1.0M' '976k' '172k' '238k' '549k'
  '206k' '954k' '444k' '717k' '210k' '609k' '308k' '705k' '306k' '904k'
  '473k' '175k' '350k' '383k' '454k' '421k' '70k' '812k' '442k' '842k'
  '417k' '412k' '459k' '478k' '335k' '782k' '721k' '430k' '429k' '192k'
  '200k' '460k' '728k' '496k' '816k' '414k' '506k' '887k' '613k' '243k'
  '569k' '778k' '683k' '592k' '319k' '186k' '840k' '647k' '191k' '373k'
  '437k' '598k' '716k' '585k' '982k' '222k' '219k' '55k' '948k' '323k']
```

'691k' '511k' '951k' '963k' '25k' '554k' '351k' '27k' '82k' '208k' '913k'
'514k' '551k' '29k' '103k' '898k' '743k' '116k' '153k' '209k' '353k'
'499k' '173k' '597k' '809k' '122k' '411k' '400k' '801k' '787k' '237k'
'50k' '643k' '986k' '97k' '516k' '837k' '780k' '961k' '269k' '20k' '498k'
'600k' '749k' '642k' '881k' '72k' '656k' '601k' '221k' '228k' '108k'
'940k' '176k' '33k' '663k' '34k' '942k' '259k' '164k' '458k' '245k'
'629k' '28k' '288k' '775k' '785k' '636k' '916k' '994k' '309k' '485k'
'914k' '903k' '608k' '500k' '54k' '562k' '847k' '957k' '688k' '811k'
'270k' '48k' '329k' '523k' '921k' '874k' '981k' '784k' '280k' '24k'
'518k' '754k' '892k' '154k' '860k' '364k' '387k' '626k' '161k' '879k'
'39k' '970k' '170k' '141k' '160k' '144k' '143k' '190k' '376k' '193k'
'246k' '73k' '658k' '992k' '253k' '420k' '404k' '1,000+' '470k' '226k'
'240k' '89k' '234k' '257k' '861k' '467k' '157k' '44k' '676k' '67k' '552k'
'885k' '1020k' '582k' '619k']

Installs

['10,000+' '500,000+' '5,000,000+' '50,000,000+' '100,000+' '50,000+'
'1,000,000+' '10,000,000+' '5,000+' '100,000,000+' '1,000,000,000+'
'1,000+' '500,000,000+' '50+' '100+' '500+' '10+' '1+' '5+' '0+' '0'
'Free']

Type

['Free' 'Paid' nan '0']

Price

['0' '\$4.99' '\$3.99' '\$6.99' '\$1.49' '\$2.99' '\$7.99' '\$5.99' '\$3.49'
'\$1.99' '\$9.99' '\$7.49' '\$0.99' '\$9.00' '\$5.49' '\$10.00' '\$24.99'
'\$11.99' '\$79.99' '\$16.99' '\$14.99' '\$1.00' '\$29.99' '\$12.99' '\$2.49'
'\$10.99' '\$1.50' '\$19.99' '\$15.99' '\$33.99' '\$74.99' '\$39.99' '\$3.95'
'\$4.49' '\$1.70' '\$8.99' '\$2.00' '\$3.88' '\$25.99' '\$399.99' '\$17.99'
'\$400.00' '\$3.02' '\$1.76' '\$4.84' '\$4.77' '\$1.61' '\$2.50' '\$1.59' '\$6.49'
'\$1.29' '\$5.00' '\$13.99' '\$299.99' '\$379.99' '\$37.99' '\$18.99' '\$389.99'
'\$19.90' '\$8.49' '\$1.75' '\$14.00' '\$4.85' '\$46.99' '\$109.99' '\$154.99'
'\$3.08' '\$2.59' '\$4.80' '\$1.96' '\$19.40' '\$3.90' '\$4.59' '\$15.46' '\$3.04'
'\$4.29' '\$2.60' '\$3.28' '\$4.60' '\$28.99' '\$2.95' '\$2.90' '\$1.97'
'\$200.00' '\$89.99' '\$2.56' '\$30.99' '\$3.61' '\$394.99' '\$1.26' 'Everyone'
'\$1.20' '\$1.04']

Content_Rating

['Everyone' 'Teen' 'Everyone 10+' 'Mature 17+' 'Adults only 18+' 'Unrated'
nan]

Genres

['Art & Design' 'Art & Design;Pretend Play' 'Art & Design;Creativity'
'Art & Design;Action & Adventure' 'Auto & Vehicles' 'Beauty'
'Books & Reference' 'Business' 'Comics' 'Comics;Creativity'
'Communication' 'Dating' 'Education;Education' 'Education'
'Education;Creativity' 'Education;Music & Video']

'Education;Action & Adventure' 'Education;Pretend Play'
 'Education;Brain Games' 'Entertainment' 'Entertainment;Music & Video'
 'Entertainment;Brain Games' 'Entertainment;Creativity' 'Events' 'Finance'
 'Food & Drink' 'Health & Fitness' 'House & Home' 'Libraries & Demo'
 'Lifestyle' 'Lifestyle;Pretend Play' 'Adventure;Action & Adventure'
 'Arcade' 'Casual' 'Card' 'Casual;Pretend Play' 'Action' 'Strategy'
 'Puzzle' 'Sports' 'Music' 'Word' 'Racing' 'Casual;Creativity'
 'Casual;Action & Adventure' 'Simulation' 'Adventure' 'Board' 'Trivia'
 'Role Playing' 'Simulation;Education' 'Action;Action & Adventure'
 'Casual;Brain Games' 'Simulation;Action & Adventure'
 'Educational;Creativity' 'Puzzle;Brain Games' 'Educational;Education'
 'Card;Brain Games' 'Educational;Brain Games' 'Educational;Pretend Play'
 'Entertainment;Education' 'Casual;Education' 'Music;Music & Video'
 'Racing;Action & Adventure' 'Arcade;Pretend Play'
 'Role Playing;Action & Adventure' 'Simulation;Pretend Play'
 'Puzzle;Creativity' 'Sports;Action & Adventure'
 'Educational;Action & Adventure' 'Arcade;Action & Adventure'
 'Entertainment;Action & Adventure' 'Puzzle;Action & Adventure'
 'Strategy;Action & Adventure' 'Music & Audio;Music & Video'
 'Health & Fitness;Education' 'Adventure;Education' 'Board;Brain Games'
 'Board;Action & Adventure' 'Board;Pretend Play' 'Casual;Music & Video'
 'Role Playing;Pretend Play' 'Entertainment;Pretend Play'
 'Video Players & Editors;Creativity' 'Card;Action & Adventure' 'Medical'
 'Social' 'Shopping' 'Photography' 'Travel & Local'
 'Travel & Local;Action & Adventure' 'Tools' 'Tools;Education'
 'Personalization' 'Productivity' 'Parenting' 'Parenting;Music & Video'
 'Parenting;Education' 'Parenting;Brain Games' 'Weather'
 'Video Players & Editors' 'Video Players & Editors;Music & Video'
 'News & Magazines' 'Maps & Navigation'
 'Health & Fitness;Action & Adventure' 'Educational' 'Casino'
 'Adventure;Brain Games' 'Trivia;Education' 'Lifestyle;Education'
 'Books & Reference;Creativity' 'Books & Reference;Education'
 'Puzzle;Education' 'Role Playing;Education' 'Role Playing;Brain Games'
 'Strategy;Education' 'Racing;Pretend Play' 'Communication;Creativity'
 'February 11, 2018' 'Strategy;Creativity']

 Last_Updated

['January 7, 2018' 'January 15, 2018' 'August 1, 2018' ...
 'January 20, 2014' 'February 16, 2014' 'March 23, 2014']

 Current_Ver

['1.0.0' '2.0.0' '1.2.4' ... '1.0.612928' '0.3.4' '2.0.148.0']

 Android_Ver

['4.0.3 and up' '4.2 and up' '4.4 and up' '2.3 and up' '3.0 and up'
 '4.1 and up' '4.0 and up' '2.3.3 and up' 'Varies with device'
 '2.2 and up' '5.0 and up' '6.0 and up' '1.6 and up' '1.5 and up'
 '2.1 and up' '7.0 and up' '5.1 and up' '4.3 and up' '4.0.3 - 7.1.1'

```
'2.0 and up' '3.2 and up' '4.4W and up' '7.1 and up' '7.0 - 7.1.1'
'8.0 and up' '5.0 - 8.0' '3.1 and up' '2.0.1 and up' '4.1 - 7.1.1' nan
'5.0 - 6.0' '1.0 and up' '2.2 - 7.1.1' '5.0 - 7.1.1']
```

Check for duplicated data

```
[11]: df[df.duplicated()]
```

```
[11]:
```

	App	Category	Rating	\
229	Quick PDF Scanner + OCR	BUSINESS	4.2	
236	Box	BUSINESS	4.2	
239	Google My Business	BUSINESS	4.4	
256	ZOOM Cloud Meetings	BUSINESS	4.4	
261	join.me - Simple Meetings	BUSINESS	4.0	
...	
8643	Wunderlist: To-Do List & Tasks	PRODUCTIVITY	4.6	
8654	TickTick: To Do List with Reminder, Day Planner	PRODUCTIVITY	4.6	
8658	ColorNote Notepad Notes	PRODUCTIVITY	4.6	
10049	Airway Ex - Intubate. Anesthetize. Train.	MEDICAL	4.3	
10768	AAFP	MEDICAL	3.8	

	Reviews	Size	Installs	Type	Price	Content_Rating	\
229	80805	Varies with device	5,000,000+	Free	0	Everyone	
236	159872	Varies with device	10,000,000+	Free	0	Everyone	
239	70991	Varies with device	5,000,000+	Free	0	Everyone	
256	31614	37M	10,000,000+	Free	0	Everyone	
261	6989	Varies with device	1,000,000+	Free	0	Everyone	
...	
8643	404610	Varies with device	10,000,000+	Free	0	Everyone	
8654	25370	Varies with device	1,000,000+	Free	0	Everyone	
8658	2401017	Varies with device	100,000,000+	Free	0	Everyone	
10049	123	86M	10,000+	Free	0	Everyone	
10768	63	24M	10,000+	Free	0	Everyone	

	Genres	Last_Updated	Current_Ver	Android_Ver
229	Business	February 26, 2018	Varies with device	4.0.3 and up
236	Business	July 31, 2018	Varies with device	Varies with device
239	Business	July 24, 2018	2.19.0.204537701	4.4 and up
256	Business	July 20, 2018	4.1.28165.0716	4.0 and up
261	Business	July 16, 2018	4.3.0.508	4.4 and up
...
8643	Productivity	April 6, 2018	Varies with device	Varies with device
8654	Productivity	August 6, 2018	Varies with device	Varies with device
8658	Productivity	June 27, 2018	Varies with device	Varies with device
10049	Medical	June 1, 2018	0.6.88	5.0 and up
10768	Medical	June 22, 2018	2.3.1	5.0 and up

[483 rows x 13 columns]

There are 483 entries that are duplicate, then, there may be a chance that the App name, and one of the other columns has the same entries. Therefore, I will find duplicate entries across the columns and drop any row with same entries

```
[12]: df.drop_duplicates(['App', 'Size', 'Installs', 'Type', 'Genres'], inplace=True)
      df.duplicated().sum()
```

```
[12]: 0
```

Next, I will take care of NaN entries in the dataset

```
[13]: df.isna().sum()
```

```
[13]: App                0
      Category          0
      Rating          1464
      Reviews           0
      Size              0
      Installs          0
      Type              1
      Price             0
      Content_Rating    1
      Genres            0
      Last_Updated      0
      Current_Ver       8
      Android_Ver       3
      dtype: int64
```

Rating column has 1464 NaN entries, while Current_Ver and Android_Ver has 8 and 3 respectively

```
[14]: missing_rows = df.isnull()
```

```
[15]: for col in missing_rows.columns.values.tolist():
      print(col)
      print(missing_rows[col].value_counts())
      print('-'*20)
```

```
App
False    9681
Name: App, dtype: int64
-----
Category
False    9681
Name: Category, dtype: int64
-----
Rating
```



```

False      8217
True       1464
Name: Rating, dtype: int64
-----

Reviews
False      9681
Name: Reviews, dtype: int64
-----

Size
False      9681
Name: Size, dtype: int64
-----

Installs
False      9681
Name: Installs, dtype: int64
-----

Type
False      9680
True        1
Name: Type, dtype: int64
-----

Price
False      9681
Name: Price, dtype: int64
-----

Content_Rating
False      9680
True        1
Name: Content_Rating, dtype: int64
-----

Genres
False      9681
Name: Genres, dtype: int64
-----

Last_Updated
False      9681
Name: Last_Updated, dtype: int64
-----

Current_Ver
False      9673
True        8
Name: Current_Ver, dtype: int64
-----

Android_Ver
False      9678
True        3
Name: Android_Ver, dtype: int64
-----

```

The NaN values will be dropped because the Rating column having the most NaN value is part of EDA

```
[16]: df.dropna(inplace=True)

df.isna().sum()
```

```
[16]: App          0
      Category     0
      Rating       0
      Reviews      0
      Size         0
      Installs     0
      Type         0
      Price        0
      Content_Rating 0
      Genres       0
      Last_Updated 0
      Current_Ver  0
      Android_Ver  0
      dtype: int64
```

Now, I will clean the data column by column

Price column

```
[17]: df.Price.unique()
```

```
[17]: array(['0', '$4.99', '$3.99', '$6.99', '$7.99', '$5.99', '$2.99', '$3.49',
        '$1.99', '$9.99', '$7.49', '$0.99', '$9.00', '$5.49', '$10.00',
        '$24.99', '$11.99', '$79.99', '$16.99', '$14.99', '$29.99',
        '$12.99', '$2.49', '$10.99', '$1.50', '$19.99', '$15.99', '$33.99',
        '$39.99', '$3.95', '$4.49', '$1.70', '$8.99', '$1.49', '$3.88',
        '$399.99', '$17.99', '$400.00', '$3.02', '$1.76', '$4.84', '$4.77',
        '$1.61', '$2.50', '$1.59', '$6.49', '$1.29', '$299.99', '$379.99',
        '$37.99', '$18.99', '$389.99', '$8.49', '$1.75', '$14.00', '$2.00',
        '$3.08', '$2.59', '$19.40', '$3.90', '$4.59', '$15.46', '$3.04',
        '$13.99', '$4.29', '$3.28', '$4.60', '$1.00', '$2.95', '$2.90',
        '$1.97', '$2.56', '$1.20'], dtype=object)
```

I will strip the \$ sign in the Price column to have the column in floating point

```
[18]: df.Price = df.Price.apply(lambda x: x.replace('$', '').replace(',','')
                                if isinstance(x, str) else x).astype(float)
```

```
[19]: df.Price.unique()
```

```
[19]: array([ 0. ,  4.99,  3.99,  6.99,  7.99,  5.99,  2.99,  3.49,
        1.99,  9.99,  7.49,  0.99,  9. ,  5.49, 10. , 24.99,
```

```

11.99, 79.99, 16.99, 14.99, 29.99, 12.99, 2.49, 10.99,
1.5 , 19.99, 15.99, 33.99, 39.99, 3.95, 4.49, 1.7 ,
8.99, 1.49, 3.88, 399.99, 17.99, 400. , 3.02, 1.76,
4.84, 4.77, 1.61, 2.5 , 1.59, 6.49, 1.29, 299.99,
379.99, 37.99, 18.99, 389.99, 8.49, 1.75, 14. , 2. ,
3.08, 2.59, 19.4 , 3.9 , 4.59, 15.46, 3.04, 13.99,
4.29, 3.28, 4.6 , 1. , 2.95, 2.9 , 1.97, 2.56,
1.2 ])

```

Let us check the changes

```
[20]: df.info()
```

```

<class 'pandas.core.frame.DataFrame'>
Int64Index: 8210 entries, 0 to 10840
Data columns (total 13 columns):
#   Column          Non-Null Count  Dtype
---  -
0   App             8210 non-null   object
1   Category        8210 non-null   object
2   Rating          8210 non-null   float64
3   Reviews         8210 non-null   object
4   Size            8210 non-null   object
5   Installs        8210 non-null   object
6   Type            8210 non-null   object
7   Price           8210 non-null   float64
8   Content_Rating  8210 non-null   object
9   Genres          8210 non-null   object
10  Last_Updated    8210 non-null   object
11  Current_Ver     8210 non-null   object
12  Android_Ver     8210 non-null   object
dtypes: float64(2), object(11)
memory usage: 898.0+ KB

```

```
[21]: df.Reviews = df.Reviews.astype(int)

df.Reviews.unique()
```

```
[21]: array([ 159,   967, 87510, ...,   603,  1195, 398307])
```

Size Column

```
[22]: df.Size.unique()
```

```
[22]: array(['19M', '14M', '8.7M', '25M', '2.8M', '5.6M', '29M', '33M', '3.1M',
'28M', '12M', '20M', '21M', '37M', '5.5M', '17M', '39M', '31M',
'4.2M', '23M', '6.0M', '6.1M', '4.6M', '9.2M', '5.2M', '11M',
'24M', 'Varies with device', '9.4M', '15M', '10M', '1.2M', '26M',
```

```

'8.0M', '7.9M', '56M', '57M', '35M', '54M', '201k', '3.6M', '5.7M',
'8.6M', '2.4M', '27M', '2.7M', '2.5M', '7.0M', '16M', '3.4M',
'8.9M', '3.9M', '2.9M', '38M', '32M', '5.4M', '18M', '1.1M',
'2.2M', '4.5M', '9.8M', '52M', '9.0M', '6.7M', '30M', '2.6M',
'7.1M', '22M', '6.4M', '3.2M', '8.2M', '4.9M', '9.5M', '5.0M',
'5.9M', '13M', '73M', '6.8M', '3.5M', '4.0M', '2.3M', '2.1M',
'42M', '9.1M', '55M', '23k', '7.3M', '6.5M', '1.5M', '7.5M', '51M',
'41M', '48M', '8.5M', '46M', '8.3M', '4.3M', '4.7M', '3.3M', '40M',
'7.8M', '8.8M', '6.6M', '5.1M', '61M', '66M', '79k', '8.4M',
'3.7M', '118k', '44M', '695k', '1.6M', '6.2M', '53M', '1.4M',
'3.0M', '7.2M', '5.8M', '3.8M', '9.6M', '45M', '63M', '49M', '77M',
'4.4M', '70M', '9.3M', '8.1M', '36M', '6.9M', '7.4M', '84M', '97M',
'2.0M', '1.9M', '1.8M', '5.3M', '47M', '556k', '526k', '76M',
'7.6M', '59M', '9.7M', '78M', '72M', '43M', '7.7M', '6.3M', '334k',
'93M', '65M', '79M', '100M', '58M', '50M', '68M', '64M', '34M',
'67M', '60M', '94M', '9.9M', '232k', '99M', '624k', '95M', '8.5k',
'41k', '292k', '80M', '1.7M', '10.0M', '74M', '62M', '69M', '75M',
'98M', '85M', '82M', '96M', '87M', '71M', '86M', '91M', '81M',
'92M', '83M', '88M', '704k', '862k', '899k', '378k', '4.8M',
'266k', '375k', '1.3M', '975k', '980k', '4.1M', '89M', '696k',
'544k', '525k', '920k', '779k', '853k', '720k', '713k', '772k',
'318k', '58k', '241k', '196k', '857k', '51k', '953k', '865k',
'251k', '930k', '540k', '313k', '746k', '203k', '26k', '314k',
'239k', '371k', '220k', '730k', '756k', '91k', '293k', '17k',
'74k', '14k', '317k', '78k', '924k', '818k', '81k', '939k', '169k',
'45k', '965k', '90M', '545k', '61k', '283k', '655k', '714k', '93k',
'872k', '121k', '322k', '976k', '206k', '954k', '444k', '717k',
'210k', '609k', '308k', '306k', '175k', '350k', '383k', '454k',
'1.0M', '70k', '812k', '442k', '842k', '417k', '412k', '459k',
'478k', '335k', '782k', '721k', '430k', '429k', '192k', '460k',
'728k', '496k', '816k', '414k', '506k', '887k', '613k', '778k',
'683k', '592k', '186k', '840k', '647k', '373k', '437k', '598k',
'716k', '585k', '982k', '219k', '55k', '323k', '691k', '511k',
'951k', '963k', '25k', '554k', '351k', '27k', '82k', '208k',
'551k', '29k', '103k', '116k', '153k', '209k', '499k', '173k',
'597k', '809k', '122k', '411k', '400k', '801k', '787k', '50k',
'643k', '986k', '516k', '837k', '780k', '20k', '498k', '600k',
'656k', '221k', '228k', '176k', '34k', '259k', '164k', '458k',
'629k', '28k', '288k', '775k', '785k', '636k', '916k', '994k',
'309k', '485k', '914k', '903k', '608k', '500k', '54k', '562k',
'847k', '948k', '811k', '270k', '48k', '523k', '784k', '280k',
'24k', '892k', '154k', '18k', '33k', '860k', '364k', '387k',
'626k', '161k', '879k', '39k', '170k', '141k', '160k', '144k',
'143k', '190k', '376k', '193k', '473k', '246k', '73k', '253k',
'957k', '420k', '72k', '404k', '470k', '226k', '240k', '89k',
'234k', '257k', '861k', '467k', '676k', '552k', '582k', '619k'],
dtype=object)

```

For Size column to make better sense, I will strip the M and k and covert the values to Kilobyte

```
[23]: df = df[df.Size != 'Varies with device']
```

```
[24]: df['Si'] = df.Size.str[: -1].astype(float)
df['KM'] = df.Size.str[-1]
df['KM'] = df.KM.replace(['k', 'M'], [1, 1024])
```

```
[25]: df.KM.unique()
```

```
[25]: array([1024,    1])
```

```
[26]: df.Size = df.KM * df.Si
```

```
[27]: df.Installs.unique()
```

```
[27]: array(['10,000+', '500,000+', '5,000,000+', '50,000,000+', '100,000+',
          '50,000+', '1,000,000+', '10,000,000+', '5,000+', '100,000,000+',
          '1,000+', '500,000,000+', '100+', '500+', '10+', '1,000,000,000+',
          '5+', '50+', '1+'], dtype=object)
```

```
[28]: df.Type.unique()
```

```
[28]: array(['Free', 'Paid'], dtype=object)
```

```
[29]: df[df.Rating > 5]
```

```
[29]: Empty DataFrame
Columns: [App, Category, Rating, Reviews, Size, Installs, Type, Price,
Content_Rating, Genres, Last_Updated, Current_Ver, Android_Ver, Si, KM]
Index: []
```

Recode the install column

```
[30]: df.Installs.unique()
```

```
[30]: array(['10,000+', '500,000+', '5,000,000+', '50,000,000+', '100,000+',
          '50,000+', '1,000,000+', '10,000,000+', '5,000+', '100,000,000+',
          '1,000+', '500,000,000+', '100+', '500+', '10+', '1,000,000,000+',
          '5+', '50+', '1+'], dtype=object)
```

```
[31]: df.Installs = df.Installs.map({'10,000+' : 10000, '1,000+' : 1000, '5,000+' : 5000,
    ↪ '50,000+' : 50000, '100,000+' : 100000, '100+' : 100,
    ↪ '10+' : 10, '500+' : 500, '50+' : 50, '10,000,000+' :
    ↪ 1000000000, '1,000,000+' : 1000000, '500,000+' : 500000,
    ↪ '1+' : 1, '5,000,000+' : 5000000, '50,000,000+' :
    ↪ 500000000, '100,000,000+' : 1000000000,
```

```
'1,000,000,000+' : 1000000000, '500,000,000+' : 500000000, '5+' : 5})
```

```
[32]: df.drop(columns= ['Si', 'KM'], inplace=True)
```

Now, Let us check our data very well before moving to EDA

```
[33]: df.head()
```

```
[33]:
```

	App	Category	Rating \
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	4.1
1	Coloring book moana	ART_AND_DESIGN	3.9
2	U Launcher Lite - FREE Live Cool Themes, Hide ...	ART_AND_DESIGN	4.7
3	Sketch - Draw & Paint	ART_AND_DESIGN	4.5
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	4.3

	Reviews	Size	Installs	Type	Price	Content_Rating \
0	159	19456.0	10000	Free	0.0	Everyone
1	967	14336.0	500000	Free	0.0	Everyone
2	87510	8908.8	5000000	Free	0.0	Everyone
3	215644	25600.0	50000000	Free	0.0	Teen
4	967	2867.2	100000	Free	0.0	Everyone

	Genres	Last_Updated	Current_Ver \
0	Art & Design	January 7, 2018	1.0.0
1	Art & Design;Pretend Play	January 15, 2018	2.0.0
2	Art & Design	August 1, 2018	1.2.4
3	Art & Design	June 8, 2018	Varies with device
4	Art & Design;Creativity	June 20, 2018	1.1

	Android_Ver
0	4.0.3 and up
1	4.0.3 and up
2	4.0.3 and up
3	4.2 and up
4	4.4 and up

```
[34]: df.describe().transpose()
```

```
[34]:
```

	count	mean	std	min	25%	50% \
Rating	7039.0	4.161202e+00	5.587983e-01	1.0	4.0	4.3
Reviews	7039.0	1.459494e+05	1.027101e+06	1.0	85.0	1563.0
Size	7039.0	2.228158e+04	2.326649e+04	8.5	5017.6	13312.0
Installs	7039.0	1.791602e+07	1.717069e+08	1.0	10000.0	100000.0
Price	7039.0	1.171219e+00	1.818216e+01	0.0	0.0	0.0

75% max

Rating	4.5	5.000000e+00
Reviews	26848.0	4.489172e+07
Size	31744.0	1.024000e+05
Installs	1000000.0	5.000000e+09
Price	0.0	4.000000e+02

```
[35]: jovian.commit(project='GooglePlayStore_Project', environment=None)
```

```
<IPython.core.display.Javascript object>
```

```
[jovian] Updating notebook "huygens123/googleplaystore-project" on  
https://jovian.ai
```

```
[jovian] Committed successfully! https://jovian.ai/huygens123/googleplaystore-  
project
```

```
[35]: 'https://jovian.ai/huygens123/googleplaystore-project'
```

4 Exploratory Data Analysis

- Let us check the type of data set available

```
[36]: #for categorical variable
categorical = [variable for variable in df.columns
               if df[variable].dtype == 'O']

# for numerical variable
numerical = [variable for variable in df.columns
             if df[variable].dtype != 'O']

print('The number of categorical variables in the dataset is: {}'.
      ↪format(len(categorical)))
print('The number of numerical variables in the dataset is: {}'.
      ↪format(len(numerical)))
```

```
The number of categorical variables in the dataset is: 8
```

```
The number of numerical variables in the dataset is: 5
```

What is the correlation among the numerical variables?

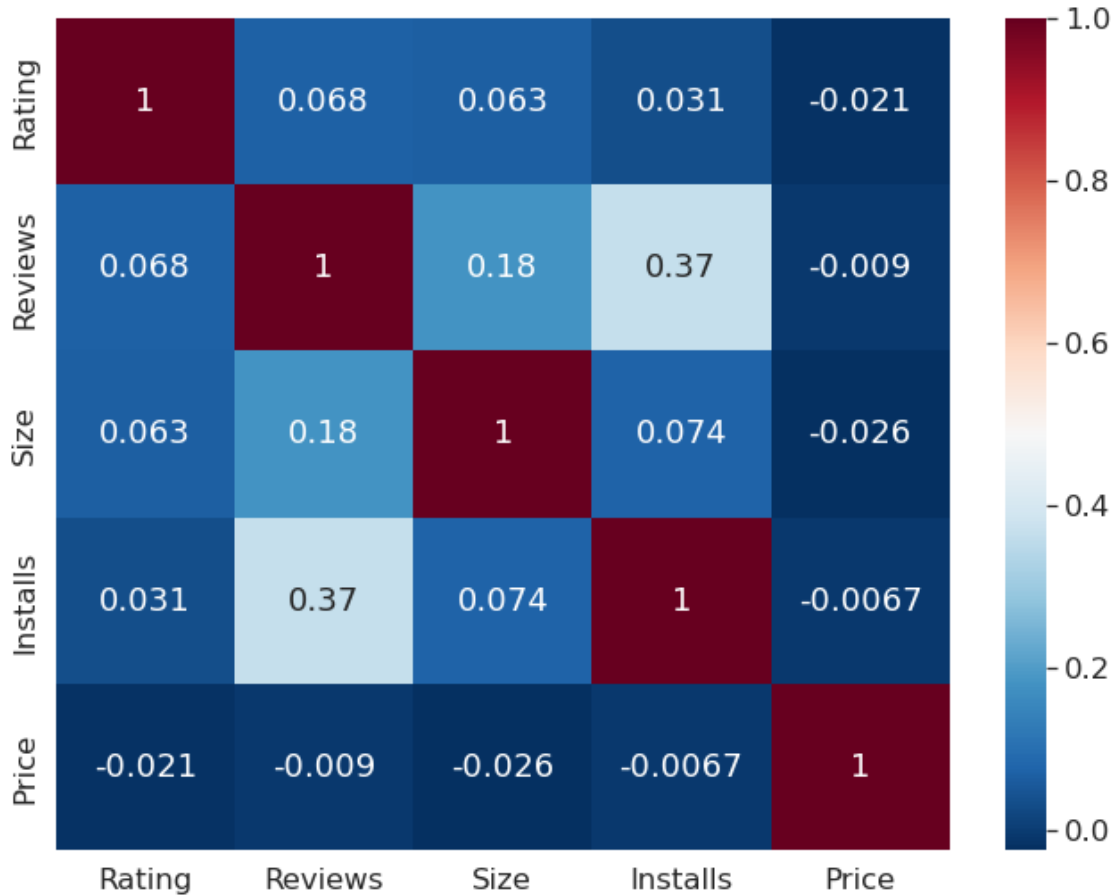
```
[37]: df.corr()
```

```
[37]:
```

	Rating	Reviews	Size	Installs	Price
Rating	1.000000	0.067801	0.062779	0.031256	-0.021205
Reviews	0.067801	1.000000	0.181866	0.365966	-0.009030
Size	0.062779	0.181866	1.000000	0.074399	-0.025697
Installs	0.031256	0.365966	0.074399	1.000000	-0.006709
Price	-0.021205	-0.009030	-0.025697	-0.006709	1.000000

Let us vizualise this using heatmap

```
[38]: plt.figure(figsize=(10, 8))
sns.heatmap(df.corr(), cmap = 'RdBu_r', annot= True);
```



Installs column and Reviews column have the best correlation followed by Size and Review

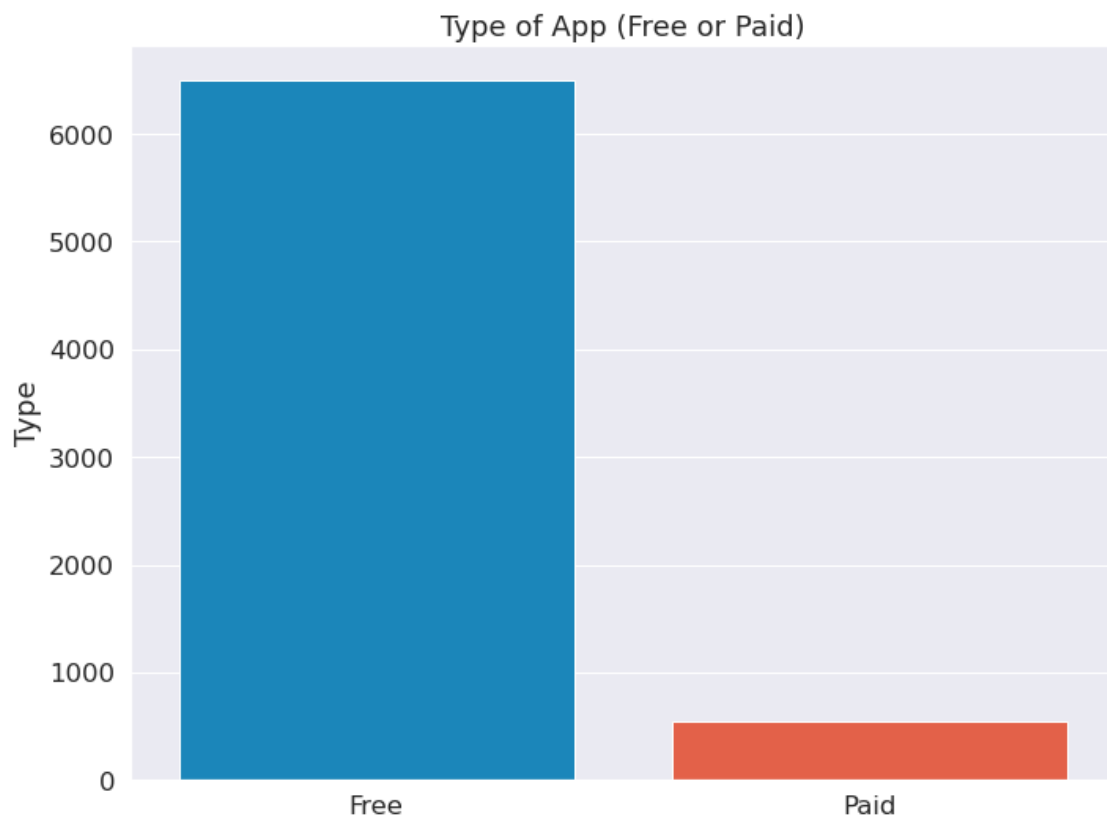
Let us check and vizualise how the type of App are distributed i.e free or paid

```
[39]: Type = df.Type.value_counts()
Type
```

```
[39]: Free    6500
Paid     539
Name: Type, dtype: int64
```

So, there are 6,500 apps that are free while the other 539 are paid app


```
[40]: plt.figure(figsize=(10, 8))
sns.barplot(x = Type.index, y = Type);
plt.title("Type of App (Free or Paid)");
```



4.0.1 Category

First, let's check the number of App in each Category

```
[41]: Category = df.Category.value_counts()
Category
```

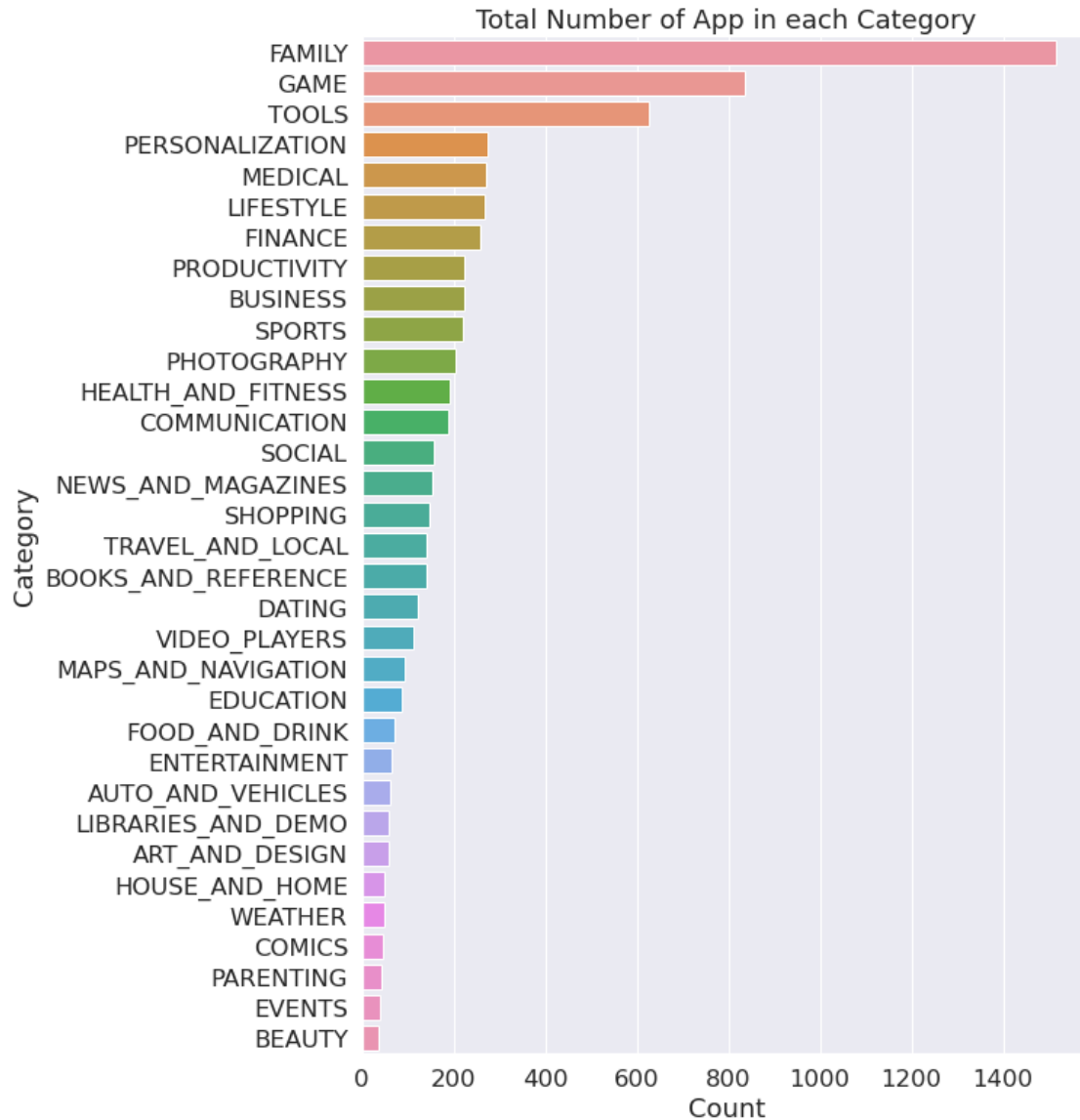
```
[41]: FAMILY          1515
GAME                835
TOOLS               627
PERSONALIZATION    274
MEDICAL            270
LIFESTYLE          269
FINANCE            258
PRODUCTIVITY       224
BUSINESS           222
SPORTS             221
```

PHOTOGRAPHY	206
HEALTH_AND_FITNESS	191
COMMUNICATION	189
SOCIAL	156
NEWS_AND_MAGAZINES	154
SHOPPING	146
TRAVEL_AND_LOCAL	141
BOOKS_AND_REFERENCE	141
DATING	122
VIDEO_PLAYERS	113
MAPS_AND_NAVIGATION	94
EDUCATION	88
FOOD_AND_DRINK	72
ENTERTAINMENT	64
AUTO_AND_VEHICLES	63
LIBRARIES_AND_DEMO	60
ART_AND_DESIGN	58
HOUSE_AND_HOME	50
WEATHER	50
COMICS	47
PARENTING	44
EVENTS	38
BEAUTY	37

Name: Category, dtype: int64

Family has the highest number of App (1515) while Beauty is lowest represented (37)

```
[42]: plt.figure(figsize=(8, 12))
sns.barplot(y = Category.index, x = Category)
plt.ylabel('Category')
plt.xlabel('Count')
plt.title("Total Number of App in each Category");
```



4.0.2 Content Ratings

Next, Let us check the distribution of `Content_Rating` column

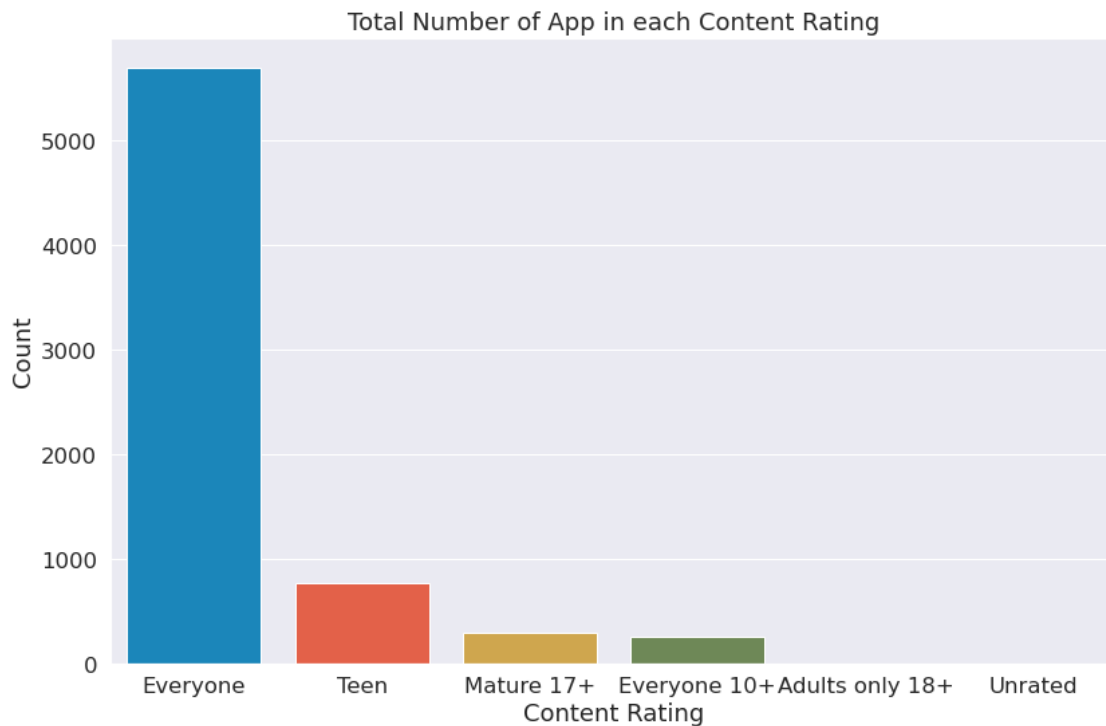
```
[43]: Content_Rating = df.Content_Rating.value_counts()
      Content_Rating
```

```
[43]: Everyone          5694
      Teen              779
      Mature 17+        304
      Everyone 10+       259
      Adults only 18+     2
```

```
Unrated      1
Name: Content_Rating, dtype: int64
```

Majority of the Apps is either for Everyone or for Teen. Let us vizualise this with bar chart

```
[44]: plt.figure(figsize= (12, 8))
sns.barplot(x = Content_Rating.index, y = Content_Rating)
plt.ylabel('Count')
plt.xlabel('Content Rating')
plt.title("Total Number of App in each Content Rating");
```



4.0.3 Genres

