```
# Import the necessary libraries
import pandas as pd
# Step 1: Load the data file using pandas
data = pd.read csv("D:\data analystics\Python for data analytics\")
Practice scripts\googleplaystore.csv.csv")
# Step 2: Check for null values in the data and get the number of null
values for each column
null counts = data.isnull().sum()
# Step 3: Drop records with nulls in any of the columns
data = data.dropna()
# Display the first few rows of the cleaned data
print(data.head())
                                                            Category
                                                 App
Rating \
      Photo Editor & Candy Camera & Grid & ScrapBook ART AND DESIGN
0
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
               Pixel Draw - Number Art Coloring Book ART AND DESIGN
4
4.3
           Size
                              Type Price Content Rating \
 Reviews
                    Installs
0
      159
            19M
                     10,000+
                              Free
                                       0
                                               Everyone
                                       0
1
      967
            14M
                    500,000+
                              Free
                                               Everyone
2
                  5,000,000+
    87510
           8.7M
                              Free
                                       0
                                               Everyone
3
  215644
            25M
                 50,000,000+
                                       0
                              Free
                                                   Teen
     967
           2.8M
                    100,000+ Free
                                       0
                                               Everyone
                                  Last Updated
                      Genres
                                                       Current Ver \
                Art & Design
                               January 7, 2018
                                                             1.0.0
0
1
  Art & Design; Pretend Play
                             January 15, 2018
                                                             2.0.0
2
                Art & Design
                                August 1, 2018
                                                             1.2.4
                                  June 8, 2018 Varies with device
3
                Art & Design
                                 June 20, 2018
     Art & Design; Creativity
    Android Ver
  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
```

```
# Display the number of null values for each column
print(null counts)
App
                      0
                      0
Category
                   1474
Rating
Reviews
                     0
Size
                      0
                      0
Installs
                      1
Type
                      0
Price
                      1
Content Rating
                      0
Genres
Last Updated
                      0
                      8
Current Ver
Android Ver
                      3
dtype: int64
data
                                                       App
Category \
          Photo Editor & Candy Camera & Grid & ScrapBook
ART AND DESIGN
                                      Coloring book moana
ART AND DESIGN
       U Launcher Lite - FREE Live Cool Themes, Hide ...
ART AND DESIGN
                                    Sketch - Draw & Paint
ART AND DESIGN
                    Pixel Draw - Number Art Coloring Book
ART_AND_DESIGN
. . .
10834
                                             FR Calculator
FAMILY
10836
                                         Sya9a Maroc - FR
FAMILY
                         Fr. Mike Schmitz Audio Teachings
10837
FAMILY
                            The SCP Foundation DB fr nn5n
10839
BOOKS AND REFERENCE
10840
           iHoroscope - 2018 Daily Horoscope & Astrology
LIFESTYLE
       Rating Reviews
                                      Size
                                                Installs
                                                          Type Price \
0
          4.1
                  159
                                       19M
                                                 10,000+
                                                          Free
                                                                    0
1
          3.9
                  967
                                       14M
                                                500,000+
                                                                    0
                                                          Free
2
          4.7
                87510
                                              5,000,000+
                                                                    0
                                      8.7M
                                                          Free
3
          4.5
               215644
                                       25M
                                             50,000,000+
                                                          Free
                                                                    0
```

```
4
          4.3
                  967
                                       2.8M
                                                100,000+
                                                           Free
                                                                    0
          . . .
                                                            . . .
10834
          4.0
                    7
                                       2.6M
                                                     500+
                                                           Free
                                                                    0
          4.5
                    38
                                                  5,000+
                                                           Free
                                                                    0
10836
                                        53M
10837
          5.0
                    4
                                       3.6M
                                                     100+
                                                           Free
                                                                    0
10839
          4.5
                   114
                                                  1.000+
                                                                    0
                        Varies with device
                                                           Free
          4.5
10840
              398307
                                                                    0
                                        19M
                                             10,000,000+
                                                           Free
      Content Rating
                                                        Last Updated \
                                           Genres
0
            Everyone
                                     Art & Design
                                                    January 7, 2018
1
            Everyone Art & Design; Pretend Play
                                                   January 15, 2018
2
                                     Art & Design
                                                      August 1, 2018
            Everyone
3
                Teen
                                     Art & Design
                                                        June 8, 2018
4
                                                       June 20, 2018
            Everyone
                         Art & Design; Creativity
                                        Education
                                                       June 18, 2017
10834
            Everyone
                                        Education
                                                       July 25, 2017
10836
            Everyone
10837
            Everyone
                                        Education
                                                        July 6, 2018
10839
          Mature 17+
                               Books & Reference
                                                    January 19, 2015
                                                       July 25, 2018
10840
            Everyone
                                        Lifestyle
              Current Ver
                                   Android Ver
0
                     1.0.0
                                  4.0.3 and up
1
                     2.0.0
                                  4.0.3 and up
2
                     1.2.4
                                  4.0.3 and up
3
       Varies with device
                                     4.2 and up
4
                                     4.4 and up
                       . . .
. . .
10834
                     1.0.0
                                     4.1 and up
10836
                      1.48
                                     4.1 and up
10837
                       1.0
                                     4.1 and up
10839
      Varies with device Varies with device
10840
      Varies with device Varies with device
[9360 rows x 13 columns]
# Check data types of each column and get DataFrame info
data info = data.info()
# Display the data types and additional information
print(data info)
<class 'pandas.core.frame.DataFrame'>
Index: 9360 entries, 0 to 10840
Data columns (total 13 columns):
#
                      Non-Null Count
     Column
                                       Dtype
- - -
0
     App
                      9360 non-null
                                       object
                      9360 non-null
 1
     Category
                                       object
 2
     Rating
                      9360 non-null
                                       float64
```

```
3
                     9360 non-null
     Reviews
                                     object
4
     Size
                     9360 non-null
                                     object
 5
    Installs
                     9360 non-null
                                     object
 6
                     9360 non-null
    Type
                                     object
7
    Price
                     9360 non-null
                                     object
 8
    Content Rating
                     9360 non-null
                                     object
 9
                     9360 non-null
    Genres
                                     object
 10 Last Updated
                     9360 non-null
                                     object
 11 Current Ver
                     9360 non-null
                                     object
12 Android Ver
                     9360 non-null
                                     object
dtypes: float64(1), object(12)
memory usage: 1023.8+ KB
None
# Step 4.1.1: Extract the numeric value from the "Size" column and
convert it to KB
def size to kb(size):
    if size.endswith('M'):
        return float(size.replace('M', '')) * 1000 # Convert from MB
to KB
    elif size.endswith('k'):
        return float(size.replace('k', '')) # Already in KB
    elif size == 'Varies with device':
        return None # Placeholder for "Varies with device" values
    else:
        return None # Handle other cases or missing data as needed
data['Size'] = data['Size'].apply(size_to_kb)
# Step 4.1.2: Replace "Varies with device" with the average size
average size = data['Size'].mean()
data['Size'].replace('Varies with device', average size, inplace=True)
# Step 4.1.3: Check if the "Size" column is in integer data type (int)
data['Size'] = data['Size'].astype('float') # Convert to float to
handle possible NaN values
# Check the data types and the first few rows of the DataFrame after
cleaning
print(data.dtypes)
print(data.head())
App
                   object
Category
                   object
Rating
                  float64
Reviews
                   object
Size
                  float64
Installs
                   object
                   object
Type
Price
                   object
```

```
Content Rating
                   object
Genres
                   object
Last Updated
                   object
Current Ver
                   object
Android Ver
                   object
dtype: object
                                                 App
                                                            Category
Rating \
      Photo Editor & Candy Camera & Grid & ScrapBook ART AND DESIGN
0
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
               Pixel Draw - Number Art Coloring Book ART AND DESIGN
4
4.3
                       Installs Type Price Content Rating \
 Reviews
             Size
                        10,000+
0
      159
           19000.0
                                 Free
                                          0
                                                  Everyone
                       500,000+
                                          0
1
      967
           14000.0
                                 Free
                                                  Everyone
2
   87510
           8700.0
                     5,000,000+
                                          0
                                                  Everyone
                                 Free
3
                    50,000,000+
  215644
           25000.0
                                          0
                                                      Teen
                                 Free
4
     967
           2800.0
                       100,000+
                                 Free
                                          0
                                                  Everyone
                                  Last Updated
                                                       Current Ver \
                      Genres
0
                Art & Design
                               January 7, 2018
                                                             1.0.0
1
  Art & Design; Pretend Play January 15, 2018
                                                             2.0.0
2
                                                             1.2.4
                Art & Design
                                August 1, 2018
                                 June 8, 2018 Varies with device
3
                Art & Design
                                 June 20, 2018
    Art & Design; Creativity
   Android Ver
  4.0.3 and up
  4.0.3 and up
1
  4.0.3 and up
3
     4.2 and up
  4.4 and up
data
                                                     App
Category
          Photo Editor & Candy Camera & Grid & ScrapBook
ART AND DESIGN
                                     Coloring book moana
ART AND DESIGN
       U Launcher Lite - FREE Live Cool Themes, Hide ...
ART AND DESIGN
```

