```
import datetime
import missingno as mn
import numpy as np
import pandas as pd
import seaborn as sns
1.1 Dataset loading and cleaning - Transaction
# reading excel file (Transaction data) and showing first 5 rows to
have a glance on data
df = pd.read excel('Data/QVI transaction data.xlsx')
df.head()
    DATE
          STORE NBR
                     LYLTY CARD NBR TXN ID
                                             PROD NBR
  43390
                               1000
                                          1
                                                    5
                  1
1 43599
                               1307
                                        348
                  1
                                                   66
2 43605
                  1
                               1343
                                        383
                                                   61
3 43329
                  2
                               2373
                                        974
                                                   69
                  2
4 43330
                               2426
                                       1038
                                                  108
                                  PROD NAME
                                             PROD QTY
                                                       TOT_SALES
0
     Natural Chip
                         Compny SeaSalt175g
                                                    2
                                                             6.0
1
                                                    3
                   CCs Nacho Cheese
                                                             6.3
                                       175g
2
                                                    2
     Smiths Crinkle Cut Chips Chicken 170g
                                                             2.9
     Smiths Chip Thinly S/Cream&Onion 175g
                                                    5
3
                                                            15.0
                                                    3
  Kettle Tortilla ChpsHny&Jlpno Chili 150g
                                                            13.8
# Checking the size of the dataset
df.shape
(264836, 8)
''' checking information of the dataset that contains
the number of columns, column labels, column data types, etc. '''
df.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 264836 entries, 0 to 264835
Data columns (total 8 columns):
#
     Column
                     Non-Null Count
                                      Dtype
     -----
                     0
     DATE
                     264836 non-null int64
     STORE NBR
 1
                     264836 non-null int64
 2
     LYLTY CARD NBR 264836 non-null int64
 3
     TXN ID
                     264836 non-null int64
 4
     PROD NBR
                     264836 non-null int64
 5
     PROD NAME
                     264836 non-null
                                      object
```

importing required modules for the task1

```
PROD OTY
                      264836 non-null
6
                                       int64
     TOT SALES
                      264836 non-null float64
dtypes: float64(1), int64(6), object(1)
memory usage: 16.2+ MB
We can see that column DATE is not in right format, so calling datetime module to
change the datatype of DATE column into dates
# changing DATE column datatype to date, as it is USA date so the
format of the date should be yyyy-mm-dd
df['DATE'] =
pd.to datetime(df['DATE'],errors='coerce',unit='d',origin='1900-01-
01')
# showing first 5 rows to check the changed format of DATE column
df.head()
                          LYLTY_CARD_NBR
        DATE
              STORE NBR
                                          TXN ID
                                                   PROD NBR
0 2018-10-19
                                    1000
                       1
                                                1
1 2019-05-16
                       1
                                    1307
                                              348
                                                         66
2 2019-05-22
                       1
                                    1343
                                              383
                                                         61
                       2
3 2018-08-19
                                    2373
                                              974
                                                         69
                       2
                                             1038
4 2018-08-20
                                    2426
                                                        108
                                   PROD NAME
                                               PROD QTY
                                                         TOT SALES
0
     Natural Chip
                          Compny SeaSalt175g
                                                      2
                                                                6.0
                                                      3
1
                   CCs Nacho Cheese
                                         175g
                                                                6.3
2
                                                      2
     Smiths Crinkle Cut Chips Chicken 170g
                                                                2.9
3
                                                      5
     Smiths Chip Thinly S/Cream&Onion 175g
                                                               15.0
  Kettle Tortilla ChpsHny&Jlpno Chili 150g
                                                      3
                                                               13.8
# checking if the dataset has any missing value
df.isnull().sum()
DATE
                   0
STORE_NBR
                   0
                   0
LYLTY CARD NBR
TXN ID
                   0
PROD NBR
                   0
PROD NAME
                   0
PROD QTY
                   0
                   0
TOT SALES
dtype: int64
# checking each column unique values for any inconsistant data
df['DATE'].value counts()
```

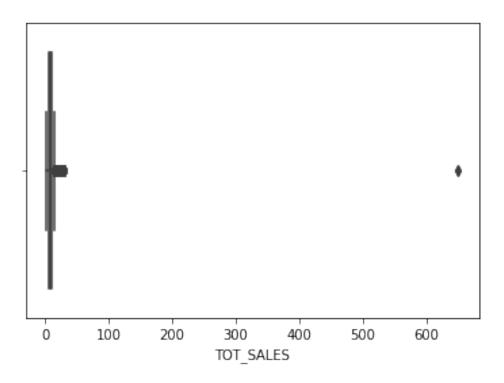
```
2018-12-26
               939
2018-12-25
               917
2018-12-24
               915
2018-12-21
               906
2018-12-20
               862
              . . .
2018-12-14
               664
2019-06-26
               662
2019-06-15
               659
2018-10-20
               658
2018-11-27
               648
Name: DATE, Length: 364, dtype: int64
df['STORE_NBR'].value_counts()
226
       2022
88
       1873
93
       1832
       1819
165
237
       1785
           2
11
31
           2
          2
206
76
           1
92
Name: STORE_NBR, Length: 272, dtype: int64
df['LYLTY_CARD_NBR'].value_counts()
172032
           18
162039
           18
13138
          17
           17
230078
128178
           17
20408
            1
6194
            1
14263
            1
16310
            1
2049
            1
Name: LYLTY_CARD_NBR, Length: 72637, dtype: int64
df['TXN_ID'].value_counts()
102237
           3
          3
228741
          3
108462
230356
          3
          3
222775
          . .
```

```
107422
          1
113565
          1
111516
          1
2049
Name: TXN ID, Length: 263127, dtype: int64
df['PROD NBR'].value counts()
102
       3304
108
       3296
33
       3269
112
       3268
75
       3265
11
       1431
76
       1430
98
       1419
29
       1418
72
       1410
Name: PROD NBR, Length: 114, dtype: int64
df['PROD NAME'].value counts()
Kettle Mozzarella
                     Basil & Pesto 175g
                                               3304
Kettle Tortilla ChpsHny&Jlpno Chili 150g
                                               3296
Cobs Popd Swt/Chlli &Sr/Cream Chips 110g
                                               3269
Tyrrells Crisps
                     Ched & Chives 165g
                                               3268
Cobs Popd Sea Salt Chips 110g
                                               3265
                                               . . .
RRD Pc Sea Salt
                     165a
                                               1431
Woolworths Medium
                     Salsa 300g
                                               1430
NCC Sour Cream &
                     Garden Chives 175g
                                               1419
French Fries Potato Chips 175g
                                               1418
WW Crinkle Cut
                     Original 175g
                                               1410
Name: PROD NAME, Length: 114, dtype: int64
After checking on google, Woolworths Medium Salsa is a bottled salsa, rest are just
different flavoured chips. That's why we have to remove salsa from the dataset
updated df= df[df['PROD NAME'] != 'Woolworths Medium Salsa 300g']
updated df.head()
               STORE NBR
                          LYLTY CARD NBR
                                                    PROD NBR
        DATE
                                            TXN ID
0 2018-10-19
                                     1000
                                                 1
                       1
                                                            5
                       1
1 2019-05-16
                                     1307
                                               348
                                                           66
2 2019-05-22
                       1
                                     1343
                                               383
                                                           61
                       2
3 2018-08-19
                                     2373
                                                           69
                                               974
                       2
4 2018-08-20
                                     2426
                                              1038
                                                          108
```

