

```
In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.model_selection import train_test_split

In [2]: df = pd.read_csv('26_problem1.csv')
df
```

Out[2]:

	ID	Year_Birth	Marital_Status	Income	Kidhome	Teenhome	MntWines	MntFruits	MntMeatProducts	MntFishProducts	MntSweetProducts	NumDealsPurchases	NumWebPurchases	NumCatalogPurchases	NumStorePurchases	NumWebVisitsMonth	
	0	5524	1957	Single	58138.0	0	0	635	88	546	172	88	3	8	10	4	7
	1	2174	1954	Single	46344.0	1	1	11	1	6	2	1	2	1	1	2	5
	2	4141	1965	Together	71613.0	0	0	426	49	127	111	21	1	8	2	10	4
	3	6182	1984	Together	26646.0	1	0	11	4	20	10	3	2	2	0	4	6
	4	5324	1981	Married	58293.0	1	0	173	43	118	46	27	5	5	3	6	5

	2235	10870	1967	Married	61223.0	0	1	709	43	182	42	118	2	9	3	4	5
	2236	4001	1946	Together	64014.0	2	1	406	0	30	0	0	7	8	2	5	7
	2237	7270	1981	Divorced	56981.0	0	0	908	48	217	32	12	1	2	3	13	6
	2238	8235	1956	Together	69245.0	0	1	428	30	214	80	30	2	6	5	10	3
	2239	9405	1954	Married	52869.0	1	1	84	3	61	2	1	3	3	1	4	7

2240 rows × 16 columns

```
In [3]: df.isna().sum()

Out[3]: ID                0
Year_Birth              0
Marital_Status          0
Income                 24
Kidhome                0
Teenhome               0
MntWines               0
MntFruits              0
MntMeatProducts        0
MntFishProducts        0
MntSweetProducts       0
NumDealsPurchases      0
NumWebPurchases        0
NumCatalogPurchases    0
NumStorePurchases      0
NumWebVisitsMonth      0
dtype: int64
```

```
In [4]: df.columns

Out[4]: Index(['ID', 'Year_Birth', 'Marital_Status', 'Income', 'Kidhome', 'Teenhome',
'MntWines', 'MntFruits', 'MntMeatProducts', 'MntFishProducts',
'MntSweetProducts', 'NumDealsPurchases', 'NumWebPurchases',
'NumCatalogPurchases', 'NumStorePurchases', 'NumWebVisitsMonth'],
dtype='object')
```

```
In [5]: df[df['Income'].isna()]

Out[5]:
```

	ID	Year_Birth	Marital_Status	Income	Kidhome	Teenhome	MntWines	MntFruits	MntMeatProducts	MntFishProducts	MntSweetProducts	NumDealsPurchases	NumWebPurchases	NumCatalogPurchases	NumStorePurchases	NumWebVisitsMonth	
	10	1994	1983	Married	NaN	1	0	5	5	6	0	2	1	1	0	2	7
	27	5255	1986	Single	NaN	1	0	5	1	3	3	263	0	27	0	0	1
	43	7281	1959	Single	NaN	0	0	81	11	50	3	2	1	1	3	4	2
	48	7244	1951	Single	NaN	2	1	48	5	48	6	10	3	2	1	4	6
	58	8557	1982	Single	NaN	1	0	11	3	22	2	2	2	2	0	3	6
	71	10629	1973	Married	NaN	1	0	25	3	43	17	4	3	3	0	3	8
	90	8996	1957	Married	NaN	2	1	230	42	192	49	37	12	7	2	8	9
	91	9235	1957	Single	NaN	1	1	7	0	8	2	0	1	1	0	2	7
	92	5798	1973	Together	NaN	0	0	445	37	359	98	28	1	2	4	8	1
	128	8268	1961	Married	NaN	0	1	352	0	27	10	0	3	6	1	7	6
	133	1295	1963	Married	NaN	0	1	231	65	196	38	71	1	6	5	7	4
	312	2437	1989	Married	NaN	0	0	861	138	461	60	30	1	6	5	12	3
	319	2863	1970	Single	NaN	1	2	738	20	172	52	50	6	2	3	10	7
	1379	10475	1970	Together	NaN	0	1	187	5	65	26	20	2	4	2	6	5
	1382	2902	1958	Together	NaN	1	1	19	4	12	2	2	1	1	0	3	5
	1383	4345	1964	Single	NaN	1	1	5	1	9	2	0	1	1	0	2	7
	1386	3769	1972	Together	NaN	1	0	25	1	13	0	0	1	1	0	3	7
	2059	7187	1969	Together	NaN	1	1	375	42	48	94	66	7	4	10	4	3
	2061	1612	1981	Single	NaN	1	0	23	0	15	0	2	2	3	0	3	6
	2078	5079	1971	Married	NaN	1	1	71	1	16	0	0	4	2	1	3	8
	2079	10339	1954	Together	NaN	0	1	161	0	22	0	0	2	4	1	4	6
	2081	3117	1955	Single	NaN	0	1	264	0	21	12	6	3	6	1	5	7
	2084	5250	1943	Widow	NaN	0	0	532	126	490	164	126	1	5	5	11	1
	2228	8720	1978	Together	NaN	0	0	32	2	1607	12	4	0	0	0	1	0

```
In [6]: df.shape

Out[6]: (2240, 16)
```

```
In [7]: df = df.dropna()

In [8]: df.shape

Out[8]: (2216, 16)
```

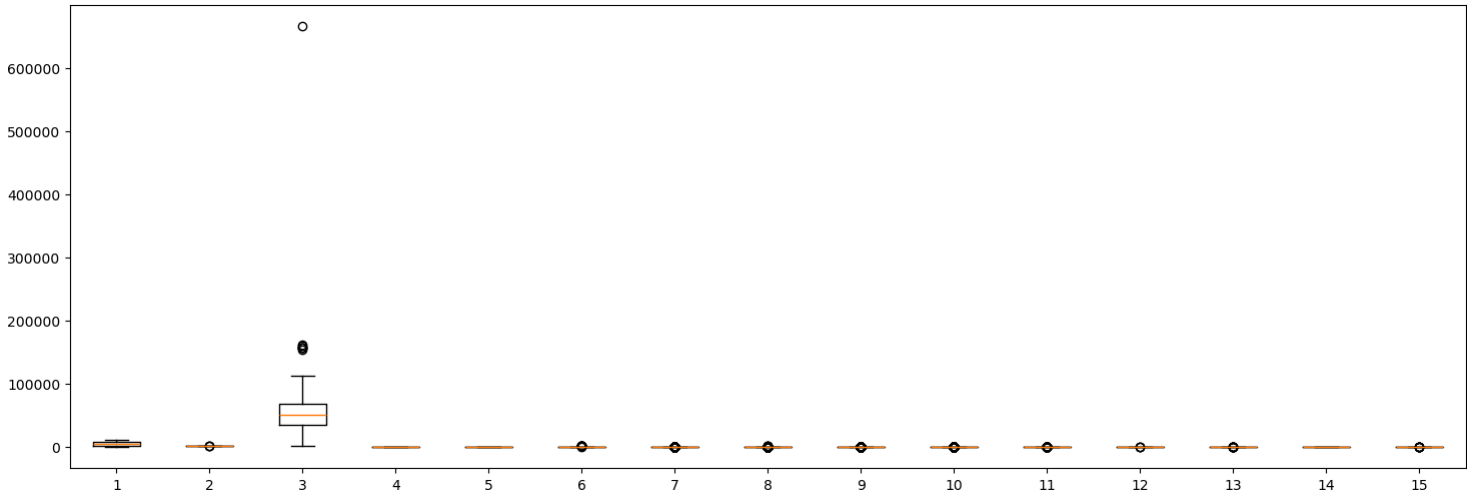
```
In [9]: df.info()

<class 'pandas.core.frame.DataFrame'>
Index: 2216 entries, 0 to 2239
Data columns (total 16 columns):
#   Column                Non-Null Count  Dtype
---  -
0   ID                    2216 non-null  int64
1   Year_Birth            2216 non-null  int64
2   Marital_Status        2216 non-null  object
3   Income                2216 non-null  float64
4   Kidhome               2216 non-null  int64
5   Teenhome              2216 non-null  int64
6   MntWines              2216 non-null  int64
7   MntFruits             2216 non-null  int64
8   MntMeatProducts       2216 non-null  int64
9   MntFishProducts       2216 non-null  int64
10  MntSweetProducts      2216 non-null  int64
11  NumDealsPurchases     2216 non-null  int64
12  NumWebPurchases       2216 non-null  int64
13  NumCatalogPurchases   2216 non-null  int64
14  NumStorePurchases     2216 non-null  int64
15  NumWebVisitsMonth     2216 non-null  int64
dtypes: float64(1), int64(14), object(1)
memory usage: 294.3+ KB
```