3	DECTON			Sketch -	Draw &	Paint	
4	D_DESIGN		el Draw -	Number Art C	oloring	Book	
_	D_DESIGN						
10834 FAMILY				F	R Calcu	ılator	
10836				Sya9	a Maroc	: - FR	
FAMILY 10837			Fr. Mik	e Schmitz Aud	io Teac	chinas	
FAMILY							
10839 BOOKS A	AND REFE	RENCE	The	SCP Foundatio	n DB fr	nn5n	
10840 LIFESTY	_ iHo		- 2018 Da	ily Horoscope	& Astr	rology	
	Rating	Reviews	Size	Installs	Type F	rice Co	ntent Rating
0	4.1	159	19000.0	10,000+	Free	0	Everyone
1	3.9	967	14000.0	500,000+	Free	0	Everyone
2	4.7	87510	8700.0	5,000,000+	Free	0	Everyone
3	4.5	215644	25000.0	50,000,000+	Free	0	Teen
4	4.3	967	2800.0	100,000+	Free	0	Everyone
				ŕ			-
				•••			• • •
10834	4.0	7	2600.0	500+	Free	0	Everyone
10836	4.5	38	53000.0	5,000+	Free	0	Everyone
10837	5.0	4	3600.0	100+	Free	0	Everyone
10839	4.5	114	NaN	1,000+	Free	0	Mature 17+
10840	4.5	398307	19000.0	10,000,000+	Free	0	Everyone
\			Genre	s Last U	pdated		Current Ver
ò		Ar	t & Desig	n January 7	, 2018		1.0.0
1	Art & D	esign;Pr	etend Pla	y January 15	, 2018		2.0.0
2		Ar	t & Desig	n August 1	, 2018		1.2.4
3		Ar	t & Desig	n June 8	, 2018	Varies	with device

```
Art & Design; Creativity June 20, 2018
                                                                    1.1
10834
                       Education
                                     June 18, 2017
                                                                  1.0.0
10836
                       Education
                                     July 25, 2017
                                                                  1.48
10837
                       Education
                                      July 6, 2018
                                                                    1.0
10839
               Books & Reference January 19, 2015 Varies with device
10840
                                     July 25, 2018 Varies with device
                       Lifestyle
              Android Ver
             4.0.3 and up
0
1
             4.0.3 and up
2
             4.0.3 and up
3
               4.2 and up
4
               4.4 and up
10834
               4.1 and up
10836
               4.1 and up
10837
               4.1 and up
10839 Varies with device
10840 Varies with device
[9360 rows x 13 columns]
# Step 4.2: Convert the "Reviews" field to numeric (int/float)
data['Reviews'] = pd.to numeric(data['Reviews'], errors='coerce')
# Step 4.3: Format the "Installs" field
# Step 4.3.1: Treat "1,000,000+" as 1,000,000
data['Installs'] = data['Installs'].apply(lambda x: x.replace('+', '')
if '+' in str(x) else x)
# Step 4.3.2: Remove '+' and ',' and convert it to an integer
data['Installs'] = data['Installs'].str.replace(',', '').astype(int)
# Step 4.4: Format the "Price" field
data['Price'] = data['Price'].str.replace('$', '').astype(float)
# Check the data types and the first few rows of the DataFrame after
cleaning
print(data.dtypes)
print(data.head())
```

```
App
                   object
                  object
Category
Rating
                  float64
                   int64
Reviews
Size
                  float64
Installs
                   int32
Type
                  object
Price
                  float64
Content Rating
                  object
Genres
                  object
Last Updated
                   object
Current Ver
                   object
Android Ver
                   object
dtype: object
                                                App
                                                           Category
Rating \
     Photo Editor & Candy Camera & Grid & ScrapBook ART AND DESIGN
0
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
           19000.0
                       10000 Free
                                      0.0
                                                Everyone
1
      967
           14000.0
                      500000 Free
                                      0.0
                                                Everyone
2
    87510
            8700.0
                     5000000
                              Free
                                      0.0
                                                Everyone
3
   215644
           25000.0
                    50000000 Free
                                      0.0
                                                    Teen
4
      967
            2800.0
                      100000 Free
                                      0.0
                                                Everyone
                                 Last Updated
                                                      Current Ver \
                     Genres
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
                                June 8, 2018 Varies with device
               Art & Design
    Art & Design; Creativity June 20, 2018
4
   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 and up
data
```

						App	
Catego 0	•	o Editor	& Candy C	amera & Gr	id & S	crapBook	
ART_AN 1	D_DESIGN			Color	ina bo	ok moana	
ART_AN	D_DESIGN	her lite	_ FREE Liv	ve Cool The	J		
ART_AN	D_DESIGN	Her Lite	— INCC CI				
3 ART_AN	D_DESIGN			Sketch	- Draw	& Paint	
4 ART AN	D DESIGN	Pixe	l Draw -	Number Art	Color	ing Book	
10834					FR Ca	lculator	
FAMILY 10836				Sya	a9a Ma	roc - FR	K
FAMILY 10837			Fr. Mike	Schmitz A	udio T	eachings	
FAMILY 10839				CP Foundat:		J	
B00KS_	AND_REFE						
10840 LIFEST		roscope -	2018 Dai	ly Horosco _l	oe & A	strology	
	Rating	Reviews	Size	Installs	Туре	Price C	Content Rating
0	4.1	159	19000.0	10000	Free	0.0	Everyone
1	3.9	967	14000.0	500000	Free	0.0	Everyone
2	4.7	87510	8700.0	5000000	Free	0.0	Everyone
3	4.5	215644		50000000	Free	0.0	Teen
4	4.3	967	2800.0	100000	Free	0.0	Everyone
4	4.3	907	2000.0	100000	1166	0.0	Everyone
10004			2000.0				
10834	4.0	7	2600.0	500	Free	0.0	Everyone
10836	4.5	38	53000.0	5000	Free	0.0	Everyone
10837	5.0	4	3600.0	100	Free	0.0	Everyone
10839	4.5	114	NaN	1000	Free	0.0	Mature 17+
10840	4.5	398307	19000.0	10000000	Free	0.0	Everyone
			Genres	Last	Updat	ed	Current Ver

```
0
                    Art & Design January 7, 2018
                                                                   1.0.0
       Art & Design; Pretend Play
                                                                   2.0.0
                                   January 15, 2018
2
                    Art & Design
                                     August 1, 2018
                                                                   1.2.4
3
                    Art & Design
                                       June 8, 2018 Varies with device
         Art & Design;Creativity
                                      June 20, 2018
                                                                     1.1
                        Education
                                      June 18, 2017
                                                                   1.0.0
10834
10836
                        Education
                                      July 25, 2017
                                                                    1.48
10837
                        Education
                                       July 6, 2018
                                                                     1.0
               Books & Reference
                                   January 19, 2015 Varies with device
10839
10840
                                      July 25, 2018 Varies with device
                       Lifestyle
              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 and up
4
               4.1 and up
10834
10836
               4.1 and up
10837
               4.1 and up
10839
       Varies with device
10840
      Varies with device
[9360 rows x 13 columns]
# 5.1. Drop rows with average ratings outside the range of 1 to 5
data = data[(data['Rating'] >= 1) & (data['Rating'] <= 5)]</pre>
# 5.2. Drop rows where the number of reviews is greater than the
number of installs
data = data[data['Reviews'] <= data['Installs']]</pre>
# 5.3. Drop rows where the app type is "Free" but the price is greater
than 0
data = data[~((data['Type'] == 'Free') & (data['Price'] > 0))]
```

```
# Check the data shape after cleaning
print(data.shape)
(9353, 13)
# Display a random sample of 25 rows from the cleaned dataset
random sample = data.sample(25)
print(random sample)
                                                       App
Category \
1929
                                           Kick the Buddy
GAME
7938
                                             Crazy Wheels
GAME
4160
                                           G Cloud Backup
PRODUCTIVITY
5935
                              BA VPN - Free Unlimited VPN
FAMILY
588
                                       Adult Dirty Emojis
DATING
             Seven - 7 Minute Workout Training Challenge
1325
HEALTH_AND_FITNESS
                                          Plugin: AOT v5.0
209
BUSINESS
8975
                                                 SportCAM
T00LS
               Transformers Rescue Bots: Hero Adventures
2121
FAMILY
9547
                                                 EL NORTE
NEWS AND MAGAZINES
                                    Paramedic Pocket Prep
2397
MEDICAL
                           Counter Deck Calculator for CR
7781
T00LS
1281
                                           Nike+ Run Club
HEALTH AND FITNESS
                                        Clinic Doctor EHr
2484
MEDICAL
939
                            FOX NOW - On Demand & Live TV
ENTERTAINMENT
                                           Four In A Line
3944
GAME
10276 FirstCry Baby & Kids Shopping, Fashion & Paren...
SHOPPING
                    Pregnancy Calculator and Tracker app
2333
MEDICAL
                                The Aether: Life as a God
5583
FAMILY
5125
                                    Ag Valley Cooperative
```

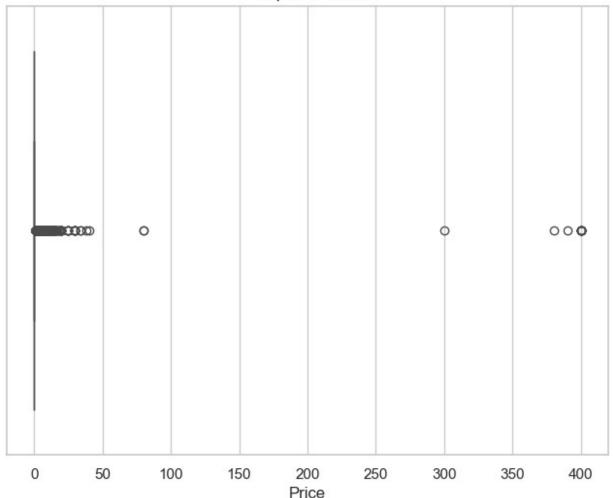
BUSINES 5268	SS			AJ Rafael	Music	Lesson	S
FAMILY 3976 LIFEST	/I F			D	iary w	ith loc	k
2207 FAMILY		s - Educa	tional ca	rtoons and	games	for	
2842 PH0T0GF	RAPHY		DSLR Came	ra Hd Ultr	a Prof	essiona	l
5379 FAMILY				Anno: B	uild a	n Empir	e
	Rating	Reviews	Size	Installs	Туре	Price	Content Rating
\ 1929	4.3	1003269	NaN	50000000	Free	0.0	Teen
7938	4.0	121082	7000.0	10000000	Free	0.0	Teen
4160	4.6	267042	NaN	5000000	Free	0.0	Everyone
5935	4.1	181	9200.0	10000	Free	0.0	Everyone
588	2.8	80	5500.0	10000	Free	0.0	Teen
1325	4.5	75571	NaN	1000000	Free	0.0	Everyone
209	3.1	4034	23.0	100000	Free	0.0	Everyone
8975	3.2	427	9500.0	100000	Free	0.0	Everyone
2121	4.2	41273	16000.0	5000000	Free	0.0	Everyone
9547	3.4	2436	NaN	100000	Free	0.0	Everyone
2397	4.3	460	13000.0	10000	Free	0.0	Everyone
7781	4.1	3446	19000.0	500000	Free	0.0	Everyone
1281	4.4	708674	NaN	10000000	Free	0.0	Everyone
2484	5.0	2	7100.0	5	Free	0.0	Everyone
939	3.9	60841	NaN	5000000	Free	0.0	Teen
3944	3.8	22191	3000.0	1000000	Free	0.0	Everyone
10276	4.1	41074	16000.0	5000000	Free	0.0	Everyone
2333	4.8	69126	61000.0	1000000	Free	0.0	Everyone
5583	4.1	1407	3400.0	100000	Free	0.0	Everyone 10+

5125	5.0	6	74000.0	500	Free	0.0	Everyone
5268	5.0	1	8200.0	10	Free	0.0	Everyone
3976	4.6	815280	4400.0	10000000	Free	0.0	Everyone
2207	4.1	182173	NaN	10000000	Free	0.0	Everyone
2842	4.2	4410	4500.0	1000000	Free	0.0	Everyone
5379	3.5	33944	28000.0	1000000	Free	0.0	Everyone 10+
Current	Ver \		Gen	res	Last Up	dated	
1929	vei (Act	ion	July 5,	2018	Varies with
device 7938			Advent	ure Jar	nuary 17,	2018	
1.0.7 4160			Productiv	itv /	April 29,	2018	Varies with
device			TTOUUCCIV	r cy r	April 29,	2010	varies with
5935		E	ntertainm	ent	June 14,	2018	
1.2.1 588			Dat	ina Nov	/ember 6,	2017	
1.0			ναι	Tilg No.	rember 0,	2017	
1325		Heal	th & Fitn	ess A	August 3,	2018	
7.2.5 209			Busin	ess Septe	ember 11,	2015	3.0.1.11
(Build	311)		Ta	.1.	Max. 4	2010	
8975 1.7.6			10	ols	May 4,	2018	
2121	Adventur	e;Action	& Advent	ure	July 5,	2018	
1.5 9547		News	& Magazi	nes	June 26,	2018	Varies with
device 2397			Medi	co1	July 12,	2010	
4.5.2					,		
7781 1.3.0			То	ols Feb	oruary 4,	2017	
1281		Heal	th & Fitn	ess	July 12,	2018	
2.17.0 2484			Medi	cal A	August 3,	2018	
1.0.51. 939	0.3	Е	ntertainm	ent	July 26,	2018	Varies with
device			_		•		
3944 1.10			Во	ard	May 4,	2015	
10276			Shopp	ing	June 27,	2018	
68				J			

```
2333
                             Medical
                                            June 1, 2018
2.6.1
5583
                       Role Playing
                                          March 12, 2018
1.0.5
5125
                            Business
                                           June 26, 2017
2.3
                      Entertainment
5268
                                       November 29, 2017
1.2.1
3976
                           Lifestyle
                                           June 30, 2018
4.90
                                           July 30, 2018
2207
        Entertainment; Music & Video
                                                          Varies with
device
2842
                        Photography
                                           June 27, 2018
4.1
5379
                            Strategy
                                          March 10, 2016
2.0.0
              Android Ver
1929
               4.4 and up
7938
               2.1 and up
       Varies with device
4160
5935
               5.0 and up
588
             4.0.3 and up
1325
       Varies with device
209
               2.2 and up
8975
               2.2 and up
2121
               4.1 and up
9547
       Varies with device
2397
               4.4 and up
7781
               4.1 and up
1281
               4.4 and up
2484
               8.0 and up
939
               4.4 and up
3944
               2.3 and up
10276
               4.1 and up
2333
               4.1 and up
5583
               4.0 and up
5125
               4.0 and up
               4.1 and up
5268
3976
               4.1 and up
2207
       Varies with device
2842
             4.0.3 and up
5379
               4.1 and up
# Import necessary libraries
import matplotlib.pyplot as plt
import seaborn as sns
# Set the style of the plots
sns.set(style="whitegrid")
```

```
# 6.1 Boxplot for Price
plt.figure(figsize=(8, 6))
sns.boxplot(x=data["Price"])
plt.title("Boxplot for Price")
plt.xlabel("Price")
plt.show()
```

Boxplot for Price



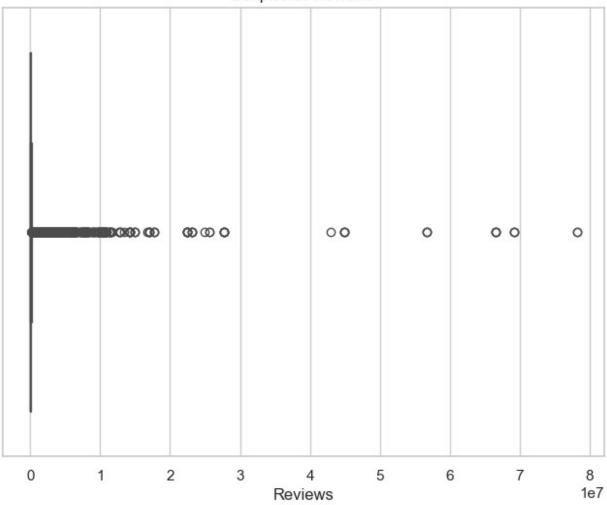
```
# 6.1.1 Are there any outliers?
# To check for outliers, you can calculate the interquartile range
(IQR) and use it to identify outliers.

Q1 = data["Price"].quantile(0.25)
Q3 = data["Price"].quantile(0.75)
IQR = Q3 - Q1
lower_bound = Q1 - 1.5 * IQR
upper_bound = Q3 + 1.5 * IQR
```

```
outliers price = data[(data["Price"] < lower bound) | (data["Price"] >
upper bound)]
print("Apps with Price outliers:")
print(outliers price)
Apps with Price outliers:
                                                   App
Category \
234
       TurboScan: scan documents and receipts in PDF
BUSINESS
                      Tiny Scanner Pro: PDF Doc Scan
235
BUSINESS
       TurboScan: scan documents and receipts in PDF
290
BUSINESS
                      Tiny Scanner Pro: PDF Doc Scan
291
BUSINESS
                                   Puffin Browser Pro
427
COMMUNICATION
                                  Fruit Ninja Classic
10682
GAME
                                             FO Bixby
10690
PERSONALIZATION
                                      Fast Tract Diet
10760
HEALTH AND FITNESS
                              Trine 2: Complete Story
10782
GAME
10785
                                         sugar, sugar
FAMILY
       Rating Reviews
                            Size Installs Type
                                                  Price Content Rating
234
                 11442
                         6800.0
          4.7
                                    100000
                                            Paid
                                                   4.99
                                                               Everyone
235
          4.8
                 10295
                        39000.0
                                    100000
                                            Paid
                                                   4.99
                                                               Everyone
290
          4.7
                 11442
                         6800.0
                                    100000
                                            Paid
                                                   4.99
                                                               Everyone
291
          4.8
                 10295
                        39000.0
                                    100000
                                            Paid
                                                   4.99
                                                               Everyone
427
          4.0
                 18247
                             NaN
                                    100000
                                            Paid
                                                   3.99
                                                               Everyone
. . .
                                            . . .
                                                     . . .
                                                                    . . .
10682
          4.3
                 85468
                        36000.0
                                   1000000
                                            Paid
                                                   0.99
                                                               Everyone
          5.0
10690
                     5
                          861.0
                                       100
                                            Paid
                                                   0.99
                                                               Everyone
```

10760	4.4	35	2400.0	•	1000	Paid	7.99	Eve	ryone
10782	3.8	252	11000.0	10	9000	Paid	16.99		Teen
10785	4.2	1405	9500.0	10	9000	Paid	1.20	Eve	ryone
		Genres	Las	t Up	dated	Cur	rent Ver	Andro	id Ver
234		Business	March	25,	2018		1.5.2	4.0	and up
235		Business	April	11,	2017		3.4.6	3.0	and up
290		Business	March	25,	2018		1.5.2	4.0	and up
291		Business	April	11,	2017		3.4.6	3.0	and up
427	Commu	unication	July	/ 5,	2018	7.5	.3.20547	4.1	and up
10682		Arcade	June	e 8,	2018	2.4.	1.485300	4.0.3	and up
10690	Persona	alization	April	25,	2018		0.2	7.0	and up
10760	Health 8	Fitness	Augus	8,	2018		1.9.3	4.2	and up
10782		Action	February	27,	2015		2.22	5.0	and up
10785		Puzzle	June	e 5,	2018		2.7	2.3	and up
[642 r	ows x 13	columns]							
plt.fi sns.bo plt.ti	gure(figs xplot(x=0 tle("Boxp abel("Rev	for Review size=(<mark>8, 6</mark> data["Revi olot for R views"))) .ews"])						

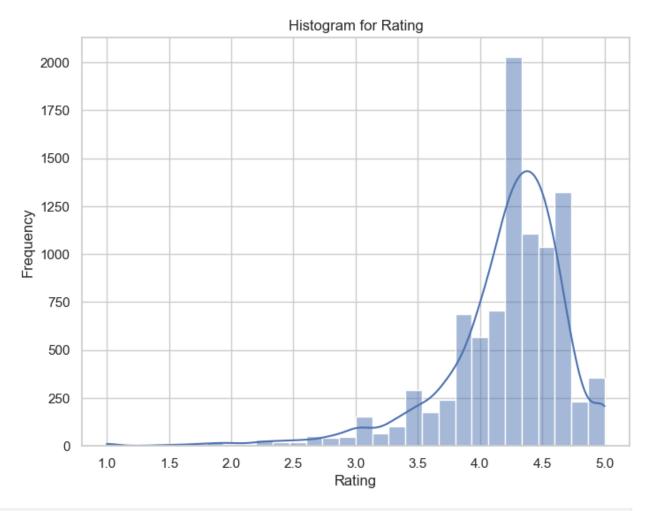
Boxplot for Reviews



```
# 6.2.1 Are there any apps with very high number of reviews?
# You can consider apps with reviews significantly higher than the
majority as potential outliers.
high_reviews_threshold = le6  # Define your threshold for "very high"
reviews
high reviews apps = data[data["Reviews"] > high reviews threshold]
print("Apps with very high number of reviews:")
print(high reviews apps)
Apps with very high number of reviews:
                                          App
                                                          Category
Rating \
139
                         Wattpad 🕮 Free Books BOOKS AND REFERENCE
4.6
152
                            Google Play Books
                                               BOOKS_AND_REFERENCE
3.9
                                  Uber Driver
                                                          BUSINESS
189
```

4.4 194	OfficeSuite : Free (Office + PD	F Edit	or	BUSINESS
4.3 201	Face	ebook Pages	Manag	er	BUSINESS
4.0		3	,		
			•	• •	
10190		Fallout	Shelt	er	FAMILY
4.6 10200	Face	ebook Pages	Manag	er	BUSINESS
4.0		Canana	roo Fi	50	CAME
10327 4.5		Garena F	iee ri	re	GAME
10636		FRONTLINE	COMMAN	D0	GAME
4.4 10707	Photo Edito	r Collage M	laker P	ro	PHOTOGRAPHY
4.5		-			
139 152 189 194 201	1433233 NaN 10 1254730 NaN	Installs 100000000 000000000 10000000 50000000	Type Free Free Free Free Free	Price Co 0.0 0.0 0.0 0.0 0.0	ontent Rating \ Teen Teen Everyone Everyone Everyone
10190 10200 10327 10636 10707	1351833 12000.0	10000000 50000000 10000000 10000000	Free Free Free Free Free	0.0 0.0 0.0 0.0 0.0	Teen Everyone Teen Teen Everyone
139 152 189 194 201	Genres Books & Reference Books & Reference Business Business Business	Last Up August 1, August 3, August 3, August 2, August 2,	2018 2018 2018 2018	Varies Varies	Current Ver \ with device with device with device 9.7.14188 with device
10190 10200 10327 10636 10707		June 11, August 6, August 3, October 28, February 1,	2018 2018 2013		1.13.12 with device 1.21.0 3.0.3 with device
139 152 189 194 201	Android Ver Varies with device Varies with device Varies with device 4.1 and up Varies with device				

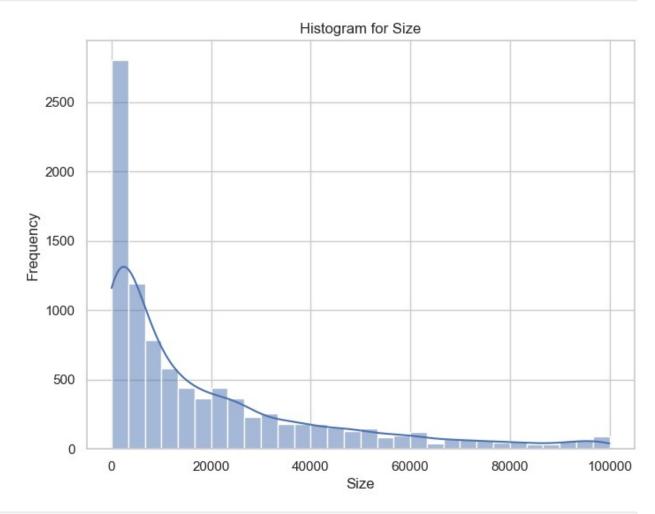
```
10190
               4.1 and up
10200 Varies with device
10327
             4.0.3 and up
10636
               2.1 and up
10707 Varies with device
[704 rows x 13 columns]
# 6.3 Histogram for Rating
plt.figure(figsize=(8, 6))
sns.histplot(data["Rating"], bins=30, kde=True)
plt.title("Histogram for Rating")
plt.xlabel("Rating")
plt.ylabel("Frequency")
plt.show()
```



6.4 Histogram for Size # Before plotting, handle any NaN values in the Size column. data["Size"].fillna(0, inplace=True)

```
data["Size"] = data["Size"].astype(float)

plt.figure(figsize=(8, 6))
sns.histplot(data["Size"], bins=30, kde=True)
plt.title("Histogram for Size")
plt.xlabel("Size")
plt.ylabel("Frequency")
plt.show()
```

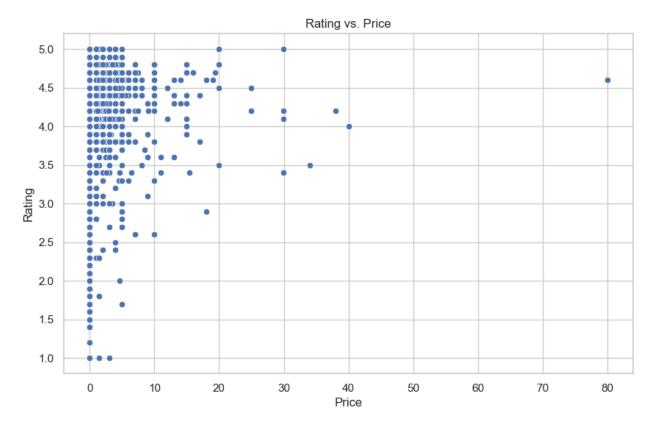


```
#Check out the records with very high prices (e.g., $200) to see if
they are indeed outliers.
high_price_apps = data[data['Price'] > 200]

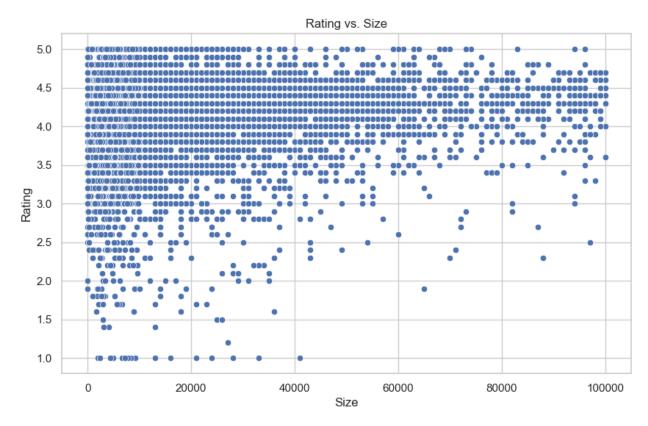
#After reviewing the high-priced apps, decide if they are legitimate
or junk. If they are junk, drop them from the dataset.
data = data[data['Price'] <= 200]

#Drop records with more than 2 million reviews.
data = data[data['Reviews'] <= 2000000]</pre>
```

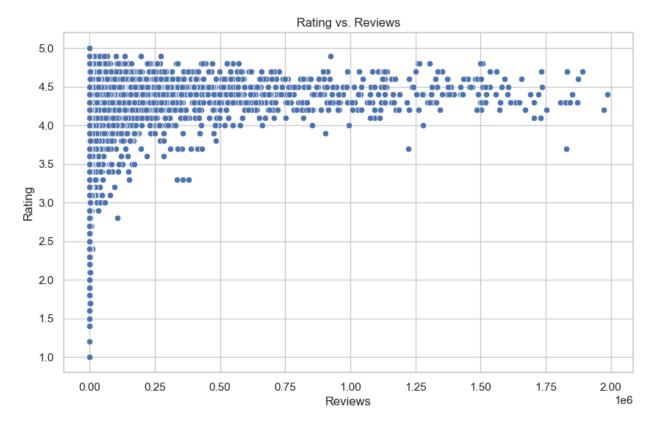
```
#Calculate different percentiles (10, 25, 50, 70, 90, 95, 99) for the
Installs column to decide on a cutoff for outliers.
percentiles = data['Installs'].quantile([0.10, 0.25, 0.50, 0.70, 0.90,
0.95, 0.99]
print(percentiles)
0.10
             1000.0
0.25
            10000.0
0.50
           500000.0
0.70
          1000000.0
0.90
         10000000.0
0.95
         10000000.0
0.99
        100000000.0
Name: Installs, dtype: float64
#99th percentile (100,000,000) as a threshold to drop records with
very high installs as outliers:
threshold = data['Installs'].quantile(0.99)
data = data[data['Installs'] <= threshold]</pre>
#8.1. Scatter plot/joinplot for Rating vs. Price:
import seaborn as sns
import matplotlib.pyplot as plt
plt.figure(figsize=(10, 6))
sns.scatterplot(x='Price', y='Rating', data=data)
plt.title('Rating vs. Price')
plt.show()
```



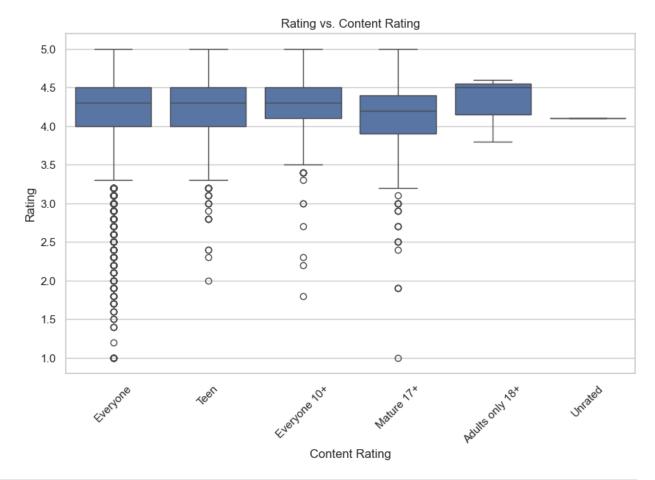
```
#8.2. Scatter plot/joinplot for Rating vs. Size:
plt.figure(figsize=(10, 6))
sns.scatterplot(x='Size', y='Rating', data=data)
plt.title('Rating vs. Size')
plt.show()
```



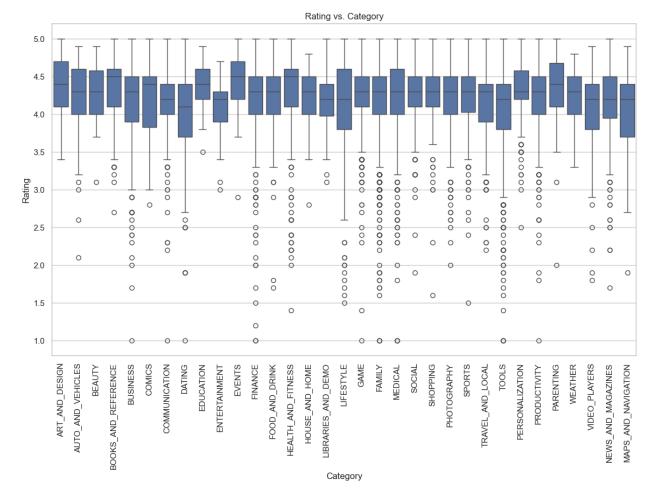
```
#8.3. Scatter plot/joinplot for Rating vs. Reviews:
plt.figure(figsize=(10, 6))
sns.scatterplot(x='Reviews', y='Rating', data=data)
plt.title('Rating vs. Reviews')
plt.show()
```



```
#8.4. Boxplot for Rating vs. Content Rating:
plt.figure(figsize=(10, 6))
sns.boxplot(x='Content Rating', y='Rating', data=data)
plt.title('Rating vs. Content Rating')
plt.xticks(rotation=45)
plt.show()
```



```
#8.5. Boxplot for Ratings vs. Category:
plt.figure(figsize=(14, 8))
sns.boxplot(x='Category', y='Rating', data=data)
plt.title('Rating vs. Category')
plt.xticks(rotation=90)
plt.show()
```



```
# Create a copy of the dataframe
inp1 = data.copy()
import numpy as np
# 9.1. Apply log transformation to Reviews and Installs
inp1['Reviews'] = np.log1p(inp1['Reviews'])
inp1['Installs'] = np.log1p(inp1['Installs'])
# 9.2. Drop unnecessary columns
columns_to_drop = ['App', 'Last Updated', 'Current Ver', 'Android
Ver']
inp1 = inp1.drop(columns=columns to drop)
# 9.3. Get dummy columns for Category, Genres, and Content Rating
inp2 = pd.get_dummies(inp1, columns=['Category', 'Genres', 'Content
Rating'])
# Display the first few rows of inp2
inp2.head()
                         Size
   Rating
             Reviews
                                Installs
                                          Type
                                                 Price \
0
      4.1
            5.075174
                     19000.0
                                9.210440 Free
                                                  0.0
```

```
1
      3.9
            6.875232 14000.0
                                13.122365
                                           Free
                                                   0.0
2
      4.7 11.379520
                      8700.0
                               15.424949 Free
                                                   0.0
3
      4.5
           12.281389
                      25000.0
                                17.727534 Free
                                                   0.0
      4.3
            6.875232
                       2800.0 11.512935 Free
                                                   0.0
   Category ART AND DESIGN Category_AUTO_AND_VEHICLES
Category_BEAUTY \
                                                  False
                      True
False
                      True
                                                  False
1
False
                      True
                                                  False
False
                      True
                                                  False
False
                      True
                                                  False
False
   Category BOOKS AND REFERENCE
0
                          False
1
                           False
2
                           False
                                  . . .
3
                           False
4
                          False ...
   Genres_Video Players & Editors;Creativity \
0
                                        False
1
                                        False
2
                                        False
3
                                        False
4
                                        False
   Genres_Video Players & Editors; Music & Video Genres_Weather
Genres Word \
0
                                           False
                                                            False
False
                                           False
                                                            False
1
False
                                           False
                                                            False
False
                                           False
                                                            False
False
4
                                           False
                                                            False
False
   Content Rating Adults only 18+ Content Rating Everyone \
0
                             False
                                                       True
1
                             False
                                                       True
2
                             False
                                                       True
3
                             False
                                                       False
```

```
4
                            False
                                                     True
   Content Rating Everyone 10+ Content Rating Mature 17+ \
0
                         False
                                                    False
1
                         False
                                                    False
2
                         False
                                                    False
3
                         False
                                                    False
4
                         False
                                                    False
   Content Rating Teen
                        Content Rating Unrated
0
                 False
                                         False
                 False
                                         False
1
2
                 False
                                         False
3
                 True
                                         False
4
                 False
                                         False
[5 rows x 160 columns]
from sklearn.model_selection import train_test_split
# Define the features (X) and target variable (y)
X = inp2.drop(columns=['Rating'])
y = inp2['Rating']
# Split the data into training (70%) and testing (30%) sets
df_train, df_test, y_train, y_test = train_test_split(X, y,
test size=0.3, random state=42)
# Check the shape of the resulting dataframes
print("Shape of df_train:", df_train.shape)
print("Shape of df test:", df test.shape)
Shape of df_train: (6205, 159)
Shape of df test: (2660, 159)
inpl.head()
         Category Rating
                            Reviews
                                        Size
                                               Installs Type Price
  ART AND DESIGN
                     4.1
                                                                  0.0
                            5.075174 19000.0
                                                9.210440
                                                         Free
1 ART AND DESIGN
                     3.9
                            6.875232 14000.0 13.122365
                                                         Free
                                                                  0.0
                                                         Free
2 ART AND DESIGN
                     4.7 11.379520 8700.0 15.424949
                                                                  0.0
3 ART AND DESIGN
                     4.5
                          12.281389
                                     25000.0 17.727534
                                                                  0.0
                                                         Free
4 ART AND DESIGN
                     4.3 6.875232
                                      2800.0 11.512935
                                                                  0.0
                                                         Free
  Content Rating
                                    Genres
```

```
0
                               Art & Design
        Everyone
        Everyone Art & Design; Pretend Play
1
2
        Everyone
                               Art & Design
3
                               Art & Design
            Teen
4
        Everyone
                    Art & Design;Creativity
inp2.head()
   Rating
             Reviews
                         Size
                                Installs Type
                                                Price \
0
      4.1
            5.075174 19000.0
                                9.210440 Free
                                                  0.0
                      14000.0
1
      3.9
            6.875232
                               13.122365 Free
                                                   0.0
2
                                                  0.0
      4.7 11.379520
                     8700.0
                               15.424949 Free
3
           12.281389
                               17.727534 Free
                                                  0.0
      4.5
                      25000.0
4
      4.3
            6.875232 2800.0
                               11.512935 Free
                                                  0.0
   Category_ART_AND_DESIGN Category_AUTO_AND_VEHICLES
Category BEAUTY \
                      True
                                                 False
False
1
                      True
                                                 False
False
                      True
                                                 False
False
                                                 False
3
                      True
False
                      True
                                                 False
4
False
   Category BOOKS AND REFERENCE
0
                          False
                                 . . .
1
                          False
2
                          False
3
                          False
4
                          False
                                 . . .
   Genres Video Players & Editors; Creativity \
0
                                       False
1
                                       False
2
                                       False
3
                                       False
4
                                       False
   Genres Video Players & Editors; Music & Video Genres Weather
Genres Word \
                                          False
                                                           False
0
False
                                          False
                                                           False
1
False
                                          False
                                                           False
2
False
```

```
3
                                             False
                                                              False
False
4
                                             False
                                                              False
False
   Content Rating Adults only 18+ Content Rating Everyone \
0
                              False
                                                          True
1
                              False
                                                          True
2
                              False
                                                          True
3
                                                         False
                              False
4
                              False
                                                          True
   Content Rating_Everyone 10+ Content Rating Mature 17+ \
0
                           False
                                                        False
1
                          False
                                                        False
2
                           False
                                                        False
3
                           False
                                                        False
4
                           False
                                                        False
   Content Rating Teen
                         Content Rating Unrated
0
                  False
                                            False
1
                  False
                                            False
2
                  False
                                            False
3
                   True
                                            False
4
                                            False
                  False
[5 rows x 160 columns]
# Assuming 'inp2' is the dataframe containing the data
X = inp2.drop(columns=['Rating']) # Features
y = inp2['Rating'] # Target variable
# Import the train_test_split function
from sklearn.model selection import train test split
# Split the data into a 70-30 train-test split
X train, X test, y train, y test = train test split(X, y,
test size=0.3, random state=42)
# Print the shapes of the resulting datasets
print("Shape of X_train:", X_train.shape)
print("Shape of y_train:", y_train.shape)
print("Shape of X_test:", X_test.shape)
print("Shape of y test:", y test.shape)
Shape of X train: (6205, 159)
Shape of y_train: (6205,)
Shape of X test: (2660, 159)
Shape of y test: (2660,)
```

```
from sklearn.linear_model import LinearRegression
from sklearn.metrics import r2_score

# 12.1 Use linear regression as the technique
# Create a Linear Regression model
lr_model = LinearRegression()

# Fit the model on the training data
lr_model.fit(X_train, y_train)

# 12.2 Report the R2 on the train set
# Predict ratings on the training data
y_train_pred = lr_model.predict(X_train)

# Calculate the R2 score on the training data
r2_train = r2_score(y_train, y_train_pred)
print(f"R2 on the train set: {r2_train}")
R2 on the train set: 0.16619066160922713
```