```
[45]: Genre = df.Genres.value_counts()
Genre
```

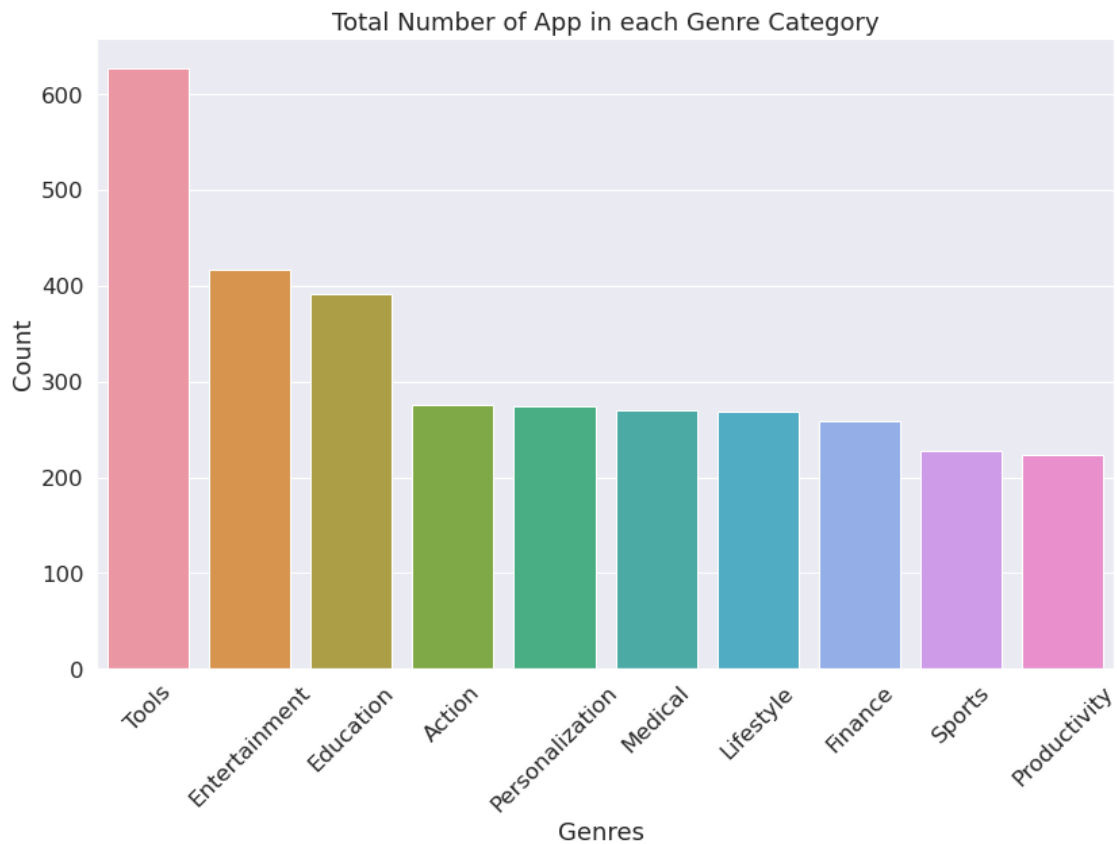
```
[45]: Tools      627
Entertainment  417
Education     392
Action        276
Personalization 274
...
Card;Brain Games 1
```

```
Lifestyle;Pretend Play      1
Education;Brain Games      1
Comics;Creativity          1
Strategy;Creativity         1
Name: Genres, Length: 112, dtype: int64
```

Tools app and Entertainment app take the lead while Strategy and Creativity app are least represented

```
[46]: # visualize to 10 Genres
Genre = Genre.sort_values(ascending=False).head(10)
```

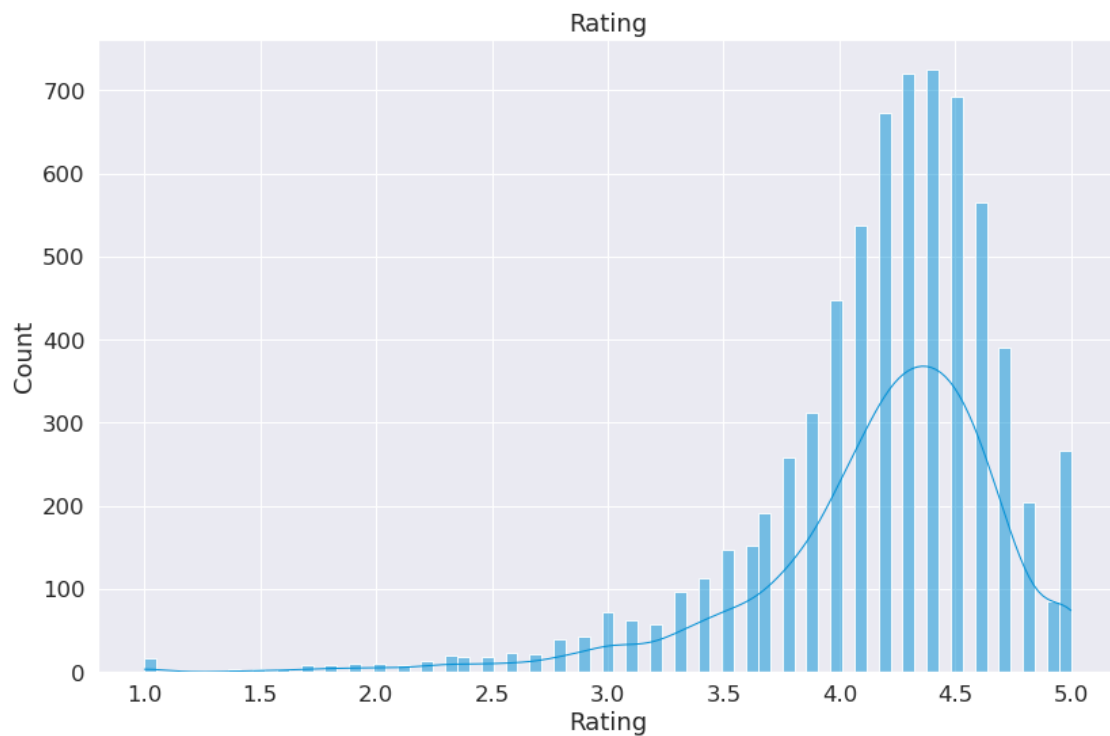
```
[47]: plt.figure(figsize= (12, 8))
sns.barplot(x = Genre.index, y = Genre)
plt.ylabel('Count')
plt.xlabel('Genres ')
plt.title("Total Number of App in each Genre Category")
plt.xticks(rotation = 45);
```

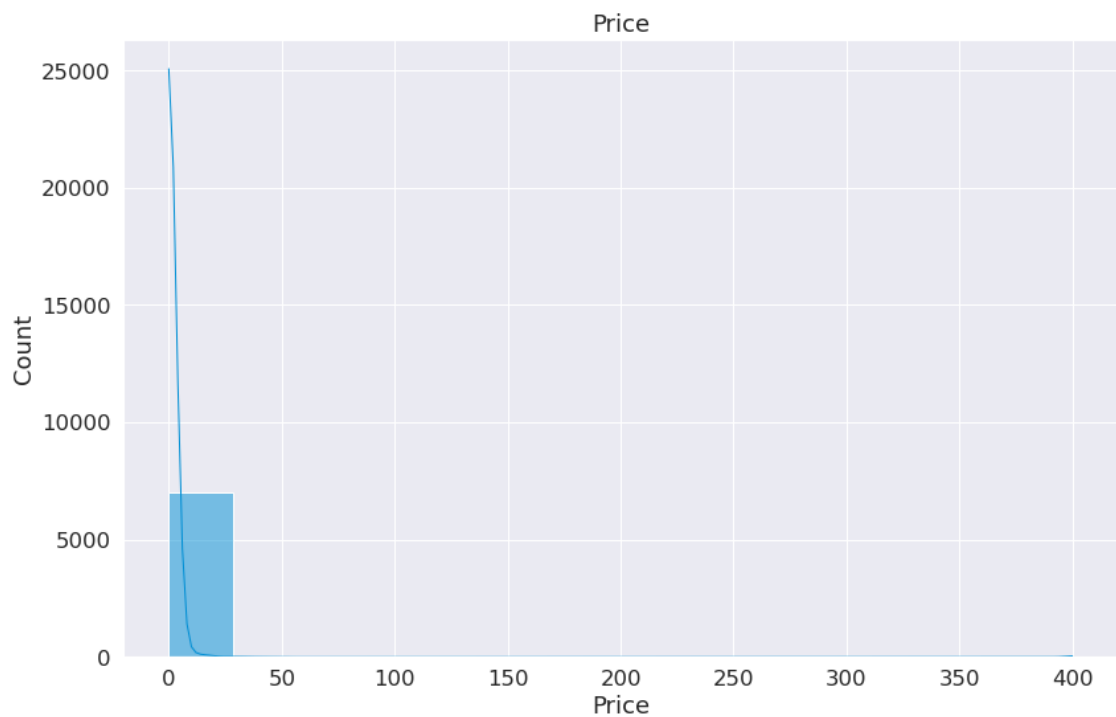
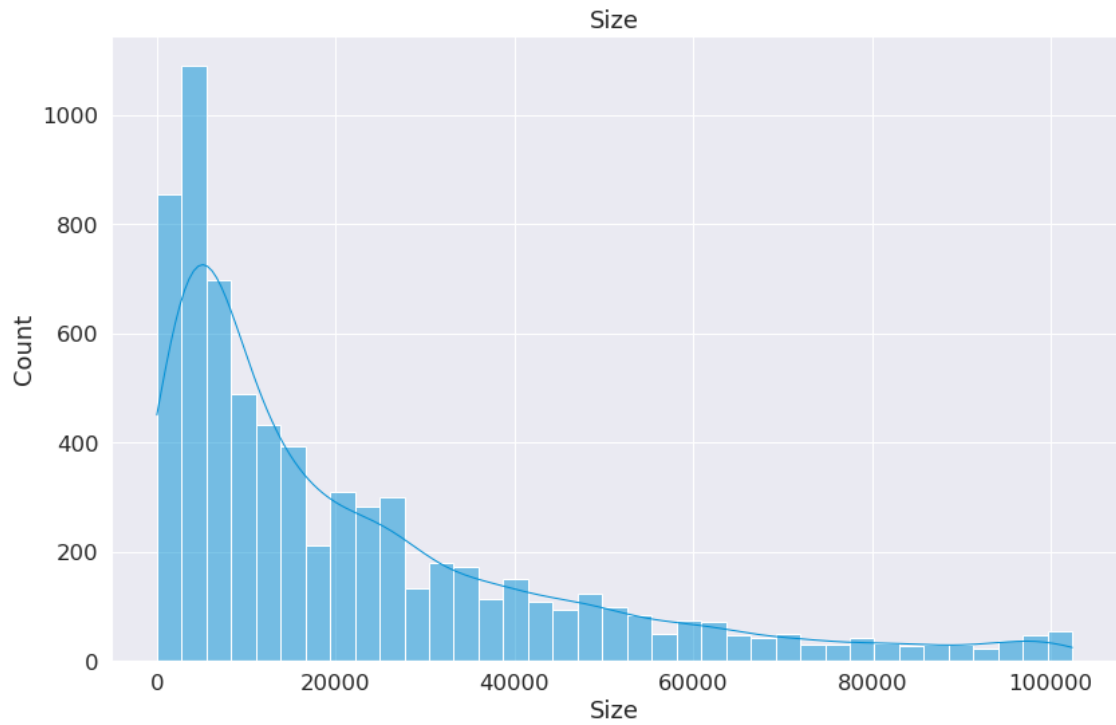


Next, I will show the distribution of continuous values

```
[48]: # Plotting continous features
continuous_features = df.select_dtypes(['float64']).columns.to_list()

for cont_feature in continuous_features:
    plt.figure(figsize= (12, 8))
    ax = sns.histplot(df[cont_feature], kde = True)
    plt.title(cont_feature);
```





Ratings column is skewed to the right while the Size column is skewed to the right.

The implication of this is that, there are higher ratings in the dataset than low rating. Consequently, the Size column shows that there are more smaller (size) app in the dataset than heavier app

5 QUESTIONS

In this section, I will ask some questions based on EDA above and answer them

List of top 10 most installed and Rating App

```
[49]: App = df.groupby('App')[['Installs', 'Rating', 'Size', 'Price', 'Reviews']].
      ↪mean()
      App
```

```
[49]:
```

	Installs	Rating	Size \
App			
+Download 4 Instagram Twitter	1000000.0	4.5	22528.0
- Free Comics - Comic Apps	10000.0	3.5	9318.4
.R	10000.0	4.5	203.0
/u/app	10000.0	4.7	54272.0
058.ba	100.0	4.4	14336.0
...
BL	10000.0	4.4	34816.0
I'm rich	10000.0	3.8	26624.0
WhatsLov: Smileys of love, stickers and GIF	1000000.0	4.6	18432.0
Smart Ruler cm/inch measuring for homework!	10000.0	4.0	3276.8
Football Wallpapers 4K Full HD Backgrounds	1000000.0	4.7	4096.0
	Price	Reviews	
App			
+Download 4 Instagram Twitter	0.00	40467.0	
- Free Comics - Comic Apps	0.00	115.0	
.R	0.00	259.0	
/u/app	0.00	573.0	
058.ba	0.00	27.0	
...	
BL	0.00	190.0	
I'm rich	399.99	718.0	
WhatsLov: Smileys of love, stickers and GIF	0.00	22098.0	
Smart Ruler cm/inch measuring for homework!	0.00	19.0	
Football Wallpapers 4K Full HD Backgrounds	0.00	11661.0	

[7023 rows x 5 columns]

Most Installed App

```
[50]: App_installs = App.sort_values('Installs', ascending=False).head(10)
      App_installs
```



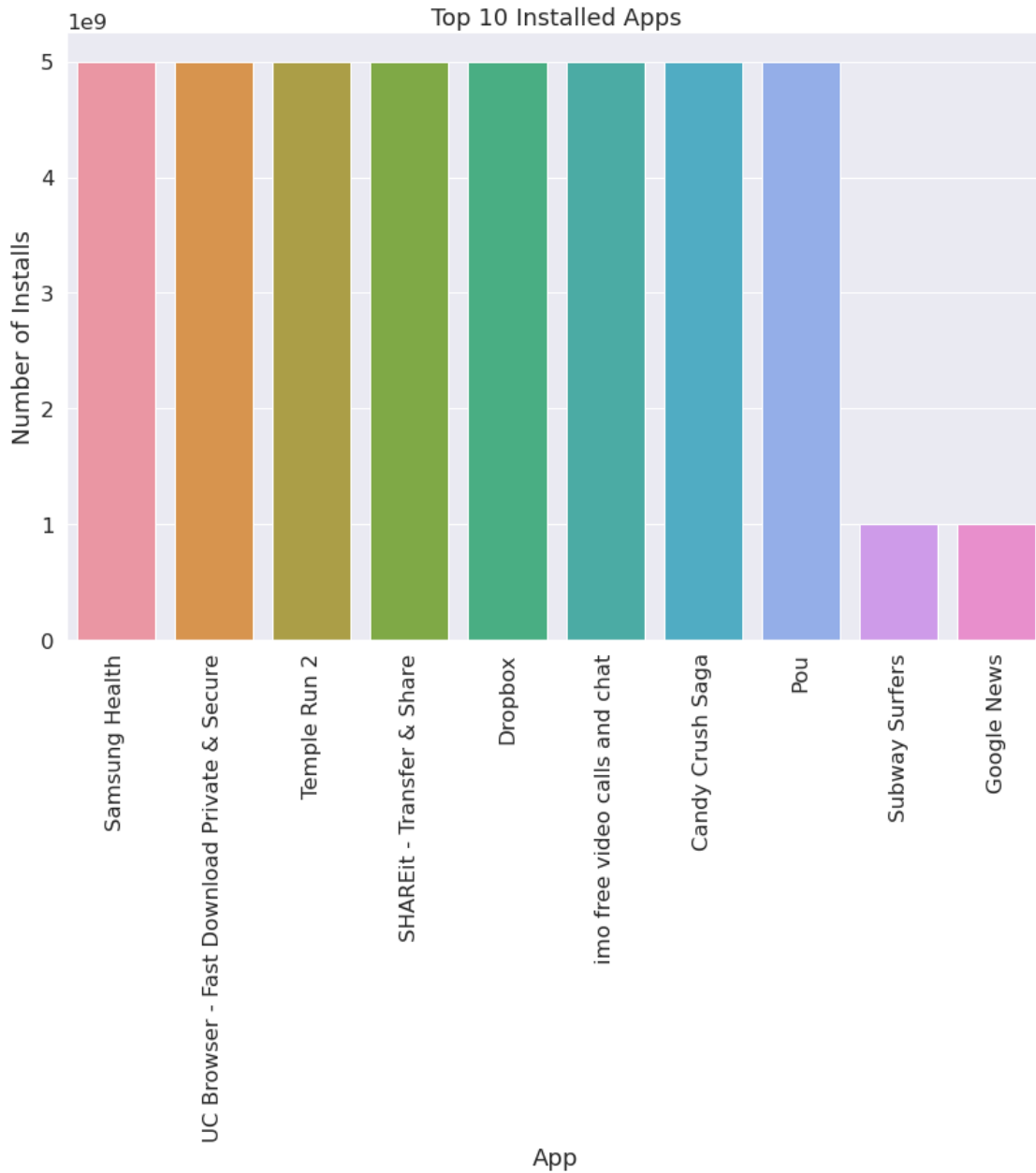
```
[50]:
```

App	Installs	Rating	Size \
Samsung Health	5.000000e+09	4.3	71680.0
UC Browser - Fast Download Private & Secure	5.000000e+09	4.5	40960.0
Temple Run 2	5.000000e+09	4.3	63488.0
SHAREit - Transfer & Share	5.000000e+09	4.6	17408.0
Dropbox	5.000000e+09	4.4	62464.0
imo free video calls and chat	5.000000e+09	4.3	11264.0
Candy Crush Saga	5.000000e+09	4.4	75776.0
Pou	5.000000e+09	4.3	24576.0
Subway Surfers	1.000000e+09	4.5	77824.0
Google News	1.000000e+09	3.9	13312.0

App	Price	Reviews
Samsung Health	0.0	480208.0
UC Browser - Fast Download Private & Secure	0.0	17712922.0
Temple Run 2	0.0	8118609.0
SHAREit - Transfer & Share	0.0	7790693.0
Dropbox	0.0	1861310.0
imo free video calls and chat	0.0	4785892.0
Candy Crush Saga	0.0	22426677.0
Pou	0.0	10485308.0
Subway Surfers	0.0	27722264.0
Google News	0.0	877635.0

Clearly, Samsung Health app has the most total installs

```
[51]: plt.figure(figsize= (12, 8))
sns.barplot(x = App_installs.index, y = App_installs.Installs)
plt.title("Top 10 Installed Apps")
plt.ylabel("Number of Installs")
plt.xticks(rotation = 90);
```



Most Reviewed App

```
[52]: App_Review = App.sort_values('Reviews', ascending=False).head(10)
App_Review
```

```
[52]:
```

App	Installs	Rating
Clash of Clans	1.000000e+08	4.6
Subway Surfers	1.000000e+09	4.5

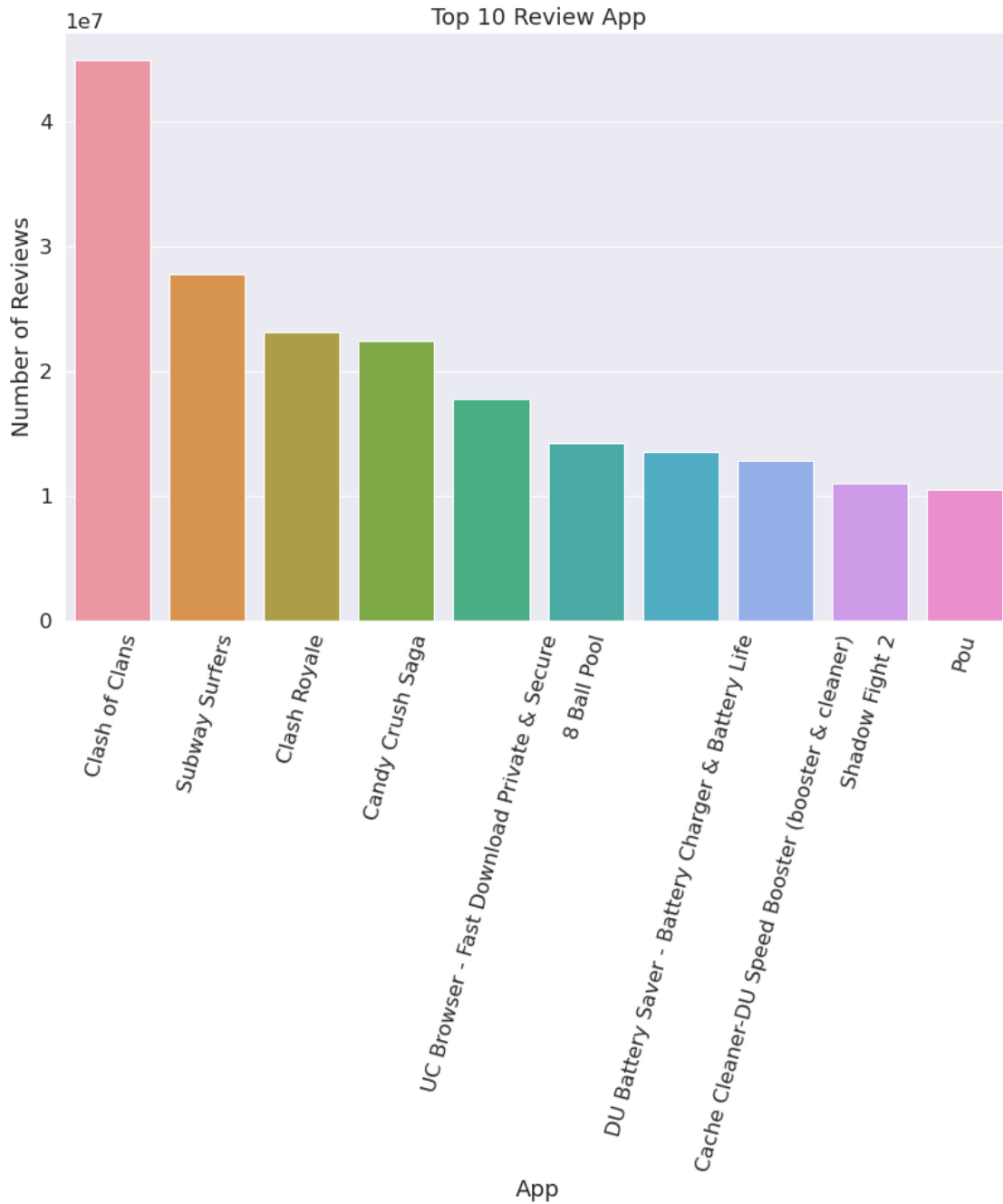
Clash Royale	1.000000e+08	4.6
Candy Crush Saga	5.000000e+09	4.4
UC Browser - Fast Download Private & Secure	5.000000e+09	4.5
8 Ball Pool	1.000000e+08	4.5
DU Battery Saver - Battery Charger & Battery Life	1.000000e+08	4.5
Cache Cleaner-DU Speed Booster (booster & cleaner)	1.000000e+08	4.5
Shadow Fight 2	1.000000e+08	4.6
Pou	5.000000e+09	4.3

	Size	Price \
App		
Clash of Clans	100352.0	0.0
Subway Surfers	77824.0	0.0
Clash Royale	99328.0	0.0
Candy Crush Saga	75776.0	0.0
UC Browser - Fast Download Private & Secure	40960.0	0.0
8 Ball Pool	53248.0	0.0
DU Battery Saver - Battery Charger & Battery Life	14336.0	0.0
Cache Cleaner-DU Speed Booster (booster & cleaner)	15360.0	0.0
Shadow Fight 2	90112.0	0.0
Pou	24576.0	0.0

	Reviews
App	
Clash of Clans	44891723.0
Subway Surfers	27722264.0
Clash Royale	23133508.0
Candy Crush Saga	22426677.0
UC Browser - Fast Download Private & Secure	17712922.0
8 Ball Pool	14198297.0
DU Battery Saver - Battery Charger & Battery Life	13479633.0
Cache Cleaner-DU Speed Booster (booster & cleaner)	12759663.0
Shadow Fight 2	10979062.0
Pou	10485308.0

Clash of Clans has the most reviews of 100352

```
[53]: plt.figure(figsize= (12, 8))
sns.barplot(x = App_Review.index, y = App_Review.Reviews)
plt.title("Top 10 Review App")
plt.ylabel("Number of Reviews")
plt.xticks(rotation = 75);
```



Most Cost App

```
[54]: App_Price = App.sort_values('Price', ascending=False).head(10)
      App_Price
```

```
[54]:
```

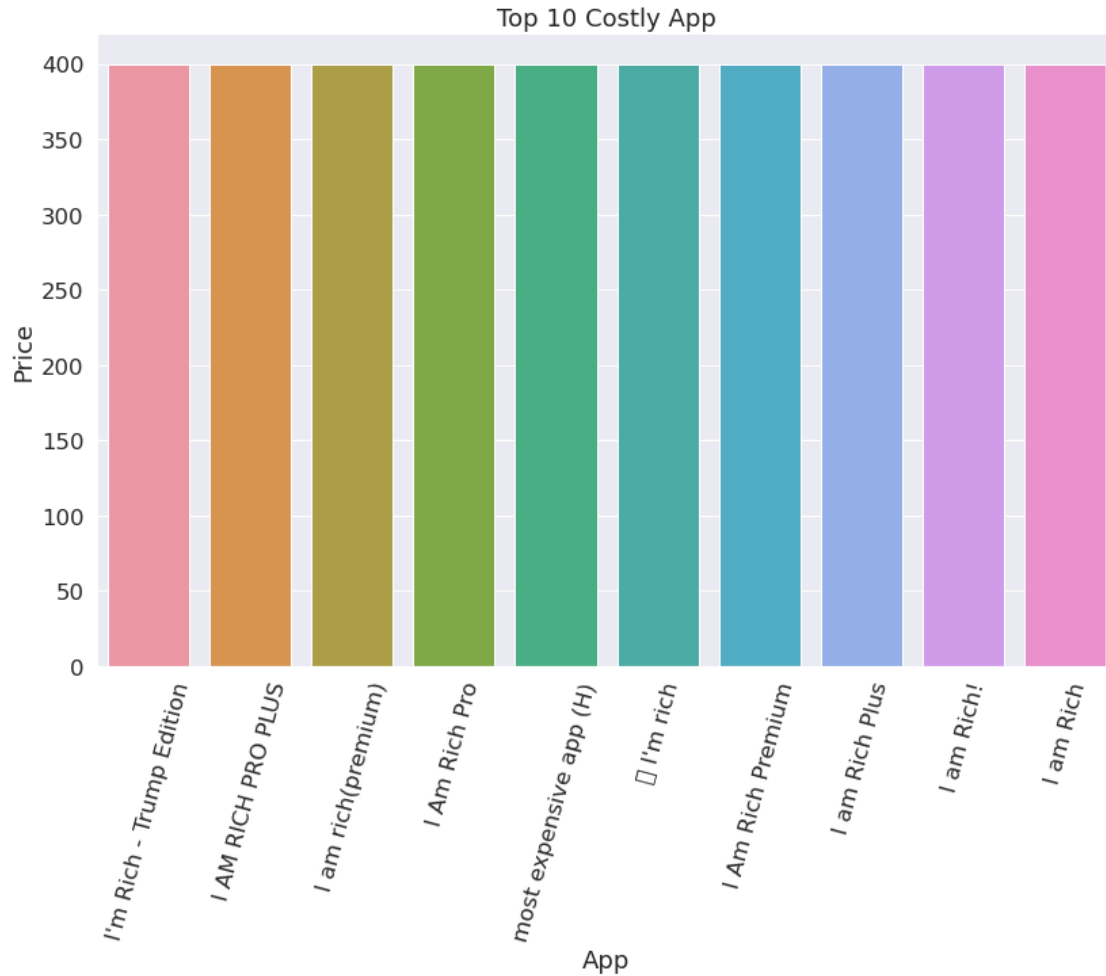
App	Installs	Rating	Size	Price	Reviews
-----	----------	--------	------	-------	---------

I'm Rich - Trump Edition	10000.0	3.6	7475.2	400.00	275.0
I AM RICH PRO PLUS	1000.0	4.0	41984.0	399.99	36.0
I am rich(premium)	5000.0	3.5	965.0	399.99	472.0
I Am Rich Pro	5000.0	4.4	2764.8	399.99	201.0
most expensive app (H)	100.0	4.3	1536.0	399.99	6.0
I'm rich	10000.0	3.8	26624.0	399.99	718.0
I Am Rich Premium	50000.0	4.1	4812.8	399.99	1867.0
I am Rich Plus	10000.0	4.0	8908.8	399.99	856.0
I am Rich!	1000.0	3.8	22528.0	399.99	93.0
I am Rich	5000.0	4.3	3891.2	399.99	180.0

I'm Rich - Trump Edition is the most costly app priced at 400 Dollars

```
[55]: plt.figure(figsize= (12, 8))
sns.barplot(x = App_Price.index, y = App_Price.Price)
plt.title("Top 10 Costly App")
plt.ylabel("Price")
plt.xticks(rotation = 75);
```

```
/opt/conda/lib/python3.9/site-packages/matplotlib/backends/backend_agg.py:240:
RuntimeWarning: Glyph 128142 missing from current font.
    font.set_text(s, 0.0, flags=flags)
/opt/conda/lib/python3.9/site-packages/matplotlib/backends/backend_agg.py:203:
RuntimeWarning: Glyph 128142 missing from current font.
    font.set_text(s, 0, flags=flags)
```



5.0.1 Top 10 Categories

```
[56]: Category_rate = df.groupby('Category')[['Installs', 'Rating', 'Size',
↪ 'Reviews', 'Price']].mean()
Category_rate
```

```
[56]:
```

Category	Installs	Rating	Size	Reviews \
ART_AND_DESIGN	6.366002e+06	4.381034	13250.206897	18745.172414
AUTO_AND_VEHICLES	3.551902e+06	4.147619	22058.200000	15750.571429
BEAUTY	3.626000e+05	4.291892	15885.837838	5020.243243
BOOKS_AND_REFERENCE	4.643859e+06	4.322695	14506.587234	23138.234043
BUSINESS	4.577851e+06	4.096396	14268.742342	19777.873874
COMICS	3.708745e+05	4.168085	13789.757447	13048.404255
COMMUNICATION	6.867151e+07	4.076720	12226.704762	242959.502646
DATING	2.906495e+06	3.963934	18082.832787	18008.622951

EDUCATION	8.945477e+06	4.373864	19456.659091	47422.409091
ENTERTAINMENT	2.824938e+07	4.154687	23596.800000	157911.734375
EVENTS	2.802211e+05	4.478947	14778.642105	3321.605263
FAMILY	9.071130e+06	4.180330	29682.500330	79913.601320
FINANCE	4.087548e+06	4.104651	18395.052713	34377.201550
FOOD_AND_DRINK	1.314539e+07	4.109722	22964.622222	46177.527778
GAME	4.773336e+07	4.236886	43845.124311	628736.355689
HEALTH_AND_FITNESS	3.364637e+07	4.191099	22459.813613	36209.261780
HOUSE_AND_HOME	4.629640e+06	4.128000	18102.272000	19833.040000
LIBRARIES_AND_DEMO	5.333050e+06	4.205000	12364.378333	14424.200000
LIFESTYLE	5.853231e+06	4.089963	15880.507063	28508.107807
MAPS_AND_NAVIGATION	8.553357e+06	4.008511	17589.055319	38399.521277
MEDICAL	1.246673e+05	4.167407	19254.183704	4303.003704
NEWS_AND_MAGAZINES	1.533052e+07	4.143506	12713.563636	38670.259740
PARENTING	2.581046e+06	4.347727	22097.454545	19999.500000
PERSONALIZATION	1.147858e+07	4.324453	11856.904380	102438.248175
PHOTOGRAPHY	2.526162e+07	4.114078	16239.429126	188123.708738
PRODUCTIVITY	3.272903e+07	4.131250	12313.932143	103773.040179
SHOPPING	2.336117e+07	4.213014	16932.819178	118748.712329
SOCIAL	1.280923e+07	4.257692	17728.923077	131664.653846
SPORTS	1.342222e+07	4.200905	27033.515837	113725.389140
TOOLS	1.925128e+07	4.007177	8484.219458	133337.633174
TRAVEL_AND_LOCAL	9.919421e+06	4.011348	25367.004255	31647.326241
VIDEO_PLAYERS	2.121028e+07	4.019469	16281.253097	204681.946903
WEATHER	9.785930e+06	4.242000	13223.288000	74133.900000

	Price
Category	
ART_AND_DESIGN	0.102931
AUTO_AND_VEHICLES	0.000000
BEAUTY	0.000000
BOOKS_AND_REFERENCE	0.148156
BUSINESS	0.231622
COMICS	0.000000
COMMUNICATION	0.220794
DATING	0.122787
EDUCATION	0.204091
ENTERTAINMENT	0.046719
EVENTS	0.000000
FAMILY	1.464310
FINANCE	9.456860
FOOD_AND_DRINK	0.069306
GAME	0.325018
HEALTH_AND_FITNESS	0.180209
HOUSE_AND_HOME	0.000000
LIBRARIES_AND_DEMO	0.000000
LIFESTYLE	7.261710

MAPS_AND_NAVIGATION	0.159149
MEDICAL	2.166519
NEWS_AND_MAGAZINES	0.025844
PARENTING	0.113409
PERSONALIZATION	0.420876
PHOTOGRAPHY	0.322184
PRODUCTIVITY	0.236429
SHOPPING	0.037534
SOCIAL	0.012692
SPORTS	0.363032
TOOLS	0.292823
TRAVEL_AND_LOCAL	0.188014
VIDEO_PLAYERS	0.008761
WEATHER	0.468800

Installations by Category

```
[57]: Category_rate_Install = Category_rate.sort_values('Installs', ascending=False)
      Category_rate_Install
```

```
[57]:
```

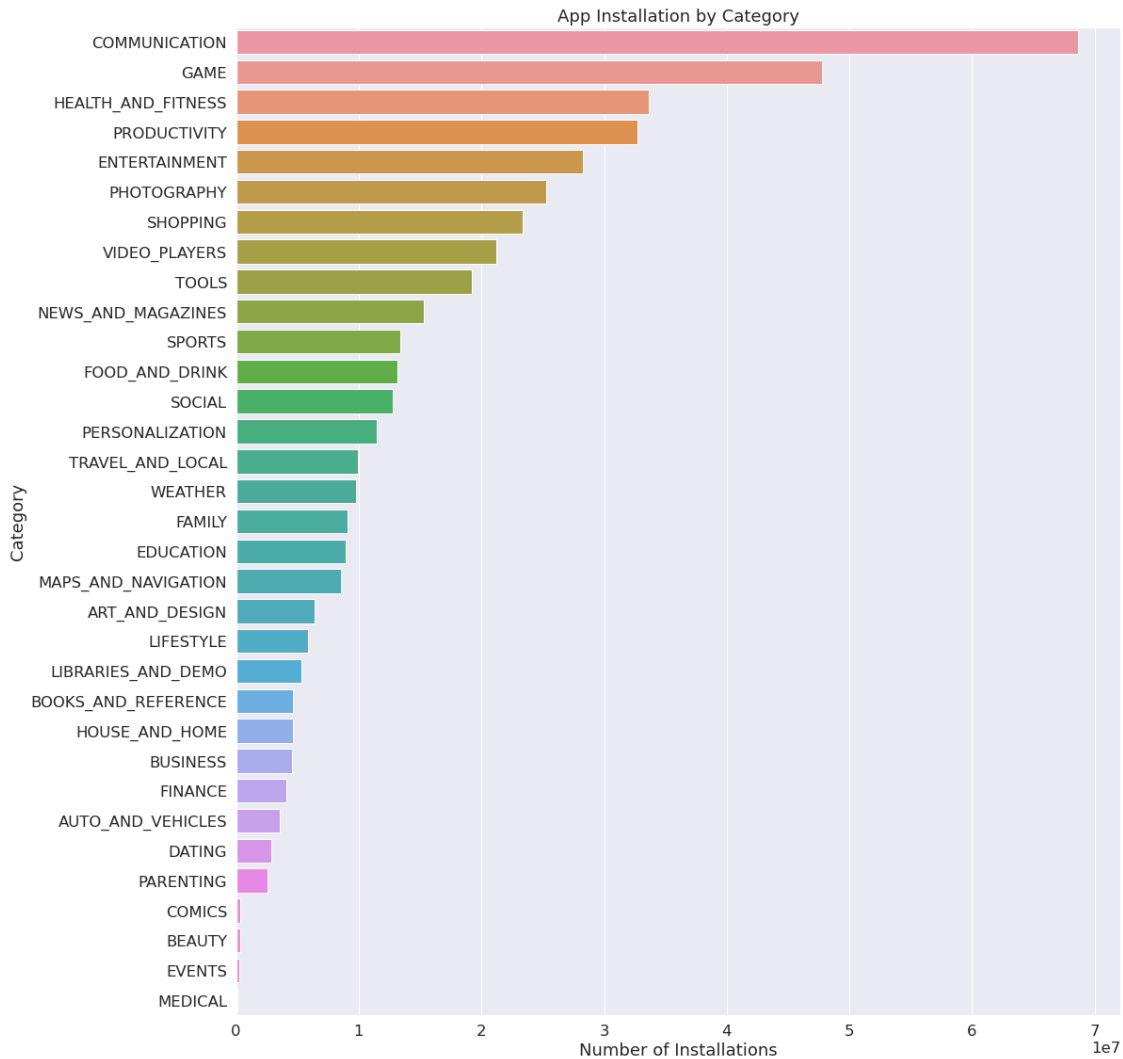
	Installs	Rating	Size	Reviews \
Category				
COMMUNICATION	6.867151e+07	4.076720	12226.704762	242959.502646
GAME	4.773336e+07	4.236886	43845.124311	628736.355689
HEALTH_AND_FITNESS	3.364637e+07	4.191099	22459.813613	36209.261780
PRODUCTIVITY	3.272903e+07	4.131250	12313.932143	103773.040179
ENTERTAINMENT	2.824938e+07	4.154687	23596.800000	157911.734375
PHOTOGRAPHY	2.526162e+07	4.114078	16239.429126	188123.708738
SHOPPING	2.336117e+07	4.213014	16932.819178	118748.712329
VIDEO_PLAYERS	2.121028e+07	4.019469	16281.253097	204681.946903
TOOLS	1.925128e+07	4.007177	8484.219458	133337.633174
NEWS_AND_MAGAZINES	1.533052e+07	4.143506	12713.563636	38670.259740
SPORTS	1.342222e+07	4.200905	27033.515837	113725.389140
FOOD_AND_DRINK	1.314539e+07	4.109722	22964.622222	46177.527778
SOCIAL	1.280923e+07	4.257692	17728.923077	131664.653846
PERSONALIZATION	1.147858e+07	4.324453	11856.904380	102438.248175
TRAVEL_AND_LOCAL	9.919421e+06	4.011348	25367.004255	31647.326241
WEATHER	9.785930e+06	4.242000	13223.288000	74133.900000
FAMILY	9.071130e+06	4.180330	29682.500330	79913.601320
EDUCATION	8.945477e+06	4.373864	19456.659091	47422.409091
MAPS_AND_NAVIGATION	8.553357e+06	4.008511	17589.055319	38399.521277
ART_AND_DESIGN	6.366002e+06	4.381034	13250.206897	18745.172414
LIFESTYLE	5.853231e+06	4.089963	15880.507063	28508.107807
LIBRARIES_AND_DEMO	5.333050e+06	4.205000	12364.378333	14424.200000
BOOKS_AND_REFERENCE	4.643859e+06	4.322695	14506.587234	23138.234043
HOUSE_AND_HOME	4.629640e+06	4.128000	18102.272000	19833.040000
BUSINESS	4.577851e+06	4.096396	14268.742342	19777.873874

FINANCE	4.087548e+06	4.104651	18395.052713	34377.201550
AUTO_AND_VEHICLES	3.551902e+06	4.147619	22058.200000	15750.571429
DATING	2.906495e+06	3.963934	18082.832787	18008.622951
PARENTING	2.581046e+06	4.347727	22097.454545	19999.500000
COMICS	3.708745e+05	4.168085	13789.757447	13048.404255
BEAUTY	3.626000e+05	4.291892	15885.837838	5020.243243
EVENTS	2.802211e+05	4.478947	14778.642105	3321.605263
MEDICAL	1.246673e+05	4.167407	19254.183704	4303.003704

Category	Price
COMMUNICATION	0.220794
GAME	0.325018
HEALTH_AND_FITNESS	0.180209
PRODUCTIVITY	0.236429
ENTERTAINMENT	0.046719
PHOTOGRAPHY	0.322184
SHOPPING	0.037534
VIDEO_PLAYERS	0.008761
TOOLS	0.292823
NEWS_AND_MAGAZINES	0.025844
SPORTS	0.363032
FOOD_AND_DRINK	0.069306
SOCIAL	0.012692
PERSONALIZATION	0.420876
TRAVEL_AND_LOCAL	0.188014
WEATHER	0.468800
FAMILY	1.464310
EDUCATION	0.204091
MAPS_AND_NAVIGATION	0.159149
ART_AND_DESIGN	0.102931
LIFESTYLE	7.261710
LIBRARIES_AND_DEMO	0.000000
BOOKS_AND_REFERENCE	0.148156
HOUSE_AND_HOME	0.000000
BUSINESS	0.231622
FINANCE	9.456860
AUTO_AND_VEHICLES	0.000000
DATING	0.122787
PARENTING	0.113409
COMICS	0.000000
BEAUTY	0.000000
EVENTS	0.000000
MEDICAL	2.166519

```
[58]: plt.figure(figsize= (15, 18))
sns.barplot(y = Category_rate_Install.index, x = Category_rate_Install.Installs)
```

```
plt.title("App Installation by Category")
plt.xlabel("Number of Installations");
```



Number of Reviews for each Category

```
[59]: Category_rate_Review = Category_rate.sort_values('Reviews', ascending=False)
      Category_rate_Review
```

```
[59]:
```

Category	Installs	Rating	Size	Reviews \
GAME	4.773336e+07	4.236886	43845.124311	628736.355689
COMMUNICATION	6.867151e+07	4.076720	12226.704762	242959.502646
VIDEO_PLAYERS	2.121028e+07	4.019469	16281.253097	204681.946903
PHOTOGRAPHY	2.526162e+07	4.114078	16239.429126	188123.708738
ENTERTAINMENT	2.824938e+07	4.154687	23596.800000	157911.734375

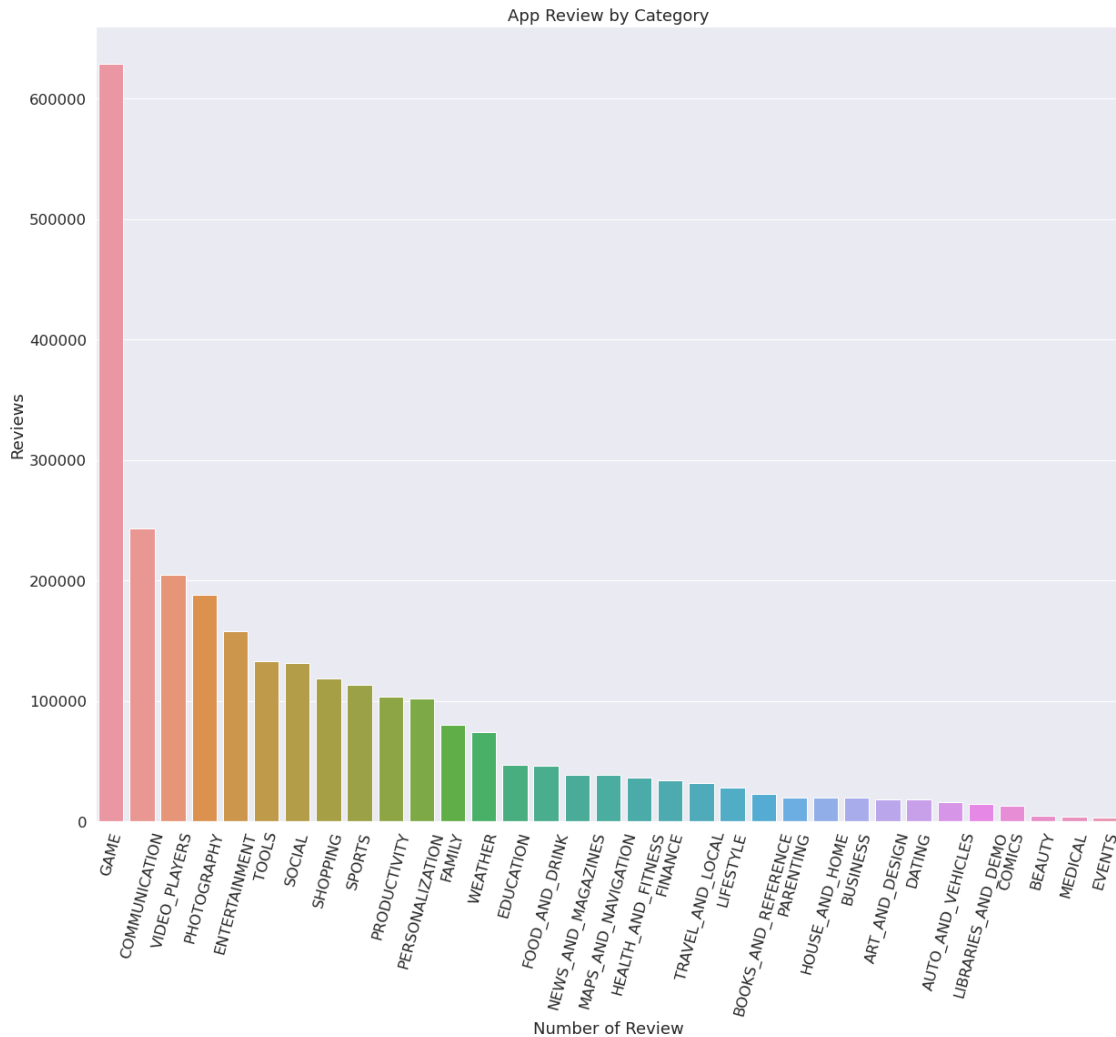
TOOLS	1.925128e+07	4.007177	8484.219458	133337.633174
SOCIAL	1.280923e+07	4.257692	17728.923077	131664.653846
SHOPPING	2.336117e+07	4.213014	16932.819178	118748.712329
SPORTS	1.342222e+07	4.200905	27033.515837	113725.389140
PRODUCTIVITY	3.272903e+07	4.131250	12313.932143	103773.040179
PERSONALIZATION	1.147858e+07	4.324453	11856.904380	102438.248175
FAMILY	9.071130e+06	4.180330	29682.500330	79913.601320
WEATHER	9.785930e+06	4.242000	13223.288000	74133.900000
EDUCATION	8.945477e+06	4.373864	19456.659091	47422.409091
FOOD_AND_DRINK	1.314539e+07	4.109722	22964.622222	46177.527778
NEWS_AND_MAGAZINES	1.533052e+07	4.143506	12713.563636	38670.259740
MAPS_AND_NAVIGATION	8.553357e+06	4.008511	17589.055319	38399.521277
HEALTH_AND_FITNESS	3.364637e+07	4.191099	22459.813613	36209.261780
FINANCE	4.087548e+06	4.104651	18395.052713	34377.201550
TRAVEL_AND_LOCAL	9.919421e+06	4.011348	25367.004255	31647.326241
LIFESTYLE	5.853231e+06	4.089963	15880.507063	28508.107807
BOOKS_AND_REFERENCE	4.643859e+06	4.322695	14506.587234	23138.234043
PARENTING	2.581046e+06	4.347727	22097.454545	19999.500000
HOUSE_AND_HOME	4.629640e+06	4.128000	18102.272000	19833.040000
BUSINESS	4.577851e+06	4.096396	14268.742342	19777.873874
ART_AND_DESIGN	6.366002e+06	4.381034	13250.206897	18745.172414
DATING	2.906495e+06	3.963934	18082.832787	18008.622951
AUTO_AND_VEHICLES	3.551902e+06	4.147619	22058.200000	15750.571429
LIBRARIES_AND_DEMO	5.333050e+06	4.205000	12364.378333	14424.200000
COMICS	3.708745e+05	4.168085	13789.757447	13048.404255
BEAUTY	3.626000e+05	4.291892	15885.837838	5020.243243
MEDICAL	1.246673e+05	4.167407	19254.183704	4303.003704
EVENTS	2.802211e+05	4.478947	14778.642105	3321.605263

Price

Category	
GAME	0.325018
COMMUNICATION	0.220794
VIDEO_PLAYERS	0.008761
PHOTOGRAPHY	0.322184
ENTERTAINMENT	0.046719
TOOLS	0.292823
SOCIAL	0.012692
SHOPPING	0.037534
SPORTS	0.363032
PRODUCTIVITY	0.236429
PERSONALIZATION	0.420876
FAMILY	1.464310
WEATHER	0.468800
EDUCATION	0.204091
FOOD_AND_DRINK	0.069306
NEWS_AND_MAGAZINES	0.025844

MAPS_AND_NAVIGATION	0.159149
HEALTH_AND_FITNESS	0.180209
FINANCE	9.456860
TRAVEL_AND_LOCAL	0.188014
LIFESTYLE	7.261710
BOOKS_AND_REFERENCE	0.148156
PARENTING	0.113409
HOUSE_AND_HOME	0.000000
BUSINESS	0.231622
ART_AND_DESIGN	0.102931
DATING	0.122787
AUTO_AND_VEHICLES	0.000000
LIBRARIES_AND_DEMO	0.000000
COMICS	0.000000
BEAUTY	0.000000
MEDICAL	2.166519
EVENTS	0.000000

```
[60]: plt.figure(figsize= (18, 15))
sns.barplot(x = Category_rate_Review.index, y = Category_rate_Review.Reviews)
plt.title("App Review by Category")
plt.xlabel("Number of Review")
plt.xticks(rotation = 75);
```



What is the average price of App in each CATEGORY?

```
[61]: Category_rate_Price = Category_rate.sort_values('Price', ascending=False)
      Category_rate_Price
```

```
[61]:
```

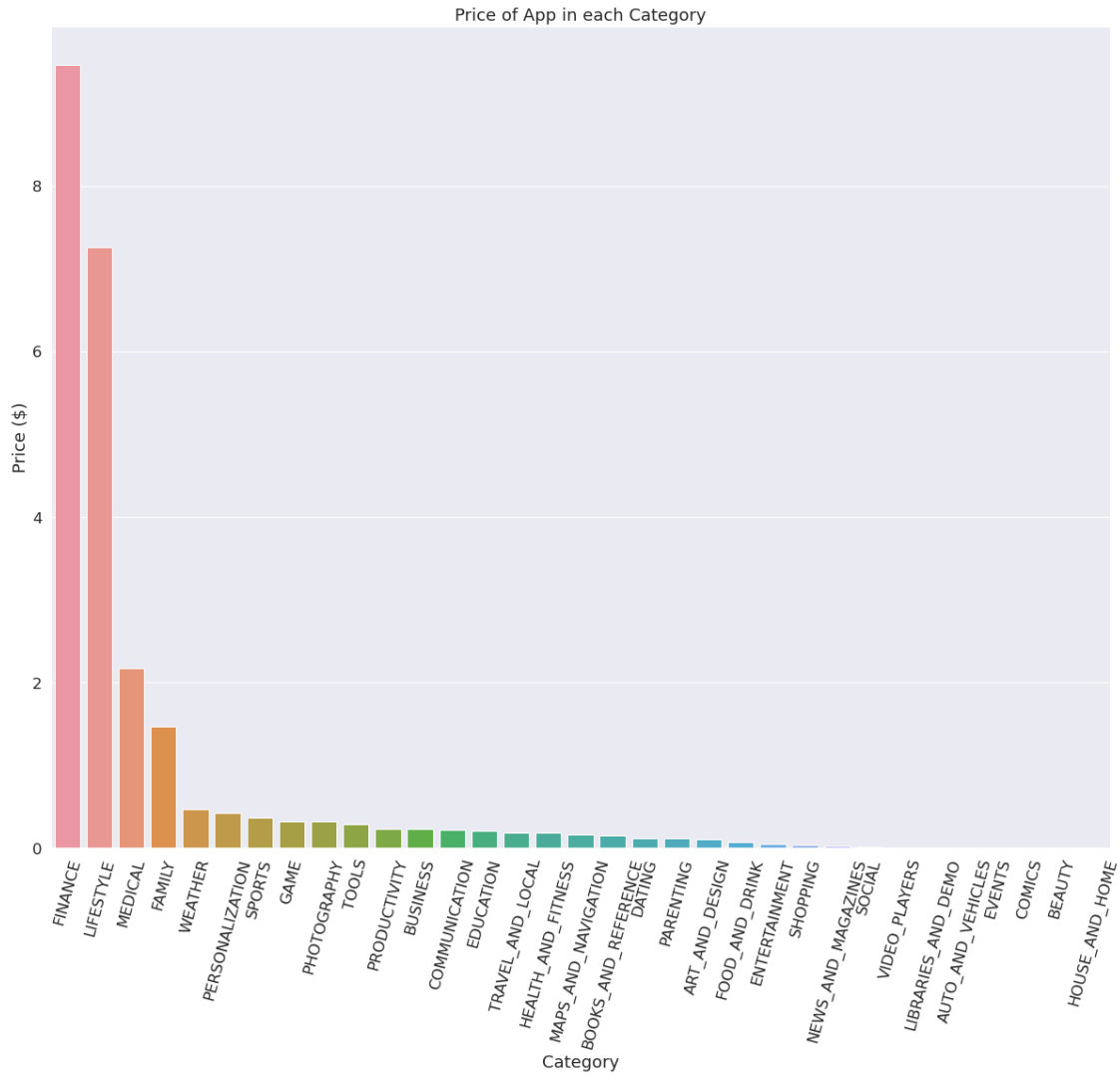
Category	Installs	Rating	Size	Reviews \
FINANCE	4.087548e+06	4.104651	18395.052713	34377.201550
LIFESTYLE	5.853231e+06	4.089963	15880.507063	28508.107807
MEDICAL	1.246673e+05	4.167407	19254.183704	4303.003704
FAMILY	9.071130e+06	4.180330	29682.500330	79913.601320
WEATHER	9.785930e+06	4.242000	13223.288000	74133.900000
PERSONALIZATION	1.147858e+07	4.324453	11856.904380	102438.248175
SPORTS	1.342222e+07	4.200905	27033.515837	113725.389140
GAME	4.773336e+07	4.236886	43845.124311	628736.355689

PHOTOGRAPHY	2.526162e+07	4.114078	16239.429126	188123.708738
TOOLS	1.925128e+07	4.007177	8484.219458	133337.633174
PRODUCTIVITY	3.272903e+07	4.131250	12313.932143	103773.040179
BUSINESS	4.577851e+06	4.096396	14268.742342	19777.873874
COMMUNICATION	6.867151e+07	4.076720	12226.704762	242959.502646
EDUCATION	8.945477e+06	4.373864	19456.659091	47422.409091
TRAVEL_AND_LOCAL	9.919421e+06	4.011348	25367.004255	31647.326241
HEALTH_AND_FITNESS	3.364637e+07	4.191099	22459.813613	36209.261780
MAPS_AND_NAVIGATION	8.553357e+06	4.008511	17589.055319	38399.521277
BOOKS_AND_REFERENCE	4.643859e+06	4.322695	14506.587234	23138.234043
DATING	2.906495e+06	3.963934	18082.832787	18008.622951
PARENTING	2.581046e+06	4.347727	22097.454545	19999.500000
ART_AND_DESIGN	6.366002e+06	4.381034	13250.206897	18745.172414
FOOD_AND_DRINK	1.314539e+07	4.109722	22964.622222	46177.527778
ENTERTAINMENT	2.824938e+07	4.154687	23596.800000	157911.734375
SHOPPING	2.336117e+07	4.213014	16932.819178	118748.712329
NEWS_AND_MAGAZINES	1.533052e+07	4.143506	12713.563636	38670.259740
SOCIAL	1.280923e+07	4.257692	17728.923077	131664.653846
VIDEO_PLAYERS	2.121028e+07	4.019469	16281.253097	204681.946903
LIBRARIES_AND_DEMO	5.333050e+06	4.205000	12364.378333	14424.200000
AUTO_AND_VEHICLES	3.551902e+06	4.147619	22058.200000	15750.571429
EVENTS	2.802211e+05	4.478947	14778.642105	3321.605263
COMICS	3.708745e+05	4.168085	13789.757447	13048.404255
BEAUTY	3.626000e+05	4.291892	15885.837838	5020.243243
HOUSE_AND_HOME	4.629640e+06	4.128000	18102.272000	19833.040000

	Price
Category	
FINANCE	9.456860
LIFESTYLE	7.261710
MEDICAL	2.166519
FAMILY	1.464310
WEATHER	0.468800
PERSONALIZATION	0.420876
SPORTS	0.363032
GAME	0.325018
PHOTOGRAPHY	0.322184
TOOLS	0.292823
PRODUCTIVITY	0.236429
BUSINESS	0.231622
COMMUNICATION	0.220794
EDUCATION	0.204091
TRAVEL_AND_LOCAL	0.188014
HEALTH_AND_FITNESS	0.180209
MAPS_AND_NAVIGATION	0.159149
BOOKS_AND_REFERENCE	0.148156
DATING	0.122787

PARENTING	0.113409
ART_AND_DESIGN	0.102931
FOOD_AND_DRINK	0.069306
ENTERTAINMENT	0.046719
SHOPPING	0.037534
NEWS_AND_MAGAZINES	0.025844
SOCIAL	0.012692
VIDEO_PLAYERS	0.008761
LIBRARIES_AND_DEMO	0.000000
AUTO_AND_VEHICLES	0.000000
EVENTS	0.000000
COMICS	0.000000
BEAUTY	0.000000
HOUSE_AND_HOME	0.000000

```
[62]: plt.figure(figsize= (18, 15))
sns.barplot(x = Category_rate_Price.index, y = Category_rate_Price.Price)
plt.title("Price of App in each Category")
plt.ylabel("Price ($)")
plt.xticks(rotation = 75);
```



What is the average size of app in each Category?

```
[63]: Category_rate_Size = Category_rate.sort_values('Size', ascending=False)
      Category_rate_Size
```

```
[63]:
```

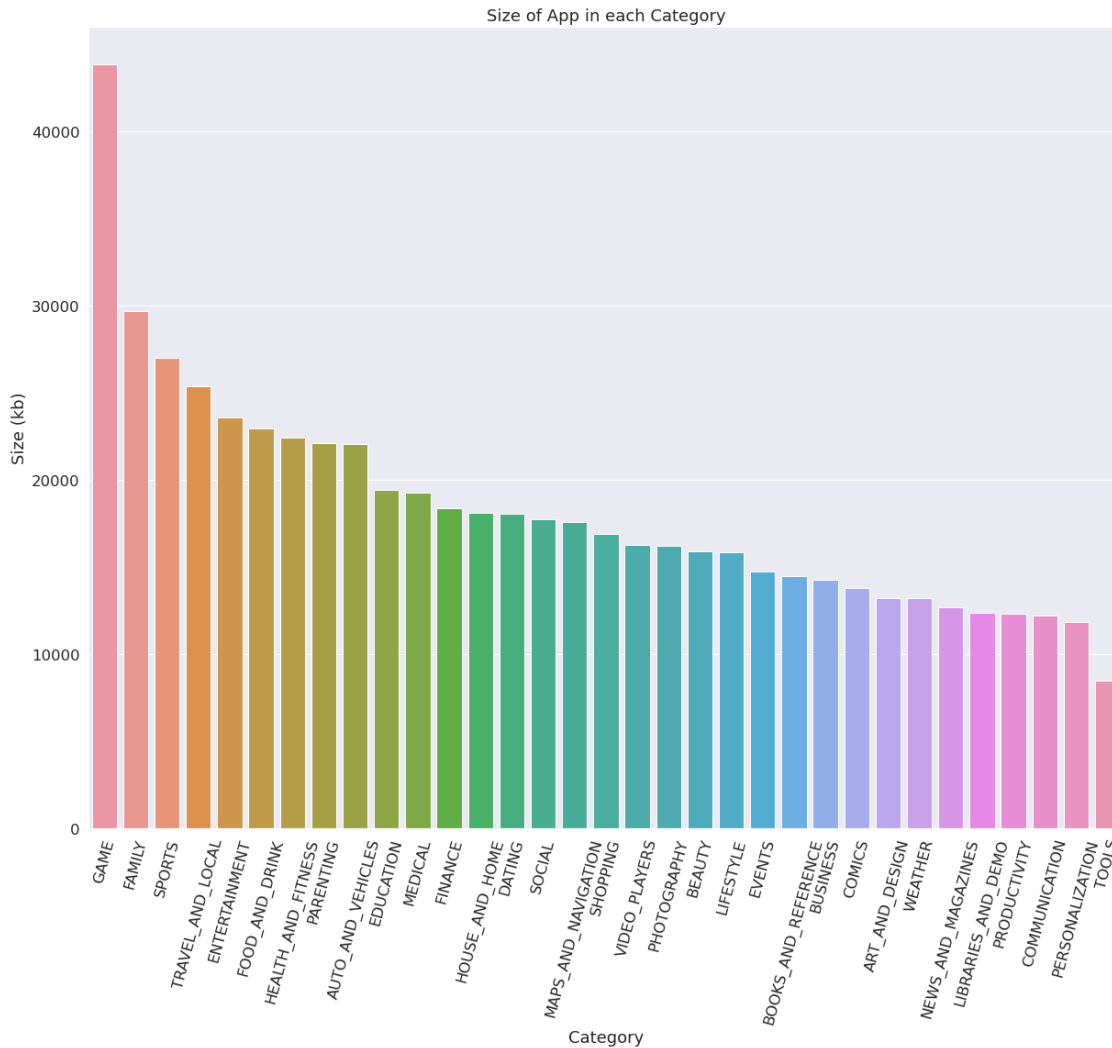
Category	Installs	Rating	Size	Reviews \
GAME	4.773336e+07	4.236886	43845.124311	628736.355689
FAMILY	9.071130e+06	4.180330	29682.500330	79913.601320
SPORTS	1.342222e+07	4.200905	27033.515837	113725.389140
TRAVEL_AND_LOCAL	9.919421e+06	4.011348	25367.004255	31647.326241
ENTERTAINMENT	2.824938e+07	4.154687	23596.800000	157911.734375
FOOD_AND_DRINK	1.314539e+07	4.109722	22964.622222	46177.527778
HEALTH_AND_FITNESS	3.364637e+07	4.191099	22459.813613	36209.261780

PARENTING	2.581046e+06	4.347727	22097.454545	19999.500000
AUTO_AND_VEHICLES	3.551902e+06	4.147619	22058.200000	15750.571429
EDUCATION	8.945477e+06	4.373864	19456.659091	47422.409091
MEDICAL	1.246673e+05	4.167407	19254.183704	4303.003704
FINANCE	4.087548e+06	4.104651	18395.052713	34377.201550
HOUSE_AND_HOME	4.629640e+06	4.128000	18102.272000	19833.040000
DATING	2.906495e+06	3.963934	18082.832787	18008.622951
SOCIAL	1.280923e+07	4.257692	17728.923077	131664.653846
MAPS_AND_NAVIGATION	8.553357e+06	4.008511	17589.055319	38399.521277
SHOPPING	2.336117e+07	4.213014	16932.819178	118748.712329
VIDEO_PLAYERS	2.121028e+07	4.019469	16281.253097	204681.946903
PHOTOGRAPHY	2.526162e+07	4.114078	16239.429126	188123.708738
BEAUTY	3.626000e+05	4.291892	15885.837838	5020.243243
LIFESTYLE	5.853231e+06	4.089963	15880.507063	28508.107807
EVENTS	2.802211e+05	4.478947	14778.642105	3321.605263
BOOKS_AND_REFERENCE	4.643859e+06	4.322695	14506.587234	23138.234043
BUSINESS	4.577851e+06	4.096396	14268.742342	19777.873874
COMICS	3.708745e+05	4.168085	13789.757447	13048.404255
ART_AND_DESIGN	6.366002e+06	4.381034	13250.206897	18745.172414
WEATHER	9.785930e+06	4.242000	13223.288000	74133.900000
NEWS_AND_MAGAZINES	1.533052e+07	4.143506	12713.563636	38670.259740
LIBRARIES_AND_DEMO	5.333050e+06	4.205000	12364.378333	14424.200000
PRODUCTIVITY	3.272903e+07	4.131250	12313.932143	103773.040179
COMMUNICATION	6.867151e+07	4.076720	12226.704762	242959.502646
PERSONALIZATION	1.147858e+07	4.324453	11856.904380	102438.248175
TOOLS	1.925128e+07	4.007177	8484.219458	133337.633174

	Price
Category	
GAME	0.325018
FAMILY	1.464310
SPORTS	0.363032
TRAVEL_AND_LOCAL	0.188014
ENTERTAINMENT	0.046719
FOOD_AND_DRINK	0.069306
HEALTH_AND_FITNESS	0.180209
PARENTING	0.113409
AUTO_AND_VEHICLES	0.000000
EDUCATION	0.204091
MEDICAL	2.166519
FINANCE	9.456860
HOUSE_AND_HOME	0.000000
DATING	0.122787
SOCIAL	0.012692
MAPS_AND_NAVIGATION	0.159149
SHOPPING	0.037534
VIDEO_PLAYERS	0.008761

PHOTOGRAPHY	0.322184
BEAUTY	0.000000
LIFESTYLE	7.261710
EVENTS	0.000000
BOOKS_AND_REFERENCE	0.148156
BUSINESS	0.231622
COMICS	0.000000
ART_AND_DESIGN	0.102931
WEATHER	0.468800
NEWS_AND_MAGAZINES	0.025844
LIBRARIES_AND_DEMO	0.000000
PRODUCTIVITY	0.236429
COMMUNICATION	0.220794
PERSONALIZATION	0.420876
TOOLS	0.292823

```
[64]: plt.figure(figsize= (18, 15))
sns.barplot(x = Category_rate_Size.index, y = Category_rate_Size.Size)
plt.title("Size of App in each Category")
plt.ylabel("Size (kb)")
plt.xticks(rotation = 75);
```



What is the average ratings of each category?

```
[65]: Category_ratings = Category_rate.sort_values('Rating', ascending=False)
      Category_ratings
```

```
[65]:
```

Category	Installs	Rating	Size	Reviews \
EVENTS	2.802211e+05	4.478947	14778.642105	3321.605263
ART_AND_DESIGN	6.366002e+06	4.381034	13250.206897	18745.172414
EDUCATION	8.945477e+06	4.373864	19456.659091	47422.409091
PARENTING	2.581046e+06	4.347727	22097.454545	19999.500000
PERSONALIZATION	1.147858e+07	4.324453	11856.904380	102438.248175
BOOKS_AND_REFERENCE	4.643859e+06	4.322695	14506.587234	23138.234043
BEAUTY	3.626000e+05	4.291892	15885.837838	5020.243243
SOCIAL	1.280923e+07	4.257692	17728.923077	131664.653846

WEATHER	9.785930e+06	4.242000	13223.288000	74133.900000
GAME	4.773336e+07	4.236886	43845.124311	628736.355689
SHOPPING	2.336117e+07	4.213014	16932.819178	118748.712329
LIBRARIES_AND_DEMO	5.333050e+06	4.205000	12364.378333	14424.200000
SPORTS	1.342222e+07	4.200905	27033.515837	113725.389140
HEALTH_AND_FITNESS	3.364637e+07	4.191099	22459.813613	36209.261780
FAMILY	9.071130e+06	4.180330	29682.500330	79913.601320
COMICS	3.708745e+05	4.168085	13789.757447	13048.404255
MEDICAL	1.246673e+05	4.167407	19254.183704	4303.003704
ENTERTAINMENT	2.824938e+07	4.154687	23596.800000	157911.734375
AUTO_AND_VEHICLES	3.551902e+06	4.147619	22058.200000	15750.571429
NEWS_AND_MAGAZINES	1.533052e+07	4.143506	12713.563636	38670.259740
PRODUCTIVITY	3.272903e+07	4.131250	12313.932143	103773.040179
HOUSE_AND_HOME	4.629640e+06	4.128000	18102.272000	19833.040000
PHOTOGRAPHY	2.526162e+07	4.114078	16239.429126	188123.708738
FOOD_AND_DRINK	1.314539e+07	4.109722	22964.622222	46177.527778
FINANCE	4.087548e+06	4.104651	18395.052713	34377.201550
BUSINESS	4.577851e+06	4.096396	14268.742342	19777.873874
LIFESTYLE	5.853231e+06	4.089963	15880.507063	28508.107807
COMMUNICATION	6.867151e+07	4.076720	12226.704762	242959.502646
VIDEO_PLAYERS	2.121028e+07	4.019469	16281.253097	204681.946903
TRAVEL_AND_LOCAL	9.919421e+06	4.011348	25367.004255	31647.326241
MAPS_AND_NAVIGATION	8.553357e+06	4.008511	17589.055319	38399.521277
TOOLS	1.925128e+07	4.007177	8484.219458	133337.633174
DATING	2.906495e+06	3.963934	18082.832787	18008.622951

	Price
Category	
EVENTS	0.000000
ART_AND_DESIGN	0.102931
EDUCATION	0.204091
PARENTING	0.113409
PERSONALIZATION	0.420876
BOOKS_AND_REFERENCE	0.148156
BEAUTY	0.000000
SOCIAL	0.012692
WEATHER	0.468800
GAME	0.325018
SHOPPING	0.037534
LIBRARIES_AND_DEMO	0.000000
SPORTS	0.363032
HEALTH_AND_FITNESS	0.180209
FAMILY	1.464310
COMICS	0.000000
MEDICAL	2.166519
ENTERTAINMENT	0.046719
AUTO_AND_VEHICLES	0.000000

NEWS_AND_MAGAZINES	0.025844
PRODUCTIVITY	0.236429
HOUSE_AND_HOME	0.000000
PHOTOGRAPHY	0.322184
FOOD_AND_DRINK	0.069306
FINANCE	9.456860
BUSINESS	0.231622
LIFESTYLE	7.261710
COMMUNICATION	0.220794
VIDEO_PLAYERS	0.008761
TRAVEL_AND_LOCAL	0.188014
MAPS_AND_NAVIGATION	0.159149
TOOLS	0.292823
DATING	0.122787

```
[66]: plt.figure(figsize= (18, 15))
sns.barplot(x = Category_ratings.index, y = Category_ratings.Rating)
plt.title("Ratings of App in each Category")
plt.ylabel("Rate ")
plt.xticks(rotation = 75);
```

