In [1]:

```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
matplotlib inline
import warnings
warnings.filterwarnings('ignore')
```

In [2]:

```
1 df=pd.read_csv("clean_gpaydata.csv")
2 df.head()
```

Out[2]:

	Арр	Category	Rating	Reviews	Size	Installs	Туре	Price	Content Rating	
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	4.1	159	19.0	10000	Free	0.0	Everyone	
1	Coloring book moana	ART_AND_DESIGN	3.9	967	14.0	500000	Free	0.0	Everyone	D€
2	U Launcher Lite – FREE Live Cool Themes, Hide	ART_AND_DESIGN	4.7	87510	8.7	5000000	Free	0.0	Everyone	
3	Sketch - Draw & Paint	ART_AND_DESIGN	4.5	215644	25.0	50000000	Free	0.0	Teen	
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	4.3	967	2.8	100000	Free	0.0	Everyone	Des
4										•

In [3]:

1 df.shape

Out[3]:

(10840, 17)

In [4]:

1 df.head()

Out[4]:

	Арр	Category	Rating	Reviews	Size	Installs	Туре	Price	Content Rating	
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	4.1	159	19.0	10000	Free	0.0	Everyone	
1	Coloring book moana	ART_AND_DESIGN	3.9	967	14.0	500000	Free	0.0	Everyone	
2	U Launcher Lite – FREE Live Cool Themes, Hide	ART_AND_DESIGN	4.7	87510	8.7	5000000	Free	0.0	Everyone	
3	Sketch - Draw & Paint	ART_AND_DESIGN	4.5	215644	25.0	50000000	Free	0.0	Teen	
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	4.3	967	2.8	100000	Free	0.0	Everyone	~
4									•	

In [5]:

1 df_copy= df.copy()
2

In [6]:

1 df_copy.head()

Out[6]:

	Арр	Category	Rating	Reviews	Size	Installs	Туре	Price	Content Rating	
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	4.1	159	19.0	10000	Free	0.0	Everyone	
1	Coloring book moana	ART_AND_DESIGN	3.9	967	14.0	500000	Free	0.0	Everyone	D€
2	U Launcher Lite – FREE Live Cool Themes, Hide	ART_AND_DESIGN	4.7	87510	8.7	5000000	Free	0.0	Everyone	
3	Sketch - Draw & Paint	ART_AND_DESIGN	4.5	215644	25.0	50000000	Free	0.0	Teen	
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	4.3	967	2.8	100000	Free	0.0	Everyone	Des

→

In [7]:

1 df_copy.shape

Out[7]:

(10840, 17)

In [8]:

```
1 df_copy.info()
```

RangeIndex: 10840 entries, 0 to 10839 Data columns (total 17 columns): Non-Null Count Dtype Column # _____ -----0 10840 non-null object App 1 Category 10840 non-null object 2 Rating 9366 non-null float64 3 10840 non-null Reviews int64 4 9145 non-null float64 Size 5 Installs 10840 non-null int64 6 10839 non-null object Type 7 Price 10840 non-null float64 8 Content Rating 10840 non-null object 9 10840 non-null object Genres 10 Last Updated 10840 non-null object 11 Current Ver 10832 non-null object 12 Android Ver 10838 non-null object 13 10840 non-null int64 day 10840 non-null object 14 date 15 month 10840 non-null int64

<class 'pandas.core.frame.DataFrame'>

16 yrar 10840 non-null int64 dtypes: float64(3), int64(5), object(9)

memory usage: 1.4+ MB

In [9]:

```
1 df_copy.columns
```

Out[9]:

In [10]:

1 df.isnull().sum()

Out[10]:

Арр	0
Category	0
Rating	1474
Reviews	0
Size	1695
Installs	0
Туре	1
Price	0
Content Rating	0
Genres	0
Last Updated	0
Current Ver	8
Android Ver	2
day	0
date	0
month	0
yrar	0
dtype: int64	

In [11]:

1 df.describe().T

Out[11]:

	count	mean	std	min	25%	50%	75%	
Rating	9366.0	4.191757e+00	5.152189e-01	1.000	4.0	4.3	4.5	5.000000
Reviews	10840.0	4.441529e+05	2.927761e+06	0.000	38.0	2094.0	54775.5	7.815831
Size	9145.0	2.151746e+01	2.258804e+01	0.011	4.9	13.0	30.0	1.000000
Installs	10840.0	1.546434e+07	8.502936e+07	0.000	1000.0	100000.0	5000000.0	1.000000
Price	10840.0	1.027368e+00	1.594970e+01	0.000	0.0	0.0	0.0	4.000000
day	10840.0	1.560904e+01	9.561621e+00	1.000	6.0	16.0	24.0	3.100000
month	10840.0	6.422325e+00	2.578388e+00	1.000	5.0	7.0	8.0	1.200000
yrar	10840.0	2.017400e+03	1.100914e+00	2010.000	2017.0	2018.0	2018.0	2.018000
4								

In [12]:

```
# if you want to include all the columns
df.describe(include="all")
```

Out[12]:

	Арр	Category	Rating	Reviews	Size	Installs	Type	
count	10840	10840	9366.000000	1.084000e+04	9145.000000	1.084000e+04	10839	108
unique	9659	33	NaN	NaN	NaN	NaN	2	
top	ROBLOX	FAMILY	NaN	NaN	NaN	NaN	Free	
freq	9	1972	NaN	NaN	NaN	NaN	10039	
mean	NaN	NaN	4.191757	4.441529e+05	21.517458	1.546434e+07	NaN	
std	NaN	NaN	0.515219	2.927761e+06	22.588038	8.502936e+07	NaN	
min	NaN	NaN	1.000000	0.000000e+00	0.011000	0.000000e+00	NaN	
25%	NaN	NaN	4.000000	3.800000e+01	4.900000	1.000000e+03	NaN	
50%	NaN	NaN	4.300000	2.094000e+03	13.000000	1.000000e+05	NaN	
75%	NaN	NaN	4.500000	5.477550e+04	30.000000	5.000000e+06	NaN	
max	NaN	NaN	5.000000	7.815831e+07	100.000000	1.000000e+09	NaN	4

←

In [13]:

1 # to find duplicated values
2 df.duplicated().sum()

Out[13]:

483

In [14]:

- #duplicated values in the frame
 df[df.duplicated()]

Out[14]:

	Арр	Category	Rating	Reviews	Size	Installs	Туре	Price	Content Rating
229	Quick PDF Scanner + OCR FREE	BUSINESS	4.2	80805	NaN	5000000	Free	0.0	Everyone
236	Вох	BUSINESS	4.2	159872	NaN	10000000	Free	0.0	Everyone
239	Google My Business	BUSINESS	4.4	70991	NaN	5000000	Free	0.0	Everyone
256	ZOOM Cloud Meetings	BUSINESS	4.4	31614	37.0	10000000	Free	0.0	Everyone
261	join.me - Simple Meetings	BUSINESS	4.0	6989	NaN	1000000	Free	0.0	Everyone
		•••							
8643	Wunderlist: To-Do List & Tasks	PRODUCTIVITY	4.6	404610	NaN	10000000	Free	0.0	Everyone
8654	TickTick: To Do List with Reminder, Day Planner	PRODUCTIVITY	4.6	25370	NaN	1000000	Free	0.0	Everyone
8658	ColorNote Notepad Notes	PRODUCTIVITY	4.6	2401017	NaN	100000000	Free	0.0	Everyone
10049	Airway Ex - Intubate. Anesthetize. Train.	MEDICAL	4.3	123	86.0	10000	Free	0.0	Everyone
10767	AAFP	MEDICAL	3.8	63	24.0	10000	Free	0.0	Everyone

483 rows × 17 columns

localhost:8888/notebooks/Data cleaning Gpay dataset Part 2_13oct.ipynb

In [15]:

- 1 # drop duplicated values
- 2 df.drop_duplicates()

Out[15]:

	Арр	Category	Rating	Reviews	Size	Installs	Туре	Price	(
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	4.1	159	19.0	10000	Free	0.0	E
1	Coloring book moana	ART_AND_DESIGN	3.9	967	14.0	500000	Free	0.0	Ε
2	U Launcher Lite – FREE Live Cool Themes, Hide	ART_AND_DESIGN	4.7	87510	8.7	5000000	Free	0.0	Е
3	Sketch - Draw & Paint	ART_AND_DESIGN	4.5	215644	25.0	50000000	Free	0.0	
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	4.3	967	2.8	100000	Free	0.0	Е
10835	Sya9a Maroc - FR	FAMILY	4.5	38	53.0	5000	Free	0.0	E
10836	Fr. Mike Schmitz Audio Teachings	FAMILY	5.0	4	3.6	100	Free	0.0	Ε
10837	Parkinson Exercices FR	MEDICAL	NaN	3	9.5	1000	Free	0.0	E
10838	The SCP Foundation DB fr nn5n	BOOKS_AND_REFERENCE	4.5	114	NaN	1000	Free	0.0	
10839	iHoroscope - 2018 Daily Horoscope & Astrology	LIFESTYLE	4.5	398307	19.0	10000000	Free	0.0	E
10357 r	rows × 17 co	olumns							
1									•

In [16]:

```
1 #check duplicate sum
2 df.drop_duplicates().sum()
```

Out[16]:

App Photo Editor & Candy Camera & Grid & ScrapBook... ART_AND_DESIGNART_AND_DESIGNART_... Category Rating 37238.6 Reviews 4203954052 Size 188000.95 **Installs** 146631914527 Price 10676.0 Content Rating EveryoneEveryoneTeenEveryoneEveryoneEv... Genres Art & DesignArt & Design; Pretend PlayArt & Des... 2018-01-072018-01-152018-08-012018-06-082018-0... Last Updated day 2018-01-072018-01-152018-08-012018-06-082018-0... date month 66254 yrar 20894035 dtype: object

In [17]:

1 df.shape

Out[17]:

(10840, 17)

In [18]:

1 display(df.drop_duplicates())

	Арр	Category	Rating	Reviews	Size	Installs	Туре	Price	(
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	4.1	159	19.0	10000	Free	0.0	E
1	Coloring book moana	ART_AND_DESIGN	3.9	967	14.0	500000	Free	0.0	E
2	U Launcher Lite – FREE Live Cool Themes, Hide	ART_AND_DESIGN	4.7	87510	8.7	5000000	Free	0.0	E
3	Sketch - Draw & Paint	ART_AND_DESIGN	4.5	215644	25.0	50000000	Free	0.0	
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	4.3	967	2.8	100000	Free	0.0	Е
10835	Sya9a Maroc - FR	FAMILY	4.5	38	53.0	5000	Free	0.0	E
10836	Fr. Mike Schmitz Audio Teachings	FAMILY	5.0	4	3.6	100	Free	0.0	Е
10837	Parkinson Exercices FR	MEDICAL	NaN	3	9.5	1000	Free	0.0	Е
10838	The SCP Foundation DB fr nn5n	BOOKS_AND_REFERENCE	4.5	114	NaN	1000	Free	0.0	
10839	iHoroscope - 2018 Daily Horoscope & Astrology	LIFESTYLE	4.5	398307	19.0	10000000	Free	0.0	E

10357 rows × 17 columns

```
In [19]:

1  #Permanently deletws duplicate values
2  df.drop_duplicates(keep=False, inplace=True)

In [20]:

1  df.shape

Out[20]:
(9947, 17)
```

Exploring the data

segregate the categorical and numerical Values

```
In [21]:
    numerical_feature= [feature for feature in df.columns if (df[feature]).dtype != "0"]
    numerical_feature
Out[21]:
['Rating', 'Reviews', 'Size', 'Installs', 'Price', 'day', 'month', 'yrar']
In [22]:
    categorial_feature = [feature for feature in df.columns if (df[feature]).dtype =="0"]
    categorial_feature
Out[22]:
['App',
 'Category',
 'Type',
 'Content Rating',
 'Genres',
 'Last Updated',
 'Current Ver',
 'Android Ver',
 'date']
```

```
In [23]:
```

```
1 df["App"].value_counts()
Out[23]:
ROBLOX
                                                   9
8 Ball Pool
                                                   7
Zombie Catchers
                                                   6
Bubble Shooter
                                                   6
Helix Jump
                                                   6
Vienna U-Bahn
                                                   1
U-Haul
                                                   1
Kicker U
                                                   1
/u/app
                                                   1
iHoroscope - 2018 Daily Horoscope & Astrology
Name: App, Length: 9381, dtype: int64
In [24]:
 1 9/9947
Out[24]:
0.0009047954157032271
In [25]:
 1 len(df["App"].value_counts())
Out[25]:
9381
```

9381 categories are available in the above App field

In [26]:

```
#to get the percentages or prAPORTION OF THE VALUES
df["App"].value_counts(normalize=True)
```

Out[26]:

```
ROBLOX
                                                   0.000905
8 Ball Pool
                                                   0.000704
Zombie Catchers
                                                   0.000603
Bubble Shooter
                                                   0.000603
Helix Jump
                                                   0.000603
Vienna U-Bahn
                                                   0.000101
U-Haul
                                                   0.000101
Kicker U
                                                   0.000101
/u/app
                                                   0.000101
iHoroscope - 2018 Daily Horoscope & Astrology
                                                   0.000101
Name: App, Length: 9381, dtype: float64
```

In [27]:

```
1 df["App"].value_counts(normalize=False)
Out[27]:
ROBLOX
                                                  9
8 Ball Pool
                                                  7
Zombie Catchers
                                                  6
Bubble Shooter
                                                  6
Helix Jump
                                                  6
Vienna U-Bahn
                                                  1
U-Haul
                                                  1
Kicker U
                                                  1
/u/app
                                                  1
iHoroscope - 2018 Daily Horoscope & Astrology
Name: App, Length: 9381, dtype: int64
In [28]:
 1 #MULTIPLY BY 100
```

Out[28]:

ROBLOX	0.090480
8 Ball Pool	0.070373
Zombie Catchers	0.060320
Bubble Shooter	0.060320
Helix Jump	0.060320
	•••
Vienna U-Bahn	0.010053
U-Haul	0.010053
Kicker U	0.010053
/u/app	0.010053
iHoroscope - 2018 Daily Horoscope & Astrology	0.010053
Name: App, Length: 9381, dtype: float64	

2 df["App"].value_counts(normalize=True)*100

In [29]:

- 1 # to see entire categorical data
- 2 df[categorial_feature]

Out[29]:

	Арр	Category	Туре	Content Rating	Genres	Last Updated	Curren Ve
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	Free	Everyone	Art & Design	2018- 01-07	1.0.0
1	Coloring book moana	ART_AND_DESIGN	Free	Everyone	Art & Design;Pretend Play	2018- 01-15	2.0.0
2	U Launcher Lite – FREE Live Cool Themes, Hide	ART_AND_DESIGN	Free	Everyone	Art & Design	2018- 08-01	1.2.4
3	Sketch - Draw & Paint	ART_AND_DESIGN	Free	Teen	Art & Design	2018- 06-08	Varie witl device
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	Free	Everyone	Art & Design;Creativity	2018- 06-20	1.
10835	Sya9a Maroc - FR	FAMILY	Free	Everyone	Education	2017- 07-25	1.4
10836	Fr. Mike Schmitz Audio Teachings	FAMILY	Free	Everyone	Education	2018- 07-06	1.0
10837	Parkinson Exercices FR	MEDICAL	Free	Everyone	Medical	2017- 01-20	1.(
10838	The SCP Foundation DB fr nn5n	BOOKS_AND_REFERENCE	Free	Mature 17+	Books & Reference	2015- 01-19	Varie witl device
10839	iHoroscope - 2018 Daily Horoscope & Astrology	LIFESTYLE	Free	Everyone	Lifestyle	2018- 07-25	Varie: witl device
9947 rc	ws × 9 colu	mns					
4							•

In [30]:

1 df[numerical_feature]

Out[30]:

	Rating	Reviews	Size	Installs	Price	day	month	yrar
0	4.1	159	19.0	10000	0.0	7	1	2018
1	3.9	967	14.0	500000	0.0	15	1	2018
2	4.7	87510	8.7	5000000	0.0	1	8	2018
3	4.5	215644	25.0	50000000	0.0	8	6	2018
4	4.3	967	2.8	100000	0.0	20	6	2018
10835	4.5	38	53.0	5000	0.0	25	7	2017
10836	5.0	4	3.6	100	0.0	6	7	2018
10837	NaN	3	9.5	1000	0.0	20	1	2017
10838	4.5	114	NaN	1000	0.0	19	1	2015
10839	4.5	398307	19.0	10000000	0.0	25	7	2018

9947 rows × 8 columns

In [31]:

- 1 # Create new dataframe
- 2 num_df=df[numerical_feature]
- 3 cat_df=df[categorial_feature]

In [32]:

1 num_df

Out[32]:

	Rating	Reviews	Size	Installs	Price	day	month	yrar
0	4.1	159	19.0	10000	0.0	7	1	2018
1	3.9	967	14.0	500000	0.0	15	1	2018
2	4.7	87510	8.7	5000000	0.0	1	8	2018
3	4.5	215644	25.0	50000000	0.0	8	6	2018
4	4.3	967	2.8	100000	0.0	20	6	2018
10835	4.5	38	53.0	5000	0.0	25	7	2017
10836	5.0	4	3.6	100	0.0	6	7	2018
10837	NaN	3	9.5	1000	0.0	20	1	2017
10838	4.5	114	NaN	1000	0.0	19	1	2015
10839	4.5	398307	19.0	10000000	0.0	25	7	2018

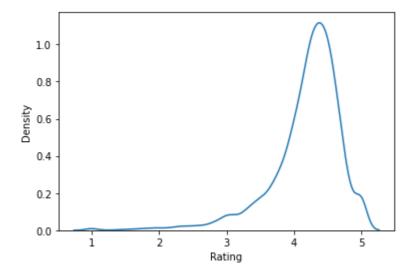
9947 rows × 8 columns

In [33]:

```
# check the distribution of numerical data
sns.kdeplot(num_df["Rating"])
```

Out[33]:

<AxesSubplot:xlabel='Rating', ylabel='Density'>

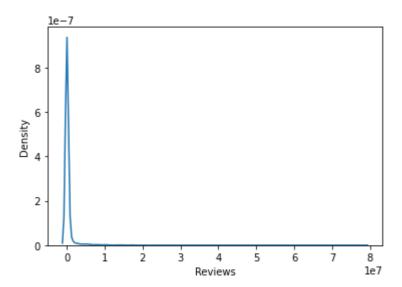


In [34]:

1 sns.kdeplot(df["Reviews"])

Out[34]:

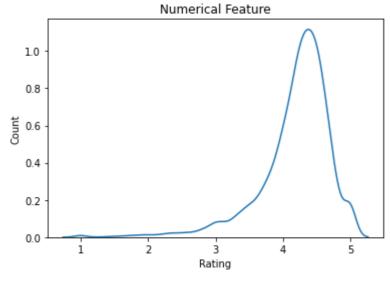
<AxesSubplot:xlabel='Reviews', ylabel='Density'>



```
In [35]:
```

```
# distribution related with each and every variable
for i in numerical_feature:

sns.kdeplot(num_df[i])
plt.xlabel(i)
plt.ylabel("Count")
plt.title("Numerical Feature")
plt.show()
```



```
1e-7 Numerical Feature
```

In [36]:

```
1 len(numerical_feature)
```

Out[36]:

8

In [37]:

```
1 (numerical_feature)
```

Out[37]:

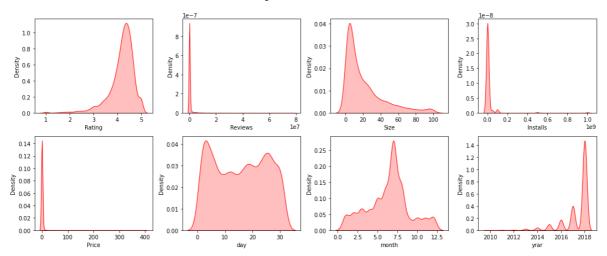
```
['Rating', 'Reviews', 'Size', 'Installs', 'Price', 'day', 'month', 'yrar']
```

In [38]:

```
# same code for numerical feature
plt.figure(figsize=(15,15))
plt.suptitle("Univarite analysis of Numerical Features" ,fontsize= 20,fontweight= "bold"

for i in range (len(numerical_feature)):
   plt.subplot(5,4,i+1)
   sns.kdeplot(x=df[numerical_feature[i]],shade = True ,color= "r" )
   plt.xlabel(numerical_feature[i])
   plt.tight_layout()
   #https://matplotlib.org/stable/api/_as_gen/matplotlib.pyplot.tight_layout.html
```

Univarite analysis of Numerical Features



Observations

size, reviewers ,Price, Indtallsis are positive skewed and

rating and year is negative skewed(left skewed).

month is normally distributed

Analysis on Categorical columns

```
In [39]:
 2
    categorial_feature
Out[39]:
['App',
 'Category',
 'Type<sup>¯</sup>,
 'Content Rating',
 'Genres',
 'Last Updated',
 'Current Ver',
 'Android Ver',
 'date']
In [40]:
 1 len(categorial_feature)
Out[40]:
```

9

In [41]:

1 cat_df

Out[41]:

	Арр	Category	Туре	Content Rating	Genres	Last Updated	Curren Ve
0	Photo Editor & Candy Camera & Grid & ScrapBook	ART_AND_DESIGN	Free	Everyone	Art & Design	2018- 01-07	1.0.0
1	Coloring book moana	ART_AND_DESIGN	Free	Everyone	Art & Design;Pretend Play	2018- 01-15	2.0.0
2	U Launcher Lite – FREE Live Cool Themes, Hide	ART_AND_DESIGN	Free	Everyone	Art & Design	2018- 08-01	1.2.
3	Sketch - Draw & Paint	ART_AND_DESIGN	Free	Teen	Art & Design	2018- 06-08	Varie witl device
4	Pixel Draw - Number Art Coloring Book	ART_AND_DESIGN	Free	Everyone	Art & Design;Creativity	2018- 06-20	1.
10835	Sya9a Maroc - FR	FAMILY	Free	Everyone	Education	2017- 07-25	1.4
10836	Fr. Mike Schmitz Audio Teachings	FAMILY	Free	Everyone	Education	2018- 07-06	1.0
10837	Parkinson Exercices FR	MEDICAL	Free	Everyone	Medical	2017- 01-20	1.0
10838	The SCP Foundation DB fr nn5n	BOOKS_AND_REFERENCE	Free	Mature 17+	Books & Reference	2015- 01-19	Varie witl device
10839	iHoroscope - 2018 Daily Horoscope & Astrology	LIFESTYLE	Free	Everyone	Lifestyle	2018- 07-25	Varie witl device
0017 ra	ws × 9 colu	mne					
9947 10	ws ^ 9 colu						
1		•					

```
In [42]:
```

```
# check the different categories in "Type" Feature
cat_df["Type"].value_counts()
```

Out[42]:

```
Free 9215
Paid 731
```

Name: Type, dtype: int64

In [43]:

```
1 cat_df["Type"].unique()
```

Out[43]:

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

In []:

1

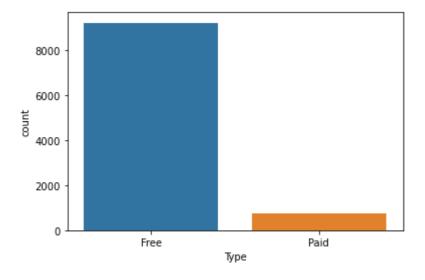
there are 9215 apps are free and 731 apps are paid

In [44]:

```
1 # plot this in count plot
2 sns.countplot(cat_df["Type"])
```

Out[44]:

<AxesSubplot:xlabel='Type', ylabel='count'>



In [45]:

```
# plot such graphs or type and Content Rating
cat_df["Content Rating"].value_counts()
```

Out[45]:

Everyone 8094
Teen 1099
Mature 17+ 398
Everyone 10+ 351
Adults only 18+ 3
Unrated 2

Name: Content Rating, dtype: int64

In [46]:

```
1 cat_df["Content Rating"].unique()
```

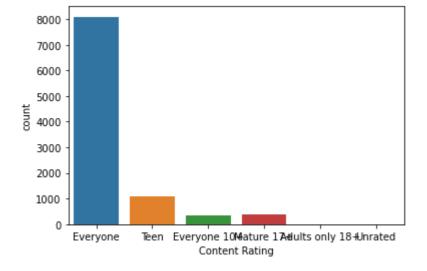
Out[46]:

In [47]:

```
1 sns.countplot(cat_df["Content Rating"])
```

Out[47]:

<AxesSubplot:xlabel='Content Rating', ylabel='count'>

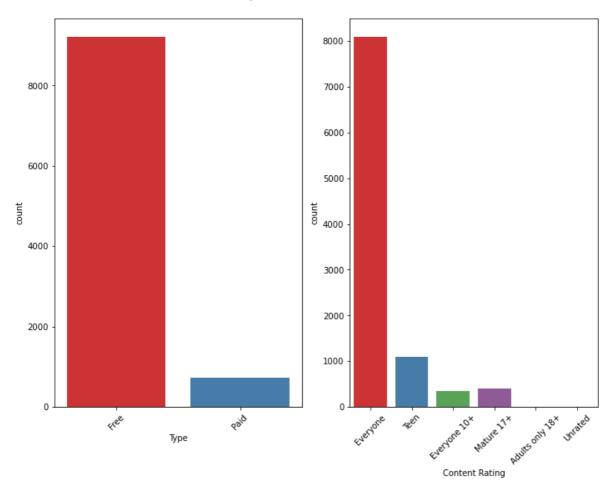


In [48]:

```
plt.figure(figsize= (10,15))
plt.suptitle("Univarite analysis of Numerical Features", fontsize= 20,fontweight= "bold
category=["Type","Content Rating"] # we ploted for these two features only

for i in range(0,len(category)):
   plt.subplot(2,2, i+1)
   sns.countplot(x= df[category[i]], palette="Set1")
   plt.xlabel( category[i])
   plt.xticks(rotation = 45)
   plt.tight_layout()
```

Univarite analysis of Numerical Features



if the categories are 5-8 then its good to use count plot but if gategories are more then its complicated.

In [49]:

```
cat_df["Genres"].unique()
cat_df["Genres"].value_counts()
```

Out[49]:

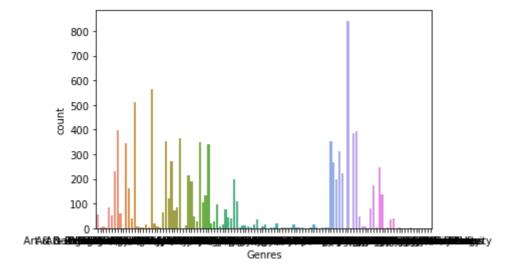
Tools	842
Entertainment	563
Education	510
Business	398
Productivity	392
	• • •
Health & Fitness; Education	1
Music & Audio; Music & Video	1
Arcade;Pretend Play	1
Entertainment; Education	1
Strategy;Creativity	1
Name: Genres, Length: 118,	dtvpe: inte

In [50]:

```
1 # 118 categories
2 sns.countplot(cat_df["Genres"])
```

Out[50]:

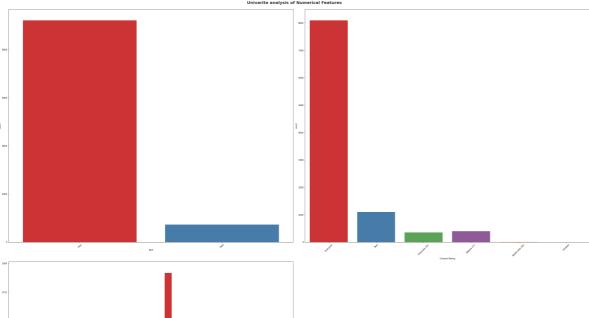
<AxesSubplot:xlabel='Genres', ylabel='count'>

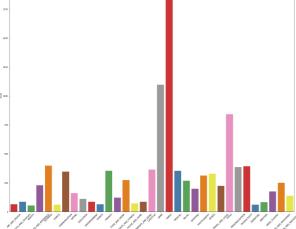


In [51]:

```
plt.figure(figsize= (40,35))
plt.suptitle("Univarite analysis of Numerical Features", fontsize= 20,fontweight= "bold
category=["Type","Content Rating","Category"] # we ploted for these two features only

for i in range(0,len(category)):
   plt.subplot(2,2, i+1)
   sns.countplot(x= df[category[i]], palette="Set1")
   plt.xlabel( category[i])
   plt.xticks(rotation = 45)
   plt.tight_layout()
```





qauestion: which one is most popular category

try to write a code

use Pie plot

(count plot and bar plot is same)

In [52]:

```
1 cat_df["Category"].value_counts()
2 # family is most popular category
```

Out[52]:

E4447137	404=		
FAMILY	1917		
GAME	1098		
TOOLS	843		
BUSINESS	398 392		
PRODUCTIVITY			
PERSONALIZATION LIFESTYLE	385 365		
FINANCE	354		
MEDICAL	354 354		
COMMUNICATION	334 346		
SPORTS	346 328		
PHOTOGRAPHY	312		
HEALTH AND FITNESS	273		
SOCIAL	267		
NEWS_AND_MAGAZINES	249		
BOOKS AND REFERENCE	229		
TRAVEL_AND_LOCAL	223		
SHOPPING	199		
VIDEO PLAYERS	175		
DATING	160		
MAPS AND NAVIGATION	137		
FOOD AND DRINK	121		
EDUCATION	111		
AUTO AND VEHICLES	85		
LIBRARIES_AND_DEMO	85		
ENTERTAINMENT	85		
WEATHER	82		
HOUSE AND HOME	72		
ART_AND_DESIGN	65		
EVENTS	64		
PARENTING	60		
COMICS	60		
BEAUTY	53		
Name: Category, dtype:	int64		

```
In [53]:
 1 # Pie plot for family
 2 sns.pieplot(cat_df["Category"])
AttributeError
                                          Traceback (most recent call last)
Input In [53], in <cell line: 2>()
      1 # Pie plot for family
----> 2 sns.pieplot(cat_df["Category"])
AttributeError: module 'seaborn' has no attribute 'pieplot'
In [ ]:
 1 cat_df["Category"].value_counts().plot.pie()
In [ ]:
 1 # enhance Figure size
 2 cat_df["Category"].value_counts().plot.pie(figsize=(15,20))
 3 plt.suptitle("Pie chart", fontsize= 20, fontweight= "bold", alpha=0.8, y=0.5)
In [ ]:
 1 # enhance Figure size
    plt.suptitle("Pie chart", fontsize= 20, fontweight= "bold", alpha=0.8, y=0.8)
    cat_df["Category"].value_counts().plot.pie(figsize=(15,20))
 4
In [ ]:
 1 # to get the percentages
    plt.suptitle("Pie chart", fontsize= 20,fontweight= "bold",alpha=0.8,y=0.8)
 3
    cat_df["Category"].value_counts().plot.pie(figsize=(15,20),autopct='%.0f%%')
 4
 5 # plotting data on chart
 6 | #plt.pie(cat_df["Category"].value_counts(), colors=palette_color, autopct='%.0f%%')
 7
 8 # displaying chart
    plt.show()
```

Q: Write a code to get top ten app categories

```
In [ ]:

1 cat_df["Category"].value_counts()

In [ ]:

1 # put above in new data frame
2 pd.DataFrame(cat_df["Category"].value_counts())
```

```
In [ ]:

1  # Take this data frame in new variable called category
2  category=pd.DataFrame(cat_df["Category"].value_counts())

In [ ]:

1  # we got top 10 categories
2  category.head(10)

In [ ]:

1  # rename category heading to count
2  category.rename(columns={"Category":"counts"},inplace= True)
3  category
```

plot the only 10 values

reset the index

```
In []:

1  # sns.countplot(x= category.index[:10],y= "counts",data=category[:10])
2  #sns do not gives output so use bar graph
3  sns.barplot(x= category.index[:10],y= "counts",data=category[:10])

In []:

1  # unable to see properly so pass figure size
2  plt.figure(figsize=(20,20))
3  sns.barplot(x= category.index[:10],y= "counts",data=category[:10])
```

Q: which category has largest installation

```
In [ ]:
```

```
1 # arrange in sort manner
2 df.groupby(["Category"])["Installs"].sum().sort_values()
```

In []:

```
# Arrange in desendings
df.groupby(["Category"])["Installs"].sum().sort_values(ascending= False)
```

In []:

```
# another way to get top 10 largest values
df.groupby(["Category"])["Installs"].sum().nlargest(10)
```

we can plot this by bar plot or Pie plot

```
In [ ]:

1 df.groupby(["Category"])["Installs"].sum().nlargest(10).plot.pie(figsize= (12,12))
```

Bar Plot

```
In [ ]:
```

```
df.groupby(["Category"])["Installs"].sum().nlargest(10).plot.bar(figsize= (12,12))
#df.groupby(["Category"])["Installs"].sum().nlargest(10).plot.(kind= "bar", figsize= (12,12))
```

qestions

- 1.how many apps are there on google play store which get 5 ratings?
- 2.does size of the application has any impact on its popularity?
- 3. what are the top 5 most installed apps in each popular category?
- 4.which category app users are reviewing the most?
- 5.which kind of app user are downloading the most free/paid?

liner regression

you need to create a model(linear regression) where all the features except Rating will be independent features and rating will be a dependent feature

create a model : https://scikit-

<u>learn.org/stable/modules/generated/sklearn.linear_model.LinearRegression.html (https://scikit-learn.org/stable/modules/generated/sklearn.linear_model.LinearRegression.html)</u>

In [54]:

```
#1.how many apps are there on google play store which get 5 ratings?
df[df["Rating"]==5] # get the data which has rating 5
df[df["Rating"]==5]["App"] # there are 268 app's whoes rating are 5
df[df["Rating"]==5]["App"].count()
a=df[df["Rating"]==5]["App"].count()
print("Total Apps on google play store which get 5 ratings are:",a)
```

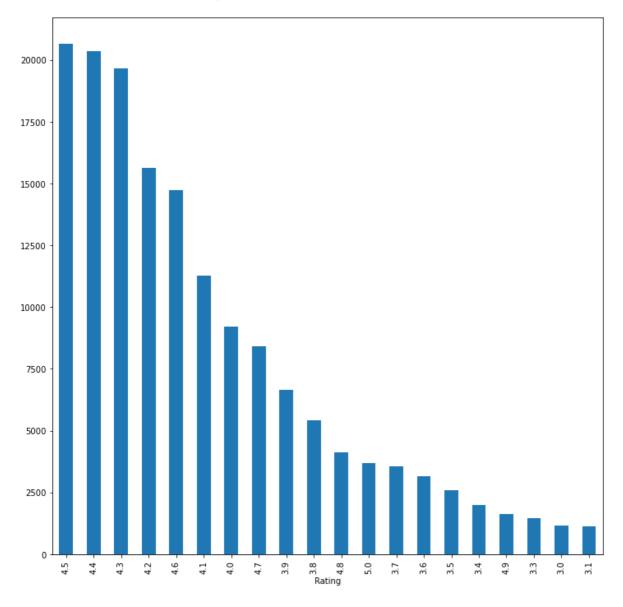
Total Apps on google play store which get 5 ratings are: 268

In [55]:

```
# 2.does size of the application has any impact on its popularity?
df.groupby(["Rating"])["Size"].sum().sort_values(ascending= False)
df.groupby(["Rating"])["Size"].sum().sort_values(ascending= False).nlargest(20).plot.bate
#Yes as size increases the rating increases
```

Out[55]:

<AxesSubplot:xlabel='Rating'>



```
In [56]:
```

```
df.groupby(["Rating"])["Size"].sum().sort_values(ascending= False)
```

Out[56]:

```
Rating
4.5
       20669.600
4.4
       20368.257
4.3
       19641.206
4.2
       15641.182
4.6
       14742.759
4.1
       11274.782
4.0
        9208.417
4.7
        8423.204
3.9
        6659.470
        5415.697
3.8
4.8
        4110.963
5.0
        3690.552
3.7
        3554.864
        3142.002
3.6
3.5
        2595.239
        1974.876
3.4
4.9
        1630.434
3.3
        1453.582
3.0
        1171.716
3.1
        1124.628
3.2
         794.176
2.8
         675.672
2.9
         672.685
2.3
         344.600
2.5
         340.862
2.7
         335.270
2.4
         275.809
1.0
         228.800
2.6
         218.836
         217.400
2.2
2.0
         191.400
         164.200
2.1
1.9
         154.200
1.7
          80.300
1.6
          64.600
          54.000
1.5
1.8
          49.087
1.2
          27.000
          20.200
1.4
Name: Size, dtype: float64
```

In [57]:

```
#3.what are the top 5 most installed apps in each popular category?
df.groupby(["App","Category"])["Installs"].sum().sort_values(ascending= False).head(5)
```

Out[57]:

App Category Hangouts COMMUNICATION 4000000000 Subway Surfers **GAME** 4000000000 Google Photos PHOTOGRAPHY 4000000000 Maps - Navigate & Explore TRAVEL_AND_LOCAL 3000000000 Google Chrome: Fast & Secure COMMUNICATION 3000000000

Name: Installs, dtype: int64

In []:

1 # there are communication, game, photography, TRAVEL_AND_LOCAL , COMMUNICATION categor

In [60]:

```
#4.which category app users are reviewing the most?
df.groupby(["Category"])["Reviews"].sum().sort_values(ascending= False)
```

Out[60]:

Out[60]:	
Category	
GAME	1245650951
SOCIAL	450953900
COMMUNICATION	397569013
FAMILY	383338162
TOOLS	273185044
PHOTOGRAPHY	195466914
VIDEO_PLAYERS	110380188
PRODUCTIVITY	92374969
SHOPPING	82317633
PERSONALIZATION	67506827
SPORTS	61996740
TRAVEL_AND_LOCAL	51260122
ENTERTAINMENT	37854634
MAPS_AND_NAVIGATION	30659254
HEALTH_AND_FITNESS	23936793
NEWS_AND_MAGAZINES	22979922
BOOKS_AND_REFERENCE	21787385
FINANCE	16449054
WEATHER	14604735
EDUCATION	13988229
LIFESTYLE	12760163
BUSINESS	11022817
FOOD_AND_DRINK	6459822
DATING	3799655
COMICS	3383276
ART_AND_DESIGN	1714440
HOUSE_AND_HOME	1613159
MEDICAL	1207546
AUTO_AND_VEHICLES	1163666
LIBRARIES_AND_DEMO	1037118

Name: Reviews, dtype: int64

958331

396240

161018

PARENTING

BEAUTY

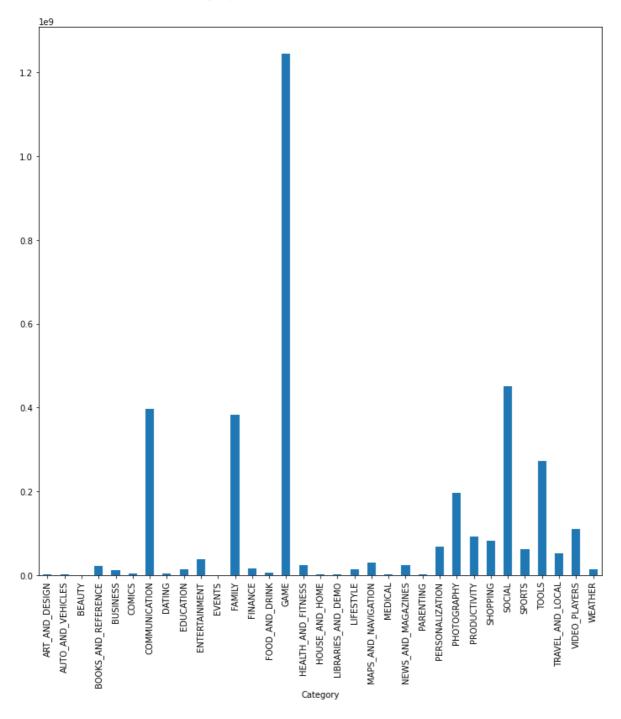
EVENTS

In [59]:

```
df.groupby(["Category"])["Reviews"].sum().plot.bar(figsize= (12,12))
# Ans: App category GAME reviews a most which is equal to 1245650951
```

Out[59]:

<AxesSubplot:xlabel='Category'>



```
In [58]:
    #5.which kind of app user are downloading the most free/paid?
   # check the different categories in "Type" Feature
 3 cat_df["Type"].value_counts()
 4 | #df.groupby(["Type","App"])["Installs"].sum().sort_values(ascending= False)
 5 df.groupby(["Type", "App"])["Installs"].value_counts().sort_values(ascending= False)
 6 | # Ans : below are the details of free an paid user app's with downloading detals
Out[58]:
Type App
                                     Installs
Free ROBLOX
                                     100000000
                                                   9
      8 Ball Pool
                                     100000000
      Zombie Catchers
                                     10000000
      Helix Jump
                                     100000000
                                                   6
      Angry Birds Classic
                                     100000000
                                                   5
      Dumb Ways to Die 2: The Games 50000000
                                                  1
      Dulquer Salmaan HD Wallpapers
                                                   1
      Dude Perfect
                                     10000
                                                   1
      Dubsmash
                                     100000000
                                                   1
Paid 💎 I'm rich
                                       10000
Name: Installs, Length: 9393, dtype: int64
In [ ]:
 1 df.head(5)
In [ ]:
 1 cat_df.head()
In [ ]:
 1 # plot pie plot for type
 2 | df.value_counts("Type").plot(kind ="pie",figsize = (10,10))
In [ ]:
   df.value_counts("Type").plot(kind ="bar",figsize = (10,10))
In [ ]:
   # Linear Rearession
   num df.head()
```

create linear regression model where all the features except rating will be a independent feature and rating

will be a dependent feature. so use

https://scikit-learn.org/stable/modules/generated/sklearn.linear_model.LinearRegression.html (https://scikit-learn.org/stable/modules/generated/sklearn.linear_model.LinearRegression.html)

In [[]:					
1						