PROD NAME

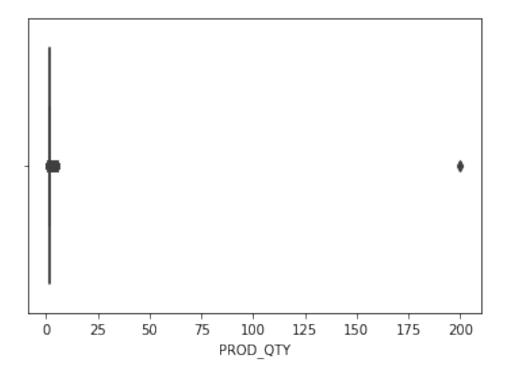
PROD_QTY TOT_SALES

```
0
     Natural Chip
                                                               6.0
                          Compny SeaSalt175g
                                                      2
                    CCs Nacho Cheese
                                                      3
1
                                        175q
                                                               6.3
                                                      2
2
     Smiths Crinkle Cut Chips Chicken 170g
                                                               2.9
     Smiths Chip Thinly S/Cream&Onion 175g
3
                                                      5
                                                              15.0
   Kettle Tortilla ChpsHny&Jlpno Chili 150g
                                                              13.8
updated_df['PROD_NAME']
0
            Natural Chip
                                 Compny SeaSalt175g
1
                           CCs Nacho Cheese
2
            Smiths Crinkle Cut Chips Chicken 170g
            Smiths Chip Thinly S/Cream&Onion 175g
3
          Kettle Tortilla ChpsHny&Jlpno Chili 150g
           Kettle Sweet Chilli And Sour Cream 175g
264831
264832
                      Tostitos Splash Of Lime 175g
264833
                           Doritos Mexicana
                                                170g
264834
           Doritos Corn Chip Mexican Jalapeno 150g
                      Tostitos Splash Of Lime 175g
264835
Name: PROD NAME, Length: 264836, dtype: object
updated df['PROD QTY'].value counts()
2
       236039
1
        27518
5
          450
3
          430
4
          397
200
            2
Name: PROD_QTY, dtype: int64
updated_df['TOT_SALES'].value_counts()
9.2
         22821
7.4
         22513
6.0
         20798
7.6
         20212
8.8
         19900
9.3
             3
             3
6.9
             2
11.2
             2
650.0
12.4
             2
Name: TOT SALES, Length: 112, dtype: int64
1.2 Checking outliers and removing them from dataset
sns.boxplot(updated df.TOT SALES)
<matplotlib.axes._subplots.AxesSubplot at 0x1d23e920a08>
```



There is an outlier stands above 600 in total sales

sns.boxplot(updated_df.PROD_QTY)
<matplotlib.axes._subplots.AxesSubplot at 0x1d23bfbf208>



There is also an outlier in product quantity that stands no. $200\,$

```
updated df[updated df['PROD QTY'] == 200]
            DATE
                   STORE NBR
                              LYLTY CARD NBR
                                                TXN ID
                                                        PROD NBR
                         226
69762 2018-08-21
                                       226000
                                                226201
69763 2019-05-22
                         226
                                       226000
                                                226210
                                                                4
                                PROD NAME
                                           PROD QTY
                                                      TOT SALES
69762
       Dorito Corn Chp
                             Supreme 380g
                                                 200
                                                           650.0
69763
       Dorito Corn Chp
                             Supreme 380g
                                                 200
                                                           650.0
we can see that product quantity and total sales outliers stands in same row, so we'll
create a new dataframe without the outliers
trans df = updated df[updated df['PROD QTY'] != 200]
trans df.head()
                          LYLTY CARD NBR
        DATE
               STORE NBR
                                           TXN ID
                                                    PROD NBR
0 2018-10-19
                                     1000
                       1
                                                 1
1 2019-05-16
                       1
                                     1307
                                               348
                                                           66
                       1
2 2019-05-22
                                     1343
                                               383
                                                           61
3 2018-08-19
                       2
                                     2373
                                               974
                                                           69
                       2
                                              1038
4 2018-08-20
                                     2426
                                                         108
                                                PROD QTY
                                                          TOT_SALES
                                    PROD NAME
0
                          Compny SeaSalt175g
                                                       2
     Natural Chip
                                                                 6.0
1
                    CCs Nacho Cheese
                                                       3
                                                                 6.3
                                         175g
                                                       2
2
     Smiths Crinkle Cut Chips Chicken 170g
                                                                 2.9
3
     Smiths Chip Thinly S/Cream&Onion 175g
                                                       5
                                                                15.0
   Kettle Tortilla ChpsHny&Jlpno Chili 150q
                                                       3
                                                                13.8
trans df['PROD QTY'].value counts()
2
     236039
1
      27518
5
        450
3
        430
4
        397
Name: PROD QTY, dtype: int64
trans df['TOT SALES'].value counts()
9.2
        22821
7.4
        22513
6.0
        20798
7.6
        20212
8.8
        19900
9.3
            3
15.5
            3
```

```
6.9
            2
11.2
12.4
Name: TOT SALES, Length: 111, dtype: int64
1.3 Adding columns
trans df['YEAR'] = pd.DatetimeIndex(trans df['DATE']).year
trans df['MONTH'] = pd.DatetimeIndex(trans df['DATE']).month
C:\ProgramData\Anaconda3\lib\site-packages\ipykernel launcher.py:1:
SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row indexer,col indexer] = value instead
See the caveats in the documentation:
https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#
returning-a-view-versus-a-copy
  """Entry point for launching an IPython kernel.
C:\ProgramData\Anaconda3\lib\site-packages\ipykernel launcher.py:2:
SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row indexer,col indexer] = value instead
See the caveats in the documentation:
https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#
returning-a-view-versus-a-copy
# Brand Column
trans df['BRAND'] = trans df['PROD NAME'].apply(lambda x :
x.strip().split()[0])
trans df['BRAND'].value counts()
C:\ProgramData\Anaconda3\lib\site-packages\ipykernel launcher.py:2:
SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row indexer,col indexer] = value instead
See the caveats in the documentation:
https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#
returning-a-view-versus-a-copy
Kettle
              41288
Smiths
              28860
Pringles
              25102
Doritos
              24962
Thins
              14075
RRD
              11894
              11057
Infuzions
WW
              10320
```

```
Cobs
                9693
Tostitos
                9471
Twisties
                9454
01d
               9324
Tyrrells
               6442
Grain
                6272
Natural
                6050
                5885
Red
Cheezels
                4603
CCs
                4551
Woolworths
               4437
                3183
Dorito
Infzns
                3144
Smith
               2963
Cheetos
               2927
               1576
Snbts
Burger
                1564
GrnWves
                1468
Sunbites
                1432
NCC
                1419
French
                1418
Name: BRAND, dtype: int64
```

we can see there is inconsistency in the brand names, for example, (Doritos and Dorito),(Infuzions and Infzns) and more

```
brands =
{'Dorito':'Doritos','Infzns':'Infuzions','Snbts':'Sunbites','Grain':'G
rain Wave',
          'Red':'RRD','Smith':'Smiths','GrnWves':'Grain
Wave','ww':'Woolworths','NCC':'Natural'}
trans df['BRAND'] = trans df['BRAND'].replace(brands)
C:\ProgramData\Anaconda3\lib\site-packages\ipykernel launcher.py:4:
SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row indexer,col indexer] = value instead
See the caveats in the documentation:
https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#
returning-a-view-versus-a-copy
  after removing the cwd from sys.path.
trans df['BRAND'].value counts()
Kettle
              41288
Smiths
              31823
Doritos
              28145
Pringles
              25102
RRD
              17779
```

```
Infuzions
              14201
Thins
              14075
WW
              10320
Cobs
               9693
Tostitos
               9471
Twisties
               9454
Old
               9324
Grain Wave
               7740
Natural
               7469
Tyrrells
               6442
Cheezels
               4603
CCs
               4551
Woolworths
               4437
Sunbites
               3008
Cheetos
               2927
Burger
               1564
French
               1418
Name: BRAND, dtype: int64
# To extract packet size
def get size(packet):
    size=[]
    for item in packet:
        if item.isdigit():
            size.append(item)
    return int("".join(size))
trans df['PACKET SIZE'] = trans df['PROD NAME'].apply(lambda a :
get size(a))
C:\ProgramData\Anaconda3\lib\site-packages\ipykernel launcher.py:1:
SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame.
Try using .loc[row indexer,col indexer] = value instead
See the caveats in the documentation:
https://pandas.pydata.org/pandas-docs/stable/user guide/indexing.html#
returning-a-view-versus-a-copy
  """Entry point for launching an IPython kernel.
trans df
                    STORE NBR LYLTY CARD NBR
                                                TXN ID
                                                        PROD NBR
             DATE
0
       2018-10-19
                            1
                                          1000
                                                     1
                                                                5
1
       2019-05-16
                            1
                                          1307
                                                   348
                                                              66
2
       2019-05-22
                            1
                                          1343
                                                   383
                                                              61
3
                            2
       2018-08-19
                                          2373
                                                   974
                                                              69
                            2
4
       2018-08-20
                                          2426
                                                  1038
                                                             108
                                                              . . .
264831 2019-03-11
                                       272319
                          272
                                                270088
                                                              89
```

264833 264834	2018 - 08 - 2018 - 11 - 2018 - 12 - 2018 - 09 -	- 08 - 29	272 272 272 272		272358 272379 272379 272380	9	270; 270; 270; 270;	187 188	74 51 42 74	
YEAR 0 2018 1 2019 2 2019 3 2018 4 2018	•	1 61 :		•		_		PROD_QTY	_	
	Natui	ral Chip		Compny		t1/	5g	2	6.	
			CCs Na	acho Che	eese	17	'5g	3	6.	3
	Smiths Crinkle Cut Chips Chicken					17	'0g	2	2.	9
	Smith	ns Chip Th	inly	S/Crean	n&Onion	17	'5g	5	15.	0
	Kettle Tortilla ChpsHny&Jlpno Chili					15	0g	3	13.	8
						•				
264831 2019 264832 2018 264833	Kettle	e Sweet Ch	illi /	And Sour	· Cream	17	'5g	2	10.	8
		Tosti	tos S _l	plash 01	f Lime	17	'5g	1	4.	4
			Dorit	os Mexic	cana	17	'0g	2	8.	8
2018 264834	Doritos Corn Chip Mexican Jalapeno					15	0g	2	7.	8
2018 264835 2018		Tosti	tos S _I	plash 01	f Lime	17	'5g	2	8.	8
0 1 2 3 4 264831 264832 264833	MONTH 10 5 5 8 3 8 11	BRAND Natural CCs Smiths Smiths Kettle Kettle Tostitos Doritos	PACKI	ET_SIZE 175 175 170 175 150 175 175						
264834 264835	12 9	Doritos Tostitos	_	150 175						

[264834 rows x 12 columns]

saving updated new transaction dataset in csv format

trans_df.to_csv('Data/QVI_transaction_data_updated.csv')

```
2.1 Loading and cleaning dataset - Purchase behaviour
df pur = pd.read csv('Data/QVI purchase behaviour.csv')
df pur.head()
   LYLTY CARD NBR
                                 LIFESTAGE PREMIUM CUSTOMER
0
             1000
                     YOUNG SINGLES/COUPLES
                                                     Premium
1
             1002
                     YOUNG SINGLES/COUPLES
                                                  Mainstream
2
             1003
                            YOUNG FAMILIES
                                                      Budget
3
             1004
                     OLDER SINGLES/COUPLES
                                                  Mainstream
4
                                                  Mainstream
             1005
                   MIDAGE SINGLES/COUPLES
df pur.isnull().sum()
LYLTY CARD NBR
                     0
LIFESTAGE
                     0
PREMIUM CUSTOMER
                     0
dtype: int64
df pur.info()
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 72637 entries, 0 to 72636
Data columns (total 3 columns):
     Column
                        Non-Null Count
                                         Dtype
- - -
 0
     LYLTY CARD NBR
                        72637 non-null
                                         int64
 1
     LIFESTAGE
                        72637 non-null
                                         object
 2
     PREMIUM CUSTOMER 72637 non-null
                                         object
dtypes: int64(1), object(2)
memory usage: 1.7+ MB
df pur['LIFESTAGE'].value counts()
RETIREES
                           14805
OLDER SINGLES/COUPLES
                           14609
YOUNG SINGLES/COUPLES
                           14441
OLDER FAMILIES
                            9780
YOUNG FAMILIES
                            9178
MIDAGE SINGLES/COUPLES
                            7275
NEW FAMILIES
                            2549
Name: LIFESTAGE, dtype: int64
df pur['PREMIUM CUSTOMER'].value counts()
Mainstream
              29245
Budget
              24470
Premium
              18922
Name: PREMIUM CUSTOMER, dtype: int64
3. Merging Datasets into one dataframe
pur trans = trans df.merge(df pur, on='LYLTY CARD NBR')
pur trans.head()
```

```
LYLTY CARD NBR
                                          TXN ID
                                                  PROD NBR
        DATE
              STORE NBR
0 2018-10-19
                      1
                                    1000
                                               1
                                                          5
1 2019-05-16
                      1
                                    1307
                                             348
                                                         66
2 2018-11-12
                      1
                                    1307
                                             346
                                                         96
                      1
                                                         54
3 2019-03-11
                                    1307
                                             347
4 2019-05-22
                      1
                                    1343
                                             383
                                                         61
                                 PROD NAME
                                            PROD QTY TOT SALES
                                                                 YEAR
MONTH \
   Natural Chip
                     Compny SeaSalt175g
                                                   2
                                                             6.0
                                                                  2018
10
                 CCs Nacho Cheese
1
                                      175g
                                                   3
                                                             6.3
                                                                  2019
5
2
           WW Original Stacked Chips 160g
                                                   2
                                                             3.8
                                                                  2018
11
3
                        CCs Original 175g
                                                                 2019
                                                   1
                                                             2.1
3
4
   Smiths Crinkle Cut Chips Chicken 170g
                                                   2
                                                             2.9
                                                                 2019
5
     BRAND
            PACKET SIZE
                                       LIFESTAGE PREMIUM CUSTOMER
                    175
                          YOUNG SINGLES/COUPLES
                                                           Premium
0
   Natural
                    175
                         MIDAGE SINGLES/COUPLES
1
       CCs
                                                            Budget
2
                         MIDAGE SINGLES/COUPLES
        WW
                    160
                                                            Budget
3
                    175
                         MIDAGE SINGLES/COUPLES
       CCs
                                                            Budget
4
    Smiths
                    170
                         MIDAGE SINGLES/COUPLES
                                                            Budget
pur trans.info()
<class 'pandas.core.frame.DataFrame'>
Int64Index: 264834 entries, 0 to 264833
Data columns (total 14 columns):
#
     Column
                       Non-Null Count
                                         Dtype
- - -
     -----
 0
     DATE
                       264834 non-null
                                         datetime64[ns]
 1
     STORE NBR
                       264834 non-null
                                         int64
 2
     LYLTY CARD NBR
                       264834 non-null int64
 3
     TXN ID
                       264834 non-null int64
 4
     PROD NBR
                       264834 non-null int64
 5
     PROD NAME
                       264834 non-null object
     PROD QTY
 6
                       264834 non-null
                                         int64
 7
     TOT SALES
                       264834 non-null float64
 8
     YEAR
                       264834 non-null int64
 9
     MONTH
                       264834 non-null int64
                       264834 non-null
 10
    BRAND
                                         object
 11
     PACKET SIZE
                       264834 non-null
                                         int64
 12
     LIFESTAGE
                       264834 non-null
                                         object
     PREMIUM CUSTOMER 264834 non-null
 13
                                         object
dtypes: datetime64[ns](1), float64(1), int64(8), object(4)
memory usage: 30.3+ MB
```

```
pur trans.describe()
            STORE NBR
                       LYLTY CARD NBR
                                               TXN ID
                                                             PROD NBR
                                                                        \
       264834.000000
                          2.648340e+05
                                                        264834.000000
count
                                         2.648340e+05
          135.079423
                          1.355488e+05
                                         1.351576e+05
                                                            56.583554
mean
std
            76.784063
                          8.057990e+04
                                         7.813292e+04
                                                            32.826444
             1.000000
                          1.000000e+03
                                         1.000000e+00
                                                             1.000000
min
25%
            70.000000
                          7.002100e+04
                                         6.760050e+04
                                                            28.000000
50%
           130.000000
                                         1.351365e+05
                                                            56.000000
                          1.303570e+05
75%
          203.000000
                          2.030940e+05
                                         2.026998e+05
                                                            85.000000
                          2.373711e+06
          272.000000
                                         2.415841e+06
                                                           114.000000
max
             PROD QTY
                            TOT SALES
                                                 YEAR
                                                                 MONTH
                        264834.000000
       264834.000000
count
                                        264834.000000
                                                        264834.000000
                             7.299346
                                          2018.500687
mean
             1.905813
                                                             6.535943
std
             0.343436
                             2.527241
                                             0.500000
                                                             3.448682
min
             1.000000
                             1.500000
                                          2018.000000
                                                             1.000000
25%
             2.000000
                             5.400000
                                          2018.000000
                                                             4.000000
50%
             2.000000
                             7.400000
                                          2019.000000
                                                             7.000000
75%
             2,000000
                             9,200000
                                          2019.000000
                                                            10.000000
                            29.500000
                                          2019.000000
max
             5.000000
                                                            12.000000
         PACKET SIZE
       264834.000000
count
          182.425512
mean
std
            64.325148
min
            70.000000
25%
           150.000000
50%
          170.000000
75%
          175.000000
          380.000000
max
```

saving merged file as csv file

pur trans.to csv('Data/Merged dataset QVI customer.csv')