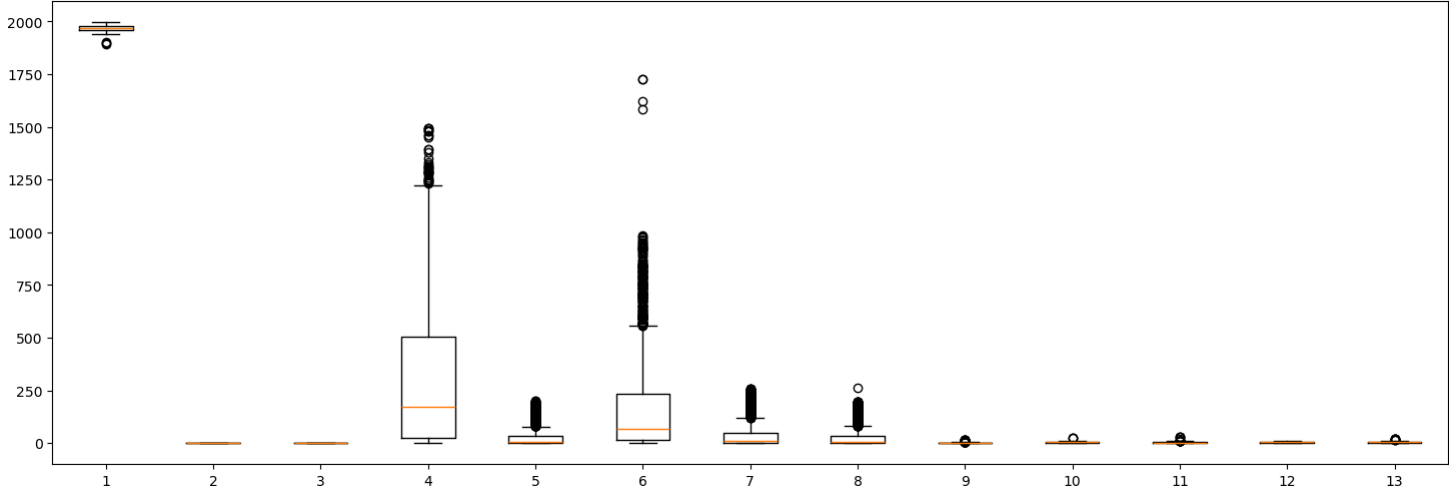
```
In [10]: df.isna().sum()

Out[10]: ID                0
Year_Birth              0
Marital_Status          0
Income                 0
Kidhome                0
Teenhome               0
MntWines               0
MntFruits              0
MntMeatProducts        0
MntFishProducts        0
MntSweetProducts       0
NumDealsPurchases      0
NumWebPurchases        0
NumCatalogPurchases    0
NumStorePurchases      0
NumWebVisitsMonth      0
dtype: int64
```

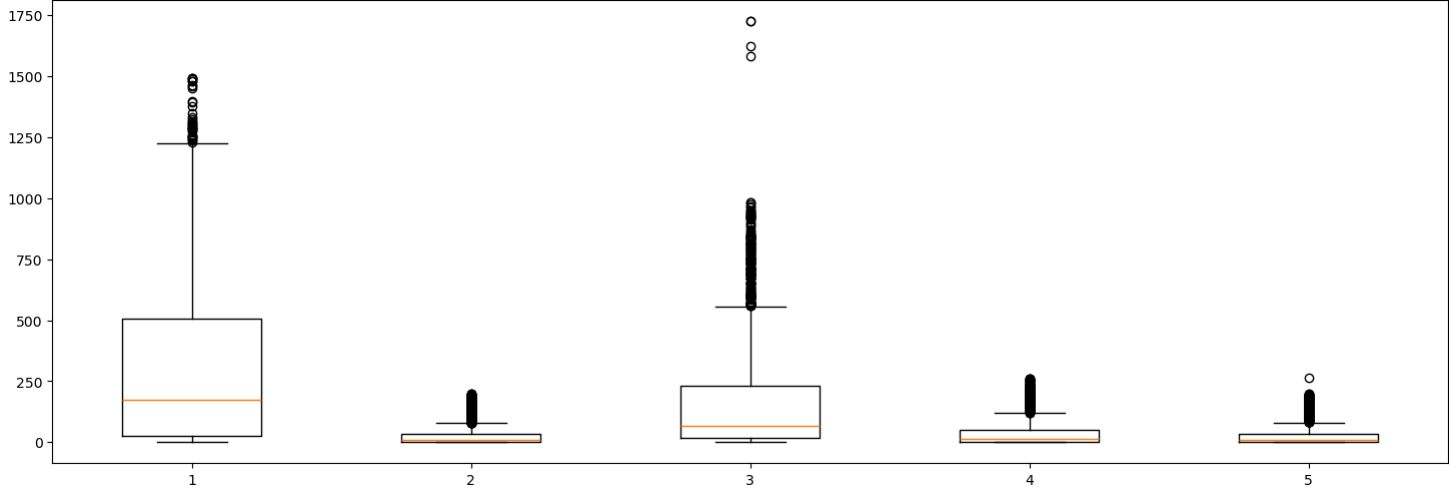
```
In [21]: fig=plt.figure(figsize=(18,6))
ax= fig.add_subplot(111)
ax.boxplot(df.drop(columns='Marital_Status'))
plt.show()
```



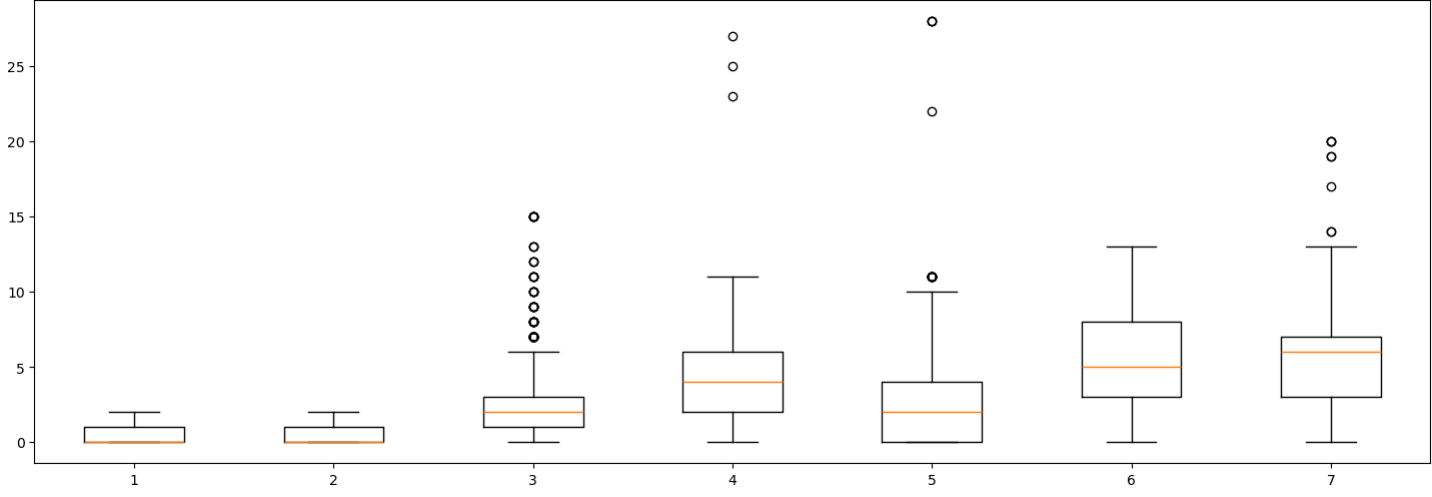
```
In [22]: fig=plt.figure(figsize=(18,6))
ax= fig.add_subplot(111)
ax.boxplot(df.drop(columns=['ID','Marital_Status','Income']))
plt.show()
```



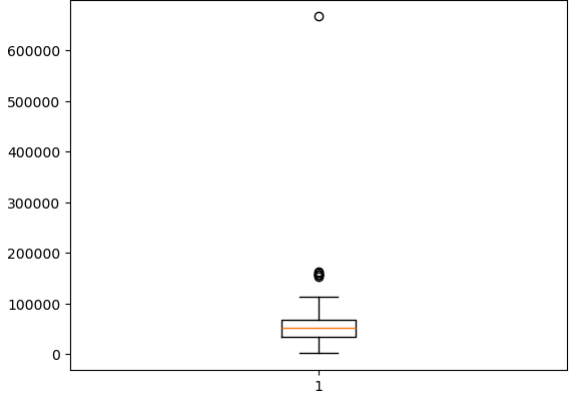
```
In [27]: fig=plt.figure(figsize=(18,6))
ax= fig.add_subplot(111)
ax.boxplot(df[['MntWines', 'MntFruits', 'MntMeatProducts', 'MntFishProducts', 'MntSweetProducts']])
plt.show()
```



```
In [29]: fig=plt.figure(figsize=(18,6))
ax= fig.add_subplot(111)
ax.boxplot(df[['Kidhome', 'Teenhome', 'NumDealsPurchases', 'NumWebPurchases','NumCatalogPurchases', 'NumStorePurchases', 'NumWebVisitsMonth']])
plt.show()
```



```
In [31]: #Index(['ID', 'Year_Birth', 'Marital_Status', 'Income', 'Kidhome', 'Teenhome', 'MntWines', 'MntFruits', 'MntMeatProducts', 'MntFishProducts',\
# 'MntSweetProducts', 'NumDealsPurchases', 'NumWebPurchases', 'NumCataLogPurchases', 'NumStorePurchases', 'NumWebVisitsMonth'])
plt.boxplot(df['Income'])
plt.show()
```



```
In [33]: def outliers_iqr(dt,col):
quantile_1, quantile_3 = np.percentile(df[col], [25, 75])
iqr = quantile_3 - quantile_1
lower_whis = quantile_1 - (iqr * 1.5)
upper_whis = quantile_3 + (iqr * 1.5)
outliers = df[(df[col] > upper_whis) | (df[col] < lower_whis)]
return outliers[[col]]
```

```
In [35]: outliers_Income = outliers_iqr(df, 'Income')
outliers_Income

Out[35]:
```

	Income
164	157243.0
617	162397.0
655	153924.0
687	160803.0
1300	157733.0
1653	157146.0
2132	156924.0
2233	666666.0

```
In [37]: df.loc[outliers_Income.index, 'Income'] = np.NaN
df['Income']

Out[37]:
```

	Income
0	58138.0
1	46344.0
2	71613.0
3	26646.0
4	58293.0
...	...
2235	61223.0
2236	64014.0
2237	56981.0
2238	69245.0
2239	52869.0

Name: Income, Length: 2216, dtype: float64

```
In [39]: df['Income'] = df['Income'].fillna(df['Income'].mean())

C:\Users\minje\AppData\Local\Temp\ipykernel_41864\1783921682.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
df['Income'] = df['Income'].fillna(df['Income'].mean())

In [41]: df.loc[outliers_Income.index, 'Income']

Out[41]:
```

	Income
164	51633.638134
617	51633.638134
655	51633.638134
687	51633.638134
1300	51633.638134
1653	51633.638134
2132	51633.638134
2233	51633.638134

Name: Income, dtype: float64

```
In [43]: df['Income']

Out[43]:
```

	Income
0	58138.0
1	46344.0
2	71613.0
3	26646.0
4	58293.0
...	...
2235	61223.0
2236	64014.0
2237	56981.0
2238	69245.0
2239	52869.0

Name: Income, Length: 2216, dtype: float64

```
In [45]: list = ['MntWines', 'MntFruits', 'MntMeatProducts', 'MntFishProducts', 'MntSweetProducts', 'NumDealsPurchases', 'NumWebPurchases', 'NumCatalogPurchases', 'NumWebVisitsMonth']
for x in list:
    outliers_x = outliers_iqr(df, x)
    print(outliers_x)
    df.loc[outliers_x.index, x] = np.NaN
    df[x] = df[x].fillna(df[x].mean())
    print(df.loc[outliers_x.index, x])
```

```
MntWines
111      1332
161      1349
295      1241
424      1285
430      1248
466      1239
497      1396
515      1288
523      1379
543      1478
559      1492
824      1492
826      1279
870      1308
917      1478
937      1253
987      1394
990      1296
1001     1285
1010     1230
1052     1315
1191     1298
1458     1302
1488     1449
1492     1259
1577     1252
1641     1459
1749     1493
1922     1324
1953     1285
1961     1462
1992     1276
2067     1245
2098     1486
2127     1311
111      288.45713
161      288.45713
295      288.45713
424      288.45713
430      288.45713
466      288.45713
497      288.45713
515      288.45713
523      288.45713
543      288.45713
559      288.45713
824      288.45713
826      288.45713
870      288.45713
917      288.45713
937      288.45713
987      288.45713
990      288.45713
1001     288.45713
1010     288.45713
1052     288.45713
1191     288.45713
1458     288.45713
1488     288.45713
1492     288.45713
1577     288.45713
1641     288.45713
1749     288.45713
1922     288.45713
1953     288.45713
1961     288.45713
1992     288.45713
2067     288.45713
2098     288.45713
2127     288.45713
Name: MntWines, dtype: float64
MntFruits
0         88
18        80
29       100
45       164
53       120
...      ...
2185     142
2194        8
2203       124
2206       129
2217       194

[246 rows x 1 columns]
0      14.335025
18     14.335025
29     14.335025
45     14.335025
53     14.335025
...      ...
2185    14.335025
2194    14.335025
2203    14.335025
2206    14.335025
2217    14.335025
Name: MntFruits, Length: 246, dtype: float64
MntMeatProducts
21         1725
29         801
51         780
76         925
77         779
...      ...
2187        749
2190        655
2193        845
2211        860
2213        631

[174 rows x 1 columns]
21      116.727718
29      116.727718
51      116.727718
76      116.727718
77      116.727718
...      ...
2187     116.727718
2190     116.727718
2193     116.727718
2211     116.727718
2213     116.727718
Name: MntMeatProducts, Length: 174, dtype: float64
MntFishProducts
0         172
12        225
17        150
39        160
45        227
...      ...
2188        199
2190        145
2193        202
2206        182
2217        149

[222 rows x 1 columns]
0      22.357071
12      22.357071
17      22.357071
39      22.357071
45      22.357071
...      ...
2188     22.357071
2190     22.357071
2193     22.357071
2206     22.357071
2217     22.357071
Name: MntFishProducts, Length: 222, dtype: float64
MntSweetProducts
0         88
12        112
40        178
51        167
55        120
...      ...
2175        92
2190        111
2193        133
2217        125
2235        118

[246 rows x 1 columns]
0      14.577157
12      14.577157
40      14.577157
51      14.577157
55      14.577157
...      ...
2175     14.577157
2190     14.577157
2193     14.577157
2217     14.577157
2235     14.577157
```

```
Name: MntSweetProducts, Length: 246, dtype: float64
NumDealsPurchases
21      15
24       7
49       9
54       7
69       7
...      ...
2090     7
2144     7
2198     7
2226     8
2236     7
```

```
[84 rows x 1 columns]
21      2.067073
24      2.067073
49      2.067073
54      2.067073
69      2.067073
.
```

```
2090    2.067073
2144    2.067073
2198    2.067073
2226    2.067073
2236    2.067073
```

```
Name: NumDealsPurchases, Length: 84, dtype: float64
NumWebPurchases
1806     23
1898     27
1975     25
1806    4.056936
1898    4.056936
1975    4.056936
```

```
Name: NumWebPurchases, dtype: float64
NumCatalogPurchases
```

```
21      28
104     11
164     22
288     11
586     11
591     11
627     11
636     11
687     28
764     11
777     11
934     11
984     11
1212    11
1452    11
1465    11
1492     1
1653    28
1745     1
1828     1
1906     1
1940     1
1958     1
```

```
21      2.555404
104      2.555404
164      2.555404
288      2.555404
586      2.555404
591      2.555404
627      2.555404
636      2.555404
687      2.555404
764      2.555404
777      2.555404
934      2.555404
984      2.555404
1212      2.555404
1452      2.555404
1465      2.555404
1492      2.555404
1653      2.555404
1745      2.555404
1828      2.555404
1906      2.555404
1940      2.555404
1958      2.555404
```

```
Name: NumCatalogPurchases, dtype: float64
NumWebVisitsMonth
```

```
9      20
774     20
981     14
1042    19
1245     20
1328     17
1524     14
1846     19
```

```
9      5.273551
774     5.273551
981     5.273551
1042    5.273551
1245     5.273551
1328     5.273551
1524     5.273551
1846     5.273551
```

```
Name: NumWebVisitsMonth, dtype: float64
```

```
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: 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
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: 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
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: 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
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: 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
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: 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
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: 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
```

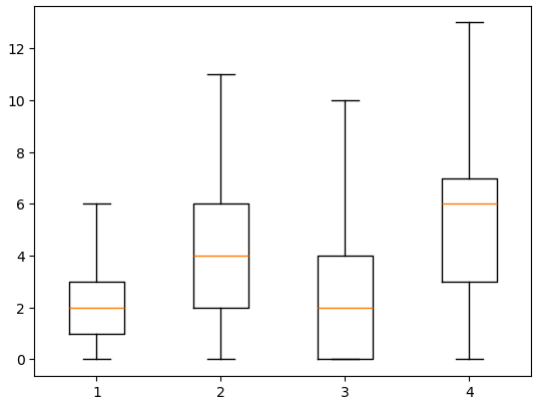
```
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: SettingWithCopyWarning:
A value is trying to be set on a 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
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: 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
```

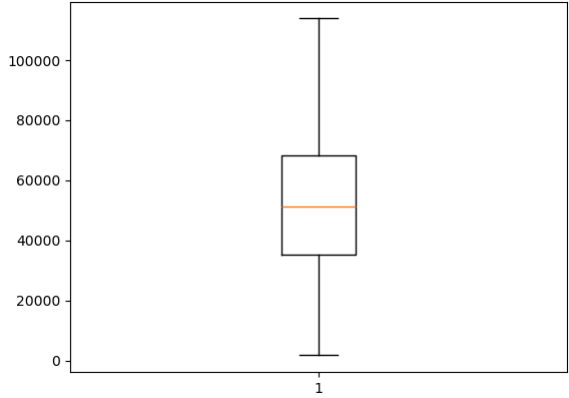
```
See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
df[x] = df[x].fillna(df[x].mean())
C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3641009375.py:6: SettingWithCopyWarning:
A value is trying to be set on a 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
df[x] = df[x].fillna(df[x].mean())
```

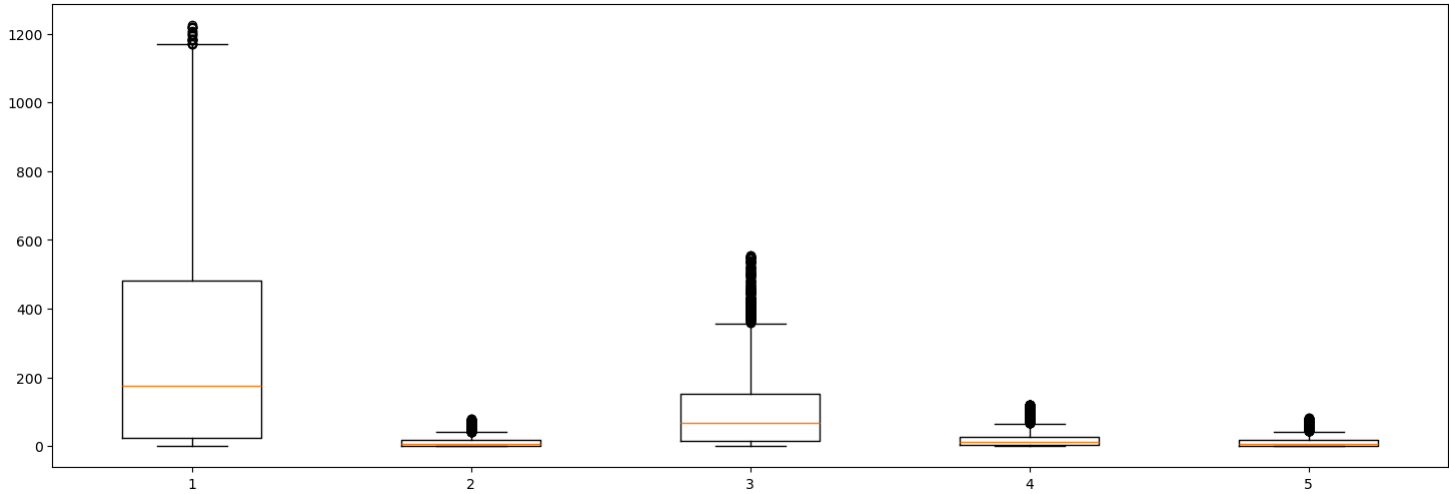
```
In [49]: plt.boxplot(df[['NumDealsPurchases', 'NumWebPurchases', 'NumCatalogPurchases', 'NumWebVisitsMonth']])
plt.show()
```



```
In [51]: plt.boxplot(df['Income'])
plt.show()
```



```
In [53]: fig=plt.figure(figsize=(18,6))
ax=fig.add_subplot(111)
ax.boxplot(df[['MntWines', 'MntFruits', 'MntMeatProducts', 'MntFishProducts','MntSweetProducts']])
plt.show()
```



균점생성하기

```
In [56]: print(set(df['Marital_Status']))
{'YOL0', 'Together', 'Widow', 'Single', 'Absurd', 'Alone', 'Divorced', 'Married'}
```

```
In [58]: from sklearn.preprocessing import LabelEncoder
label_encoder = LabelEncoder()

df['Marital_Status'] = label_encoder.fit_transform(df['Marital_Status'])
```

C:\Users\minje\AppData\Local\Temp\ipykernel_41864\112776462.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
df['Marital_Status'] = label_encoder.fit_transform(df['Marital_Status'])

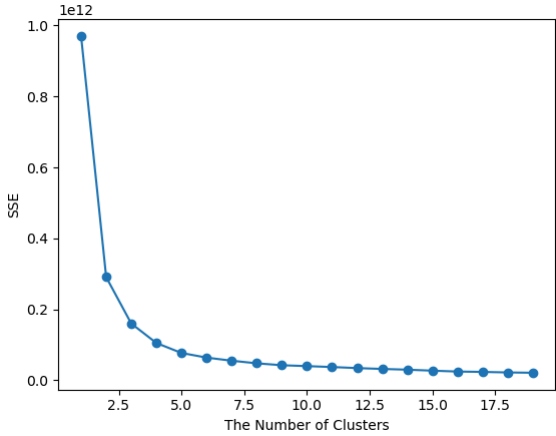
```
In [60]: print(set(df['Marital_Status']))
{0, 1, 2, 3, 4, 5, 6, 7}
```

```
In [66]: from sklearn.cluster import KMeans
X = df

def elbow(X):
    sse = []
    for i in range(1,20):
        km = KMeans(n_clusters=i, random_state=1)
        km.fit(X)
        sse.append(km.inertia_)

    plt.plot(range(1,20), sse, marker='o')
    plt.xlabel('The Number of Clusters')
    plt.ylabel('SSE')
    plt.show()
    print(sse)

elbow(X)
```



[970543986610.9198, 290651856687.75946, 159707280555.48395, 104911347502.17007, 76793066532.67589, 63735128665.97969, 54990097856.68637, 47604617396.77124, 42219603144.42308, 39721810542.89242, 37145173367.265724, 34161051283.82306, 31745528146.482, 29689328099.4404, 26894870557.744766, 24427068149.95391, 23366512070.575924, 21893748930.570484, 20953414977.9661]

```
In [68]: km = KMeans(n_clusters=5, random_state=1)
km.fit(X)

new_labels = km.labels_
df['clusters'] = new_labels

df.groupby(['clusters']).mean()
```

C:\Users\minje\AppData\Local\Temp\ipykernel_41864\3352184059.py:5: 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
df['clusters'] = new_labels

Out[68]:

	ID	Year_Birth	Marital_Status	Income	Kidhome	Teenhome	MntWines	MntFruits	MntMeatProducts	MntFishProducts	MntSweetProducts	NumDealsPurchases	NumWebPurchases	NumCatalogPurchases	NumStorePurchases	NumWebVisitsMonth
clusters																
0	5728.060241	1966.343373	3.658635	66570.568273	0.122490	0.622490	514.103557	22.812285	213.705038	35.761318	23.387289	2.067489	5.720884	4.154171	8.379518	4.182731
1	5758.841499	1974.858790	3.700288	20946.409222	0.763689	0.172911	12.605187	5.971182	16.889705	7.931865	5.984372	1.940254	1.838945	0.413704	2.824207	6.847805
2	5459.341651	1971.314779	3.715931	36637.109405	0.809981	0.485605	62.403071	5.476670	33.882917	8.459692	5.809465	2.199499	2.600768	0.700576	3.491363	6.623800
3	5429.724846	1965.521561	3.788501	51506.109045	0.418891	0.850103	263.425990	10.525032	78.975176	17.204457	10.632057	2.701470	4.587269	2.086697	5.804928	5.745380
4	5631.696970	1967.292011	3.774105	82171.311295	0.074380	0.228650	600.614245	28.525793	248.674588	44.616270	28.581241	1.146560	5.272884	5.700331	8.418733	2.694215

In [70]:

df[df['ID']==10870]

Out[70]:

	ID	Year_Birth	Marital_Status	Income	Kidhome	Teenhome	MntWines	MntFruits	MntMeatProducts	MntFishProducts	MntSweetProducts	NumDealsPurchases	NumWebPurchases	NumCatalogPurchases	NumStorePurchases	NumWebVisitsMonth	clusters
2235	10870	1967	3	61223.0	0	1	709.0	43.0	182.0	42.0	14.577157	2.0	9.0	3.0	4	5.0	0

In []:

In []: