

```
In [2]: import numpy as np
import seaborn as sns
import pandas as pd
import matplotlib.pyplot as plt
```

```
In [3]: import datetime as dt
```

```
In [4]: df=pd.read_csv(r"C:\Users\SIYA\Downloads\argoid.csv")
```

```
In [5]: df
```

Out[5]:

	UserId	TransactionId	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
0	278166	6355745	Sat Feb 02 12:50:00 IST 2019	465549	FAMILY ALBUM WHITE PICTURE FRAME	6	11.73	United Kingdom
1	337701	6283376	Wed Dec 26 09:06:00 IST 2018	482370	LONDON BUS COFFEE MUG	3	3.52	United Kingdom
2	267099	6385599	Fri Feb 15 09:45:00 IST 2019	490728	SET 12 COLOUR PENCILS DOLLY GIRL	72	0.90	France
3	380478	6044973	Fri Jun 22 07:14:00 IST 2018	459186	UNION JACK FLAG LUGGAGE TAG	3	1.73	United Kingdom
4	-1	6143225	Mon Sep 10 11:58:00 IST 2018	1733592	WASHROOM METAL SIGN	3	3.40	United Kingdom
...
1083813	313131	6040298	Mon Jun 18 09:18:00 IST 2018	437976	DENIM PATCH PURSE PINK BUTTERFLY	30	2.28	EIRE
1083814	295743	6387117	Sat Feb 16 09:14:00 IST 2019	484113	RECYCLED ACAPULCO MAT PINK	6	11.39	United Kingdom
1083815	-1	6361817	Tue Feb 05 05:26:00 IST 2019	497595	DOILY THANK YOU CARD	15	1.15	United Kingdom
1083816	324765	5945500	Fri Mar 23 06:26:00 IST 2018	470883	REGENCY CAKESTAND 3 TIER	48	15.12	United Kingdom
1083817	351645	6118145	Tue Aug 21 08:21:00 IST 2018	471849	HEART OF WICKER SMALL	9	2.28	United Kingdom

1083818 rows × 8 columns

```
In [6]: df.head()
```

Out[6]:

	UserId	TransactionId	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
0	278166	6355745	Sat Feb 02 12:50:00 IST 2019	465549	FAMILY ALBUM WHITE PICTURE FRAME	6	11.73	United Kingdom
1	337701	6283376	Wed Dec 26 09:06:00 IST 2018	482370	LONDON BUS COFFEE MUG	3	3.52	United Kingdom
2	267099	6385599	Fri Feb 15 09:45:00 IST 2019	490728	SET 12 COLOUR PENCILS DOLLY GIRL	72	0.90	France
3	380478	6044973	Fri Jun 22 07:14:00 IST 2018	459186	UNION JACK FLAG LUGGAGE TAG	3	1.73	United Kingdom
4	-1	6143225	Mon Sep 10 11:58:00 IST 2018	1733592	WASHROOM METAL SIGN	3	3.40	United Kingdom

```
In [7]: df.shape
```

Out[7]: (1083818, 8)

```
In [8]: df['TransactionId'].value_counts()
```

Out[8]:

63094352228
63934091498
63964121462
63880191442
61432251410
...
60448522
61185522
60060442
61058252
60607802
Name: TransactionId, Length: 25900, dtype: int64

```
In [9]: df['UserId'].value_counts()
```

```
Out[9]: -1      270160
        374661      15966
        313131      11806
        296016      10256
        267708       9284
        ...
        348159         2
        322749         2
        275835         2
        356013         2
        364287         2
Name: UserId, Length: 4373, dtype: int64
```

```
In [10]: trans_1=df.loc[df['TransactionId']==6143225]
```

```
In [11]: print(trans_1)
```

	UserId	TransactionId	TransactionTime				ItemCode	\
4	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	1733592	
7	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	447867	
505	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	472542	
1018	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	460614	
3822	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	475923	
...	
1080509	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	435267	
1080852	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	468069	
1083197	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	456729	
1083278	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	476637	
1083454	-1	6143225	Mon	Sep	10	11:58:00 IST 2018	445137	
	ItemDescription		NumberOfItemsPurchased				\	
4	WASHROOM METAL SIGN		3					
7	SKULLS WRITING SET		120					
505	PICNIC BASKET WICKER SMALL		3					
1018	SKULL SHOULDER BAG		129					
3822	JUMBO BAG DOLLY GIRL DESIGN		60					
...					
1080509	LUNCH BAG BLACK SKULL.		6					
1080852	HANGING METAL CHICKEN DECORATION		6					
1083197	LARGE RED RETROSPOT WINDMILL		6					
1083278	GREEN REGENCY TEACUP AND SAUCER		18					
1083454	MULTICOLOUR CONFETTI IN TUBE		30					
	CostPerItem	Country						
4	3.40	United Kingdom						
7	1.15	United Kingdom						
505	14.90	United Kingdom						
1018	2.25	United Kingdom						
3822	3.40	United Kingdom						
...						
1080509	5.70	United Kingdom						
1080852	1.73	United Kingdom						
1083197	5.70	United Kingdom						
1083278	8.00	United Kingdom						
1083454	1.15	United Kingdom						

[1410 rows x 8 columns]

```
In [12]: user_1= df.loc[df['UserId']==-1]
```

```
In [13]: print(user_1)
```

	UserId	TransactionId	TransactionTime				ItemCode	\
4	-1	6143225	Mon Sep 10	11:58:00	IST	2018	1733592	
7	-1	6143225	Mon Sep 10	11:58:00	IST	2018	447867	
13	-1	6058140	Mon Jul 02	07:33:00	IST	2018	435225	
17	-1	6288843	Sun Dec 30	12:58:00	IST	2018	489594	
23	-1	6388019	Sat Feb 16	13:24:00	IST	2019	490329	
...	
1083798	-1	6079524	Sun Jul 22	11:09:00	IST	2018	1787772	
1083801	-1	6212338	Sun Nov 11	06:39:00	IST	2018	446166	
1083804	-1	6272057	Wed Dec 19	11:09:00	IST	2018	458031	
1083810	-1	6106650	Sun Aug 12	11:53:00	IST	2018	446040	
1083815	-1	6361817	Tue Feb 05	05:26:00	IST	2019	497595	
	ItemDescription		NumberOfItemsPurchased				CostPerItem	\
4	WASHROOM METAL SIGN		3				3.40	
7	SKULLS WRITING SET		120				1.15	
13	LUNCH BAG RED RETROSPOT		60				6.85	
17	VINTAGE CHRISTMAS TABLECLOTH		3				34.45	
23	ROLL WRAP VINTAGE CHRISTMAS		30				3.40	
...	
1083798	CHARLIE + LOLA BISCUITS TINS		3				11.45	
1083801	RED RETROSPOT BIG BOWL		3				5.70	
1083804	HANGING HEART WITH BELL		24				1.15	
1083810	BLUE POLKADOT CUP		6				2.25	
1083815	DOILY THANK YOU CARD		15				1.15	
	Country							
4	United Kingdom							
7	United Kingdom							
13	United Kingdom							
17	United Kingdom							
23	United Kingdom							
...	...							
1083798	United Kingdom							
1083801	United Kingdom							
1083804	United Kingdom							
1083810	United Kingdom							
1083815	United Kingdom							
[270160 rows x 8 columns]								

```
In [14]: user_1
```

Out[14]:

	UserId	TransactionId	TransactionTime				ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
4	-1	6143225	Mon Sep 10	11:58:00	IST	2018	1733592	WASHROOM METAL SIGN	3	3.40	United Kingdom
7	-1	6143225	Mon Sep 10	11:58:00	IST	2018	447867	SKULLS WRITING SET	120	1.15	United Kingdom
13	-1	6058140	Mon Jul 02	07:33:00	IST	2018	435225	LUNCH BAG RED RETROSPOT	60	6.85	United Kingdom
17	-1	6288843	Sun Dec 30	12:58:00	IST	2018	489594	VINTAGE CHRISTMAS TABLECLOTH	3	34.45	United Kingdom
23	-1	6388019	Sat Feb 16	13:24:00	IST	2019	490329	ROLL WRAP VINTAGE CHRISTMAS	30	3.40	United Kingdom
...
1083798	-1	6079524	Sun Jul 22	11:09:00	IST	2018	1787772	CHARLIE + LOLA BISCUITS TINS	3	11.45	United Kingdom
1083801	-1	6212338	Sun Nov 11	06:39:00	IST	2018	446166	RED RETROSPOT BIG BOWL	3	5.70	United Kingdom
1083804	-1	6272057	Wed Dec 19	11:09:00	IST	2018	458031	HANGING HEART WITH BELL	24	1.15	United Kingdom
1083810	-1	6106650	Sun Aug 12	11:53:00	IST	2018	446040	BLUE POLKADOT CUP	6	2.25	United Kingdom
1083815	-1	6361817	Tue Feb 05	05:26:00	IST	2019	497595	DOILY THANK YOU CARD	15	1.15	United Kingdom
270160 rows × 8 columns											

```
In [15]: tran=df.TransactionId.unique()
```

```
In [16]: tran.shape
```

(25900,)

```
In [17]: df1=df.set_index(['UserId', 'TransactionId'])
```

In [18]:

df1

Out[18]:

		TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
Userld	Transactionld						
278166	6355745	Sat Feb 02 12:50:00 IST 2019	465549	FAMILY ALBUM WHITE PICTURE FRAME	6	11.73	United Kingdom
337701	6283376	Wed Dec 26 09:06:00 IST 2018	482370	LONDON BUS COFFEE MUG	3	3.52	United Kingdom
267099	6385599	Fri Feb 15 09:45:00 IST 2019	490728	SET 12 COLOUR PENCILS DOLLY GIRL	72	0.90	France
380478	6044973	Fri Jun 22 07:14:00 IST 2018	459186	UNION JACK FLAG LUGGAGE TAG	3	1.73	United Kingdom
-1	6143225	Mon Sep 10 11:58:00 IST 2018	1733592	WASHROOM METAL SIGN	3	3.40	United Kingdom
...
313131	6040298	Mon Jun 18 09:18:00 IST 2018	437976	DENIM PATCH PURSE PINK BUTTERFLY	30	2.28	EIRE
295743	6387117	Sat Feb 16 09:14:00 IST 2019	484113	RECYCLED ACAPULCO MAT PINK	6	11.39	United Kingdom
-1	6361817	Tue Feb 05 05:26:00 IST 2019	497595	DOILY THANK YOU CARD	15	1.15	United Kingdom
324765	5945500	Fri Mar 23 06:26:00 IST 2018	470883	REGENCY CAKESTAND 3 TIER	48	15.12	United Kingdom
351645	6118145	Tue Aug 21 08:21:00 IST 2018	471849	HEART OF WICKER SMALL	9	2.28	United Kingdom

1083818 rows × 6 columns

In [19]:

df1.index

Out[19]:

MultiIndex([(278166, 6355745),
 (337701, 6283376),
 (267099, 6385599),
 (380478, 6044973),
 (-1, 6143225),
 (285957, 6307136),
 (345954, 6162981),
 (-1, 6143225),
 (339822, 6255403),
 (328440, 6387425),
 ...
 (355488, 6160286),
 (321531, 6037493),
 (-1, 6106650),
 (352191, 5973242),
 (261681, 6153092),
 (313131, 6040298),
 (295743, 6387117),
 (-1, 6361817),
 (324765, 5945500),
 (351645, 6118145)],
 names=['UserId', 'TransactionId'], length=1083818)

In [20]:

df2=pd.pivot_table(df, index=['TransactionId','UserId'], aggfunc='count')

In [21]:

df2

Out[21]:

		CostPerItem	Country	ItemCode	ItemDescription	NumberOfItemsPurchased	TransactionTime
TransactionId	UserId						
5900015	374850	14	14	14	14	14	14
5900026	374850	4	4	4	4	4	4
5900037	273987	24	24	24	24	24	24
5900048	273987	8	8	8	8	8	8
5900059	273987	2	2	2	2	2	2
...
6397413	289317	4	4	4	4	4	4
6397424	289317	4	4	4	4	4	4
6397435	331884	42	42	42	42	42	42
6397446	275373	8	8	8	8	8	8
6397457	266280	30	30	30	30	30	30

25900 rows × 6 columns

In [22]:

df.UserId.unique().shape

Out[22]:

(4373,)

In [23]:

gk = df.groupby('TransactionId')

In [24]:

gk.first()

Out[24]:

	UserId	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
TransactionId							
5900015	374850	Mon Feb 12 04:26:00 IST 2018	477792	SET 7 BABUSHKA NESTING BOXES	6	10.56	United Kingdom
5900026	374850	Mon Feb 12 04:28:00 IST 2018	475272	HAND WARMER RED POLKA DOT	18	2.56	United Kingdom
5900037	273987	Mon Feb 12 04:34:00 IST 2018	1011927	DOORMAT NEW ENGLAND	12	10.98	United Kingdom
5900048	273987	Mon Feb 12 04:34:00 IST 2018	481194	BLUE COAT RACK PARIS FASHION	9	6.84	United Kingdom
5900059	273987	Mon Feb 12 04:35:00 IST 2018	456876	BATH BUILDING BLOCK WORD	9	8.22	United Kingdom
...
6397413	289317	Wed Feb 20 08:23:00 IST 2019	1785798	6 CHOCOLATE LOVE HEART T-LIGHTS	108	2.56	United Kingdom
6397424	289317	Wed Feb 20 08:25:00 IST 2019	437472	RED FLOCK LOVE HEART PHOTO FRAME	216	1.00	United Kingdom
6397435	331884	Wed Feb 20 08:31:00 IST 2019	470358	MAGNETS PACK OF 4 SWALLOWS	36	0.54	United Kingdom
6397446	275373	Wed Feb 20 08:49:00 IST 2019	463281	LARGE CAKE STAND HANGING STRAWBERY	24	4.08	United Kingdom
6397457	266280	Wed Feb 20 08:50:00 IST 2019	474873	PACK OF 20 SPACEBOY NAPKINS	36	1.18	France

25900 rows × 7 columns

In [25]:

gk.get_group(6143225)

Out[25]:

	Userld	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country	
	4	-1	Mon Sep 10 11:58:00 IST 2018	1733592	WASHROOM METAL SIGN	3	3.40	United Kingdom
	7	-1	Mon Sep 10 11:58:00 IST 2018	447867	SKULLS WRITING SET	120	1.15	United Kingdom
	505	-1	Mon Sep 10 11:58:00 IST 2018	472542	PICNIC BASKET WICKER SMALL	3	14.90	United Kingdom
	1018	-1	Mon Sep 10 11:58:00 IST 2018	460614	SKULL SHOULDER BAG	129	2.25	United Kingdom
	3822	-1	Mon Sep 10 11:58:00 IST 2018	475923	JUMBO BAG DOLLY GIRL DESIGN	60	3.40	United Kingdom
	
	1080509	-1	Mon Sep 10 11:58:00 IST 2018	435267	LUNCH BAG BLACK SKULL.	6	5.70	United Kingdom
	1080852	-1	Mon Sep 10 11:58:00 IST 2018	468069	HANGING METAL CHICKEN DECORATION	6	1.73	United Kingdom
	1083197	-1	Mon Sep 10 11:58:00 IST 2018	456729	LARGE RED RETROSPOT WINDMILL	6	5.70	United Kingdom
	1083278	-1	Mon Sep 10 11:58:00 IST 2018	476637	GREEN REGENCY TEACUP AND SAUCER	18	8.00	United Kingdom
	1083454	-1	Mon Sep 10 11:58:00 IST 2018	445137	MULTICOLOUR CONFETTI IN TUBE	30	1.15	United Kingdom

1410 rows × 7 columns

In [26]:

df.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1083818 entries, 0 to 1083817
Data columns (total 8 columns):
#   Column                Non-Null Count  Dtype
---  -
0   UserId                1083818 non-null  int64
1   TransactionId         1083818 non-null  int64
2   TransactionTime       1083818 non-null  object
3   ItemCode              1083818 non-null  int64
4   ItemDescription       1080910 non-null  object
5   NumberOfItemsPurchased 1083818 non-null  int64
6   CostPerItem           1083818 non-null  float64
7   Country               1083818 non-null  object
dtypes: float64(1), int64(4), object(3)
memory usage: 66.2+ MB
```

In [27]:

df.info()

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1083818 entries, 0 to 1083817
Data columns (total 8 columns):
#   Column                Non-Null Count  Dtype
---  -
0   UserId                1083818 non-null  int64
1   TransactionId         1083818 non-null  int64
2   TransactionTime       1083818 non-null  object
3   ItemCode              1083818 non-null  int64
4   ItemDescription       1080910 non-null  object
5   NumberOfItemsPurchased 1083818 non-null  int64
6   CostPerItem           1083818 non-null  float64
7   Country               1083818 non-null  object
dtypes: float64(1), int64(4), object(3)
memory usage: 66.2+ MB
```

In [28]:

df.describe()

Out[28]:

	Userld	Transactionld	ItemCode	NumberOfItemsPurchased	CostPerItem
count	1.083818e+06	1.083818e+06	1.083818e+06	1.083818e+06	1.083818e+06
mean	2.410162e+05	6.159417e+06	6.582687e+05	2.865675e+01	9.498798e+00
std	1.423364e+05	1.476341e+05	4.526314e+05	6.542432e+02	2.308139e+03
min	-1.000000e+00	5.900015e+06	-1.000000e+00	-2.429850e+05	-1.526564e+04
25%	2.593920e+05	6.026856e+06	4.609080e+05	3.000000e+00	1.730000e+00
50%	3.020220e+05	6.166611e+06	4.752930e+05	9.000000e+00	2.880000e+00
75%	3.413550e+05	6.289569e+06	4.889430e+05	3.000000e+01	5.700000e+00
max	3.840270e+05	6.397457e+06	1.894494e+06	2.429850e+05	1.696285e+06

In [29]:

df.describe(include=np.object)

Out[29]:

	TransactionTime	ItemDescription	Country
count	1083818	1080910	1083818
unique	23260	4223	38
top	Sat Jan 12 10:41:00 IST 2019	WHITE HANGING HEART T-LIGHT HOLDER	United Kingdom
freq	2228	4738	990956

In [30]:

trans_id=df[df['UserId']==-1]['TransactionId']

In [31]:

trans_id

Out[31]:

4 6143225
7 6143225
13 6058140
17 6288843
23 6388019

...
1083798 6079524
1083801 6212338
1083804 6272057
1083810 6106650
1083815 6361817
Name: TransactionId, Length: 270160, dtype: int64

In [32]:

trans_id=df[df['UserId']==-1]['TransactionId'].unique()

In [33]:

trans_id.shape

Out[33]:

(3710,)

In [34]:

count=11
for i in trans_id:
 df.loc[df.TransactionId==i,'UserId']=count
 count+=1

In [35]:

df

Out[35]:

	UserId	TransactionId	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
0	278166	6355745	Sat Feb 02 12:50:00 IST 2019	465549	FAMILY ALBUM WHITE PICTURE FRAME	6	11.73	United Kingdom
1	337701	6283376	Wed Dec 26 09:06:00 IST 2018	482370	LONDON BUS COFFEE MUG	3	3.52	United Kingdom
2	267099	6385599	Fri Feb 15 09:45:00 IST 2019	490728	SET 12 COLOUR PENCILS DOLLY GIRL	72	0.90	France
3	380478	6044973	Fri Jun 22 07:14:00 IST 2018	459186	UNION JACK FLAG LUGGAGE TAG	3	1.73	United Kingdom
4	11	6143225	Mon Sep 10 11:58:00 IST 2018	1733592	WASHROOM METAL SIGN	3	3.40	United Kingdom
...
1083813	313131	6040298	Mon Jun 18 09:18:00 IST 2018	437976	DENIM PATCH PURSE PINK BUTTERFLY	30	2.28	EIRE
1083814	295743	6387117	Sat Feb 16 09:14:00 IST 2019	484113	RECYCLED ACAPULCO MAT PINK	6	11.39	United Kingdom
1083815	221	6361817	Tue Feb 05 05:26:00 IST 2019	497595	DOILY THANK YOU CARD	15	1.15	United Kingdom
1083816	324765	5945500	Fri Mar 23 06:26:00 IST 2018	470883	REGENCY CAKESTAND 3 TIER	48	15.12	United Kingdom
1083817	351645	6118145	Tue Aug 21 08:21:00 IST 2018	471849	HEART OF WICKER SMALL	9	2.28	United Kingdom

1083818 rows × 8 columns

In [36]:

df[df['CostPerItem']==0]

Out[36]:

	Userld	Transactionld	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
148	45	6108674	Tue Aug 14 07:12:00 IST 2018	1780905	wet damaged	-288	0.0	United Kingdom
151	47	5914040	Fri Feb 18 11:31:00 IST 2028	445872	STRAWBERRY CERAMIC TRINKET BOX	3	0.0	United Kingdom
322	80	6314803	Mon Jan 14 11:15:00 IST 2019	495159	NaN	9	0.0	United Kingdom
432	102	6173783	Sun Oct 07 07:52:00 IST 2018	1428	ebay	-30	0.0	United Kingdom
668	144	6268713	Tue Dec 18 11:16:00 IST 2018	1890294	check	-36	0.0	United Kingdom
...
1082487	2909	6349893	Wed Jan 30 08:31:00 IST 2019	997563	found	198	0.0	United Kingdom
1083038	3621	6123590	Sun Aug 26 06:37:00 IST 2018	483105	printing smudges/thrown away	-28800	0.0	United Kingdom
1083099	2812	6357483	Sun Feb 03 08:09:00 IST 2019	490308	check	15	0.0	United Kingdom
1083738	1790	6332865	Tue Jan 22 13:58:00 IST 2019	1528842	check	-108	0.0	United Kingdom
1083739	3672	6167942	Mon Oct 01 09:37:00 IST 2018	337029	NaN	-93	0.0	United Kingdom

5030 rows × 8 columns

In [37]:

df[df['NumberOfItemsPurchased']<0]

Out[37]:

	Userld	Transactionld	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
69	300909	6015757	Tue May 29 14:14:00 IST 2018	466452	FOUR HOOK WHITE LOVEBIRDS	-3	2.90	United Kingdom
135	319683	6036228	Sat Jun 16 08:28:00 IST 2018	470883	REGENCY CAKESTAND 3 TIER	-24	17.60	United Kingdom
148	45	6108674	Tue Aug 14 07:12:00 IST 2018	1780905	wet damaged	-288	0.00	United Kingdom
329	321531	5925150	Sat Feb 24 11:05:00 IST 2018	446418	VICTORIAN SEWING BOX LARGE	-3	15.12	United Kingdom
330	260715	6165940	Sun Sep 30 08:26:00 IST 2018	488061	TREASURE TIN GYMKHANA DESIGN	-3	2.88	Australia
...
1083663	331485	6108982	Tue Aug 14 10:15:00 IST 2018	486255	KNICKERBOCKERGLORY MAGNET ASSORTED	-3	1.15	United Kingdom
1083719	315693	6146283	Fri Sep 14 07:54:00 IST 2018	448644	PEACE SMALL WOOD LETTERS	-3	9.32	United Kingdom
1083738	1790	6332865	Tue Jan 22 13:58:00 IST 2019	1528842	check	-108	0.00	United Kingdom
1083739	3672	6167942	Mon Oct 01 09:37:00 IST 2018	337029	NaN	-93	0.00	United Kingdom
1083743	309960	5988543	Wed May 02 10:36:00 IST 2018	469644	GLASS JAR DIGESTIVE BISCUITS	-18	4.08	United Kingdom

21248 rows × 8 columns

In [38]:

df[df['ItemCode']<0]

Out[38]:

	UserId	TransactionId	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
154	266301	5970085	Sat Apr 14 11:36:00 IST 2018	-1	POSTAGE	9	24.84	France
251	266028	5969843	Sat Apr 14 09:27:00 IST 2018	-1	POSTAGE	21	24.84	Germany
993	287574	6190756	Sun Oct 21 10:27:00 IST 2018	-1	Discount	-3	88.32	United Kingdom
1261	264243	6153851	Wed Sep 19 08:22:00 IST 2018	-1	POSTAGE	6	24.84	France
1293	243	6026130	Wed Jun 06 11:50:00 IST 2018	-1	DOTCOM POSTAGE	3	304.58	United Kingdom
...
1083208	765	6079282	Sun Jul 22 11:04:00 IST 2018	-1	DOTCOM POSTAGE	3	223.40	United Kingdom
1083250	138	6084782	Wed Jul 25 11:53:00 IST 2018	-1	DOTCOM POSTAGE	3	210.03	United Kingdom
1083503	3245	6167238	Mon Oct 01 07:42:00 IST 2018	-1	Manual	3	622.96	United Kingdom
1083581	260715	6035271	Wed Jun 13 10:28:00 IST 2018	-1	POSTAGE	3	483.00	Australia
1083780	259392	5998652	Sun May 13 11:52:00 IST 2018	-1	Manual	3	386.47	Norway

5592 rows × 8 columns

In [39]:

item=df[df['ItemCode']==-1]['ItemDescription'].unique()

In [40]:

item

Out[40]:

array(['POSTAGE', 'Discount', 'DOTCOM POSTAGE', 'AMAZON FEE', 'Manual', 'SAMPLES', 'GIRLS PARTY BAG', 'Bank Charges', 'BOYS PARTY BAG', 'Adjust bad debt', 'CRUK Commission', 'PADS TO MATCH ALL CUSHIONS', nan], dtype=object)

In [41]:

item1=df[df['ItemDescription']=='POSTAGE']['ItemCode']

In [42]:

item1

Out[42]:

154 -1
251 -1
1261 -1
1773 -1
2700 -1
..
1081642 -1
1081982 -1
1082314 -1
1083108 -1
1083581 -1
Name: ItemCode, Length: 2504, dtype: int64

In [43]:

count=10000000
for i in item:
 df.loc[df.ItemDescription==i,'ItemCode']=count
 count+=1

In [44]:

df.dropna(subset = ["ItemDescription"], inplace=True)

In [45]:

nan_value = float("NaN")

df.replace(-15265.64, nan_value, inplace=True)

df.dropna(subset = ["CostPerItem"], inplace=True)

In [46]:

df.describe()

Out[46]:

	UserId	TransactionId	ItemCode	NumberOfItemsPurchased	CostPerItem
count	1.080906e+06	1.080906e+06	1.080906e+06	1.080906e+06	1.080906e+06
mean	2.417558e+05	6.159571e+06	7.091274e+05	2.880948e+01	9.580880e+00
std	1.418230e+05	1.476643e+05	8.060646e+05	6.540237e+02	2.311059e+03
min	1.100000e+01	5.900015e+06	4.200000e+01	-2.429850e+05	0.000000e+00
25%	2.597070e+05	6.026878e+06	4.615170e+05	3.000000e+00	1.730000e+00
50%	3.021900e+05	6.167150e+06	4.755870e+05	9.000000e+00	2.880000e+00
75%	3.414810e+05	6.290064e+06	4.891530e+05	3.000000e+01	5.700000e+00
max	3.840270e+05	6.397457e+06	1.000001e+07	2.429850e+05	1.696285e+06

In [47]:

nan_value = float("NaN")

df.replace(0, nan_value, inplace=True)

df.dropna(subset = ["CostPerItem"], inplace=True)

In [48]:

df

Out[48]:

	UserId	TransactionId	TransactionTime	ItemCode	ItemDescription	NumberOfItemsPurchased	CostPerItem	Country
0	278166	6355745	Sat Feb 02 12:50:00 IST 2019	465549	FAMILY ALBUM WHITE PICTURE FRAME	6	11.73	United Kingdom
1	337701	6283376	Wed Dec 26 09:06:00 IST 2018	482370	LONDON BUS COFFEE MUG	3	3.52	United Kingdom
2	267099	6385599	Fri Feb 15 09:45:00 IST 2019	490728	SET 12 COLOUR PENCILS DOLLY GIRL	72	0.90	France
3	380478	6044973	Fri Jun 22 07:14:00 IST 2018	459186	UNION JACK FLAG LUGGAGE TAG	3	1.73	United Kingdom
4	11	6143225	Mon Sep 10 11:58:00 IST 2018	1733592	WASHROOM METAL SIGN	3	3.40	United Kingdom
...
1083813	313131	6040298	Mon Jun 18 09:18:00 IST 2018	437976	DENIM PATCH PURSE PINK BUTTERFLY	30	2.28	EIRE
1083814	295743	6387117	Sat Feb 16 09:14:00 IST 2019	484113	RECYCLED ACAPULCO MAT PINK	6	11.39	United Kingdom
1083815	221	6361817	Tue Feb 05 05:26:00 IST 2019	497595	DOILY THANK YOU CARD	15	1.15	United Kingdom
1083816	324765	5945500	Fri Mar 23 06:26:00 IST 2018	470883	REGENCY CAKESTAND 3 TIER	48	15.12	United Kingdom
1083817	351645	6118145	Tue Aug 21 08:21:00 IST 2018	471849	HEART OF WICKER SMALL	9	2.28	United Kingdom

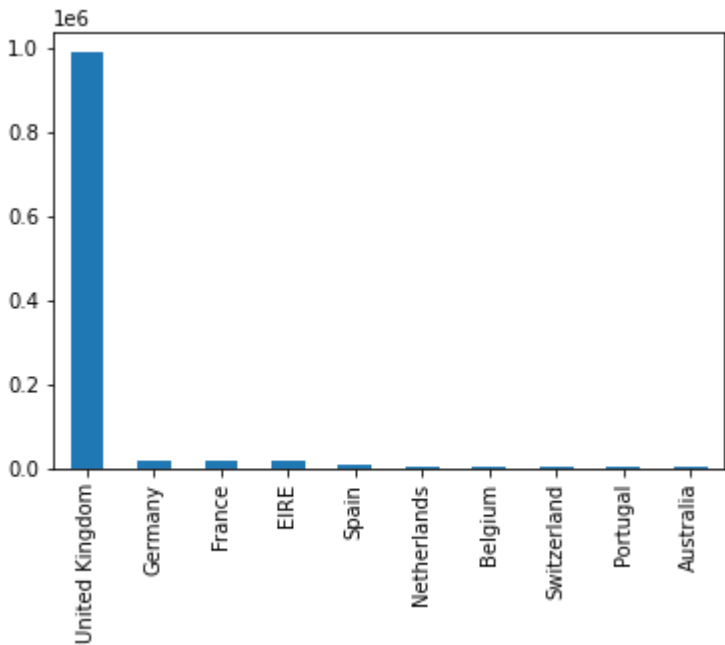
1078784 rows × 8 columns

```
In [49]: df['Country'].value_counts()
```

```
Out[49]: United Kingdom      985958
Germany      18986
France      17112
EIRE      16384
Spain      5064
Netherlands      4734
Belgium      4138
Switzerland      4002
Portugal      3038
Australia      2512
Norway      2170
Italy      1606
Channel Islands      1516
Finland      1390
Cyprus      1244
Sweden      924
Unspecified      892
Austria      802
Denmark      778
Japan      716
Poland      682
Israel      594
USA      582
Hong Kong      576
Singapore      458
Iceland      364
Canada      302
Greece      292
Malta      254
United Arab Emirates      136
European Community      122
RSA      114
Lebanon      90
Lithuania      70
Brazil      64
Czech Republic      60
Bahrain      38
Saudi Arabia      20
Name: Country, dtype: int64
```

```
In [50]: df.Country.value_counts()[:10].plot(kind='bar')
```

```
Out[50]: <matplotlib.axes._subplots.AxesSubplot at 0x2a043941940>
```



```
In [51]: uk_data=df[df.Country=='United Kingdom']
```

```
In [52]: uk_data.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 985958 entries, 0 to 1083817
Data columns (total 8 columns):
#   Column                Non-Null Count  Dtype
---  -
0   UserId                985958 non-null int64
1   TransactionId         985958 non-null int64
2   TransactionTime       985958 non-null object
3   ItemCode              985958 non-null int64
4   ItemDescription       985958 non-null object
5   NumberOfItemsPurchased 985958 non-null int64
6   CostPerItem           985958 non-null float64
7   Country               985958 non-null object
dtypes: float64(1), int64(4), object(3)
memory usage: 67.7+ MB
```

In [53]:

uk_data.describe()

Out[53]:

	UserId	TransactionId	ItemCode	NumberOfItemsPurchased	CostPerItem
count	985958.000000	9.859580e+05	9.859580e+05	985958.000000	9.859580e+05
mean	239753.113719	6.159355e+06	6.970262e+05	26.772075	9.794548e+00
std	146942.415142	1.485303e+05	6.965321e+05	674.510526	2.419630e+03
min	11.000000	5.900015e+06	4.200000e+01	-242985.000000	1.000000e-02
25%	829.000000	6.026460e+06	4.615170e+05	3.000000	1.730000e+00
50%	305361.000000	6.166105e+06	4.756710e+05	9.000000	2.900000e+00
75%	345660.000000	6.292308e+06	4.892580e+05	30.000000	5.700000e+00
max	384027.000000	6.397446e+06	1.000001e+07	242985.000000	1.696285e+06

In [54]:

uk_data = uk_data[(uk_data['NumberOfItemsPurchased']>0)]
uk_data.info()

```
<class 'pandas.core.frame.DataFrame'>  
Int64Index: 970246 entries, 0 to 1083817  
Data columns (total 8 columns):  
#   Column                                Non-Null Count  Dtype  
---  -----  
0   UserId                                970246 non-null int64  
1   TransactionId                         970246 non-null int64  
2   TransactionTime                       970246 non-null object  
3   ItemCode                             970246 non-null int64  
4   ItemDescription                       970246 non-null object  
5   NumberOfItemsPurchased               970246 non-null int64  
6   CostPerItem                          970246 non-null float64  
7   Country                              970246 non-null object  
dtypes: float64(1), int64(4), object(3)  
memory usage: 66.6+ MB
```

In [64]:

uk_data['TotalPrice'] = uk_data['NumberOfItemsPurchased'] * uk_data['CostPerItem']

In [56]:

uk_data=uk_data[['UserId','TransactionId','TransactionTime','NumberOfItemsPurchased','CostPerItem']]

In [57]:

uk_data['TransactionTime'].min(),uk_data['TransactionTime'].max()

Out[57]:

('Fri Apr 06 06:15:00 IST 2018', 'Wed Sep 26 13:29:00 IST 2018')

In [58]:

PRESENT = dt.datetime(2020,6,6)
uk_data['TransactionTime'] = pd.to_datetime(uk_data['TransactionTime'])

```
c:\python36\lib\site-packages\dateutil\parser\_parser.py:1218: UnknownTimezoneWarning: tzname IST identified but not understood. Pass `tzinfos` argument in order to correctly return a timezone-aware datetime. In a future version, this will raise an exception.  
category=UnknownTimezoneWarning)
```

In [65]:

uk_data.head()

Out[65]:

	UserId	TransactionId	TransactionTime	NumberOfItemsPurchased	CostPerItem	TotalPrice
0	278166	6355745	2019-02-02 12:50:00	6	11.73	70.38
1	337701	6283376	2018-12-26 09:06:00	3	3.52	10.56
3	380478	6044973	2018-06-22 07:14:00	3	1.73	5.19
4	11	6143225	2018-09-10 11:58:00	3	3.40	10.20
5	285957	6307136	2019-01-11 09:50:00	12	3.52	42.24

In [66]:

rfm= uk_data.groupby('UserId').agg({'TransactionTime': lambda date: (PRESENT - date.max()).days,
 'TransactionId': lambda num: len(num),
 'TotalPrice': lambda price: price.sum()})

In [67]:

rfm.columns

Out[67]:

Index(['TransactionTime', 'TransactionId', 'TotalPrice'], dtype='object')

In [68]:

rfm.columns=['monetary','frequency','recency']

In [69]:

rfm['recency'] = rfm['recency'].astype(int)

In [70]:

rfm.head()

Out[70]:

	monetary	frequency	recency
UserId			
11	634	1410	72177
12	704	158	24458
13	523	528	14997
14	475	1442	74758
15	572	408	12627

In [71]:

rfm['r_quartile'] = pd.qcut(rfm['recency'], 4, ['1','2','3','4'])
rfm['f_quartile'] = pd.qcut(rfm['frequency'], 4, ['4','3','2','1'])
rfm['m_quartile'] = pd.qcut(rfm['monetary'], 4, ['4','3','2','1'])

In [72]:

rfm.head()

Out[72]:

	monetary	frequency	recency	r_quartile	f_quartile	m_quartile
UserId						
11	634	1410	72177	4	1	2
12	704	158	24458	4	2	1
13	523	528	14997	4	1	3
14	475	1442	74758	4	1	4
15	572	408	12627	3	1	2

In [73]:

rfm['RFM_Score'] = rfm.r_quartile.astype(str)+ rfm.f_quartile.astype(str) + rfm.m_quartile.astype(str)
rfm.head()

Out[73]:

	monetary	frequency	recency	r_quartile	f_quartile	m_quartile	RFM_Score
UserId							
11	634	1410	72177	4	1	2	412
12	704	158	24458	4	2	1	421
13	523	528	14997	4	1	3	413
14	475	1442	74758	4	1	4	414
15	572	408	12627	3	1	2	312

In [74]:

rfm[rfm['RFM_Score']=='421'].sort_values('monetary', ascending=False).head()

Out[74]:

	monetary	frequency	recency	r_quartile	f_quartile	m_quartile	RFM_Score
UserId							
514	824	186	14382	4	2	1	421
977	800	170	15609	4	2	1	421
269	796	154	16026	4	2	1	421
581	793	182	16634	4	2	1	421
147	789	178	15055	4	2	1	421

```
In [75]: rfm['RFM_Score'].value_counts()
```

```
Out[75]: 414      468
         141      452
         142      277
         413      236
         232      228
         231      223
         324      194
         233      193
         323      190
         143      187
         322      158
         412      126
         424      117
         321      110
         411      110
         234      104
         314       99
         144       96
         221       92
         423       90
         131       87
         223       86
         311       85
         312       84
         333       83
         242       81
         313       80
         332       79
         132       78
         241       73
         222       73
         422       67
         133       62
         334       60
         224       59
         243       52
         331       31
         134       29
         244       29
         342       28
         421       25
         434       20
         124       18
         123       17
         432       15
         433       15
         344       15
         341       14
         442       13
         214       13
         343       13
         122       11
         213       10
         121       10
         444        7
         443        7
         212        6
         441        5
         431        2
         211        1
Name: RFM_Score, dtype: int64
```

```
In [76]: rfm.shape
```

```
Out[76]: (5293, 7)
```

```
In [77]: segment=rfm.RFM_Score.unique()
```

```
In [78]: segment.shape
```

```
Out[78]: (60,)
```

```
In [80]: rfm['RFM_Score'].median()
```

```
Out[80]: 244.0
```

```
In [81]: rfm['RFM_Score'].mode()
```

```
Out[81]: 0      414
dtype: object
```

```
In [83]: rfm.to_csv ('Output_Segmented.csv')
```

In []: