Assignment 3 – Individual Assignment Anshita Thakkar Visual Analytics – Professor Ko

This document shows the graphs created I R Studio. The .R document has explanations for most graphs.

1) Univariate non-graphical EDA: Categorical data

Simple tabulation of marital status (see R sheet for code). This shows proportion of dataset that are married, divorced etc. (all results total to 1)

Absurd Alone Divorced Married Single Together Widow YOLO 0.0009025271 0.0013537906 0.1046931408 0.3867328520 0.2125451264 0.2585740072 0.0342960289 0.0009025271

Simple tabulation Education (see R sheet for code). This shows proportion of dataset that are education e.g. basic, graduation, masters and PHD etc. (all results total to 1)

2n Cycle Basic Graduation Master PhD 0.09025271 0.02436823 0.50361011 0.16471119 0.21705776

0 1
0.990523466 0.009476534

2) Univariate non-graphical EDA: quantitative data

We can see results such as the mean of a quantitative variable. In this example, we are exploring Income.

Code: summary(marketing\$Income)

3) Min. 1st Qu. Median Mean 3rd Qu. Max.4) 1730 35303 51382 52247 68522 666666

Code: describe(marketing\$Income)

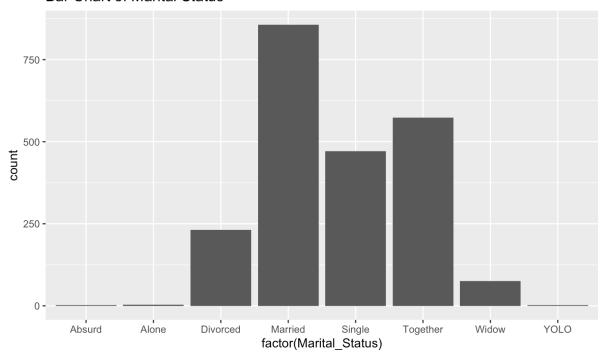
Description: $df[1 \times 13]$

	vars	n . alla la	mean	sd	median	trimmed
	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>	<dbl></dbl>
X1	1	2216	52247.25	25173.08	51381.5	51763.99
1 row 1-	10 of 13 colun	nns				

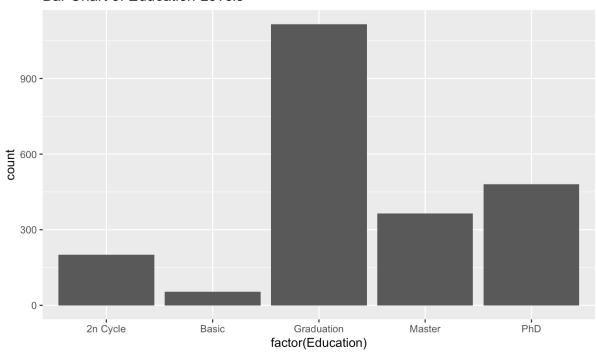
5) Univariate graphical EDA: categorical data

Graphs allow us to understand data more easily as it visually represents the variable.

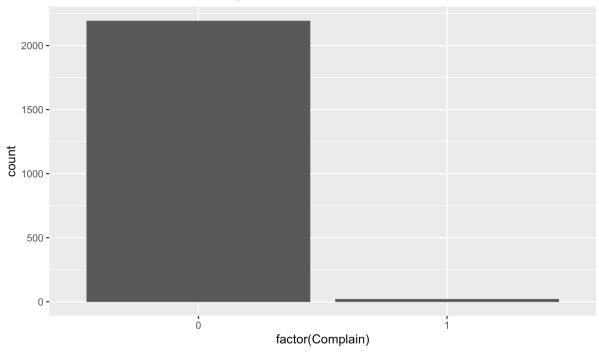
Bar Chart of Marital Status



Bar Chart of Education Levels

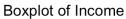


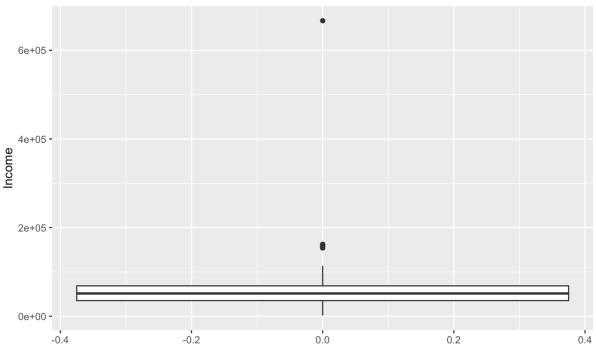




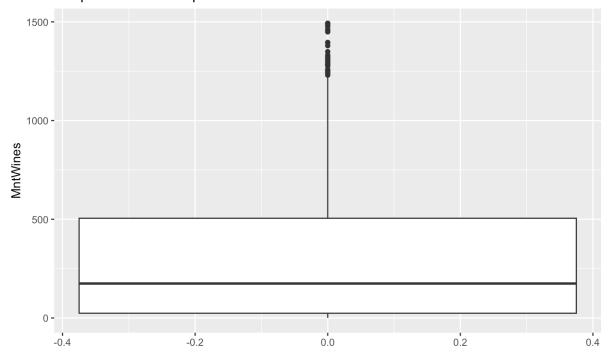
6) Univariate graphical EDA: quantitative data

Box and scatter plots show outliers and the relationship between two variables if more than two variables are used. Further analysis of the data is found in the R Sheet.





Boxplot of Amount Spent on Wines



7) Multivariate non-graphical EDA: cross-tabulation for categorical variables Cross-tabulation for 'Education' and 'Complain' variables. It allows us to the number of individuals out of the total in the dataset who are for example masters, phd or basic education level holders.

table(marketing\$Education, marketing\$Complain)

	0	1
2n Cycle	196	4
Basic	54	0
Graduation	1102	14
Master	363	2
PhD	480	1

8) Multivariate non-graphical EDA: Covariance and correlation for two quantitative variables

This shows how strongly variables in a dataset are correlated. I have used three different examples below:

Codes:

print(cov(marketing\$Income, marketing\$NumWebVisitsMonth))
print(cor(marketing\$Income, marketing\$NumWebVisitsMonth))

print(cov(marketing\$Income, marketing\$NumStorePurchases))
print(cor(marketing\$Income, marketing\$NumStorePurchases))

print(cov(marketing\$MntWines, marketing\$NumStorePurchases))
print(cor(marketing\$MntWines, marketing\$NumStorePurchases))

results:

- [1] -33768.09
- [1] -0.553088
- [1] 43318.9
- [1] 0.5293621
- [1] 701.8246
- [1] 0.6400119

MntWines and NumStorePurchases are most strongly correlated (r = 0.6400119) compared to the other variables.

Multivariate non-graphical EDA: Covariance and correlation for more than two quantitative variables - I have choses all numeric variables in the marketing dataset.

The below code finds the covariance and correlation among all numeric variables in the dataset.

```
cov_matrix <- cov(marketing[, sapply(marketing, is.numeric)])
print(cov_matrix)</pre>
```

cor_matrix <- cor(marketing[, sapply(marketing, is.numeric)])
print(cor_matrix)</pre>



	ID	Yea	r_Birth	Income	Kidhome	
Recency	MntWir	nes	MntFrui	its		
1.0558	345e+07	9.172	579e+01	1.071169e+06	3.028930e+00	-
-4.174185e+03	-2.3109	976e+04	9.4732	270e+02		
9.1725	579e+01	1.436	535e+02	-4.881462e+04	1.503310e+00	-
-5.653712e+00	-6.4467	707e+02	-8.4642	241e+00		
1.071	L69e+06	-4.8814	462e+04	6.336838e+08	-5.793603e+03	
-2.892837e+03	4.9136	552e+06	4.3158	893e+05		
3.0289	930e+00	1.503	310e+00	-5.793603e+03	2.882576e-01	-
1.786140e-01	-9.0072	254e+01	-7.9776	584e+00		
-5.3574	145e+00	-2.2879	966e+00	2.621027e+02	-1.164851e-02	
2.179902e-01	6.8776	556e-01	-3.8233	374e+00		
-4.1742	L85e+03	-5.653	712e+00	-2.892837e+03	1.786140e-01	
8.380071e+02	1.5351	L71e+02	-6.7318	315e+00		
-2.3109	976e+04	-6.446	707e+02	4.913652e+06	-9.007254e+01	
1.535171e+02	1.1379	901e+05	5.1952	253e+03		
9.4732	270e+02	-8.4642	241e+00	4.315893e+05	-7.977684e+00	-
-6.731815e+00	5.1952	253e+03	1.5835	556e+03		
cts -4.3013	363e+03	-9.0582	222e+01	3.300781e+06	-5.289437e+01	-
1.461987e+02	4.3038	325e+04	4.8893	373e+03		
cts -4.2684	127e+03	-2.6528	832e+ 0 1	6.048869e+05	-1.143171e+01	-
8.732037e-01	7.3456	572e+03	1.2929	967e+03		
	1.0558 -4.174185e+03 9.1725 -5.653712e+00 1.0711 -2.892837e+03 3.0289 1.786140e-01 -5.3574 2.179902e-01 -4.1741 8.380071e+02 -2.3109 1.535171e+02 9.4732 -6.731815e+00 cts -4.3013 1.461987e+02 cts -4.2684	Recency MntWir 1.055845e+07 -4.174185e+03 -2.3109 9.172579e+01 -5.653712e+00 -6.4467 1.071169e+06 -2.892837e+03 4.9136 3.028930e+00 1.786140e-01 -9.0077 -5.357445e+00 2.179902e-01 6.8776 -4.174185e+03 8.380071e+02 1.5357 -2.310976e+04 1.535171e+02 1.1379 9.473270e+02 -6.731815e+00 5.1957 cts -4.301363e+03 1.461987e+02 4.3038 cts -4.268427e+03	Recency MntWines 1.055845e+07 9.1725 -4.174185e+03 -2.310976e+04 9.172579e+01 1.4365 -5.653712e+00 -6.446707e+02 1.071169e+06 -4.8814 -2.892837e+03 4.913652e+06 3.028930e+00 1.5033 1.786140e-01 -9.007254e+01 -5.357445e+00 -2.2875 2.179902e-01 6.877656e-01 -4.174185e+03 -5.6533 8.380071e+02 1.535171e+02 -2.310976e+04 -6.4463 1.535171e+02 1.137901e+05 9.473270e+02 -8.4643 -6.731815e+00 5.195253e+03 cts -4.301363e+03 -9.0583 1.461987e+02 4.303825e+04 cts -4.268427e+03 -2.6523	Recency MntWines MntFruit 1.055845e+07 9.172579e+01 -4.174185e+03 -2.310976e+04 9.4732 9.172579e+01 1.436535e+02 -5.653712e+00 -6.446707e+02 -8.4642 1.071169e+06 -4.881462e+04 -2.892837e+03 4.913652e+06 4.3158 3.028930e+00 1.503310e+00 1.786140e-01 -9.007254e+01 -7.9776 -5.357445e+00 -2.287966e+00 2.179902e-01 6.877656e-01 -3.8233 -4.174185e+03 -5.653712e+00 8.380071e+02 1.535171e+02 -6.7318 -2.310976e+04 -6.446707e+02 1.535171e+02 1.137901e+05 5.1952 9.473270e+02 -8.464241e+00 -6.731815e+00 5.195253e+03 1.5835 cts -4.301363e+03 -9.058222e+01 1.461987e+02 4.303825e+04 4.8895 cts -4.268427e+03 -2.652832e+01	Recency MntWines MntFruits	Recency MntWines MntFruits

```
-7.922359e+02 -9.946052e+00 4.556893e+05 -8.336016e+00 -
MntSweetProducts
             2.985471e+01 5.407866e+03 9.342430e+02
3.644400e+00
MntGoldProds
                    -1.880985e+03 -3.987532e+01 4.251102e+05 -9.876741e+00 -
5.607598e-01 2.649344e+01 6.864461e+03 8.175316e+02
                    -2.538575e+02 -1.352697e+00 -4.024231e+03 2.240355e-01
NumDealsPurchases
4.043419e-01 1.178061e-01 5.766284e+00 -1.029719e+01
NumWebPurchases
                    -1.645566e+02 -5.028016e+00 2.676286e+04 -5.474030e-01
2.417501e-01 -4.475793e-01 5.120301e+02 3.294434e+01
NumCataloaPurchases -2.162818e+01 -4.271300e+00 4.340648e+04 -7.927482e-01 -
1.794819e-01 2.040276e+00 6.266717e+02 5.663321e+01
NumStorePurchases
                    -1.380552e+02 -4.982937e+00 4.331890e+04 -8.750212e-01
8.798559e-02 -4.082519e-02 7.018246e+02 5.931107e+01
                    -6.142249e+01 3.601796e+00 -3.376809e+04 5.826892e-01
NumWebVisitsMonth
1.732151e-01 -1.303356e+00 -2.634234e+02 -4.041342e+01
                    -3.044993e+01 1.933523e-01 -1.063120e+02 2.252243e-03 -
AcceptedCmp3
6.041838e-03 -2.438192e-01 5.413575e+00 1.498710e-01
AcceptedCmp4
                    -2.036296e+01 -2.074696e-01 1.215450e+03 -2.277791e-02
             1.331502e-01 3.295845e+01 6.664032e-02
5.468132e-03
AcceptedCmp5
                    -5.976632e+00 3.300030e-02 2.201852e+03 -2.869955e-02 -
2.703262e-02 -3.632926e-03 4.159149e+01 2.205562e+00
AcceptedCmp1
                    -1.450076e+01 -2.821507e-02 1.706909e+03 -2.290463e-02 -
1.930878e-02 -1.493428e-01 2.903702e+01 1.869725e+00
AcceptedCmp2
                    -5.631422e+00 -9.305604e-03 2.547302e+02 -5.080637e-03 -
9.762776e-04 -4.685806e-03 8.039391e+00 -4.590583e-02
                     1.075466e+01 -3.531753e-02 -6.641277e+01 2.132042e-03
Complain
1.743935e-04 3.825492e-02 -1.290259e+00 -2.053137e-02
                    -2.495876e+01 1.014933e-01 1.197060e+03 -1.495037e-02 -
Response
2.993375e-02 -2.066911e+00 2.969548e+01 1.741506e+00
                    MntMeatProducts MntFishProducts MntSweetProducts MntGoldProds
NumDealsPurchases NumWebPurchases
                      -4.301363e+03
                                      -4.268427e+03
                                                       -7.922359e+02 -1.880985e+03
-2.538575e+02
                -1.645566e+02
Year_Birth
                      -9.058222e+01
                                      -2.652832e+01
                                                       -9.946052e+00 -3.987532e+01
-1.352697e+00
                -5.028016e+00
Income
                       3.300781e+06
                                       6.048869e+05
                                                       4.556893e+05 4.251102e+05
-4.024231e+03
                 2.676286e+04
Kidhome
                      -5.289437e+01
                                      -1.143171e+01
                                                       -8.336016e+00 -9.876741e+00
2.240355e-01
               -5.474030e-01
                                                       -3.644400e+00 -5.607598e-01
Teenhome
                      -3.187018e+01
                                      -6.115193e+00
4.043419e-01
               2.417501e-01
                       1.461987e+02
                                       8.732037e-01
                                                       2.985471e+01 2.649344e+01
Recency
1.178061e-01
               -4.475793e-01
                                                       5.407866e+03 6.864461e+03
MntWines
                       4.303825e+04
                                       7.345672e+03
5.766284e+00
                5.120301e+02
                                       1.292967e+03
                                                       9.342430e+02 8.175316e+02
MntFruits
                       4.889373e+03
-1.029719e+01
                 3.294434e+01
MntMeatProducts
                       5.030299e+04
                                       7.043475e+03
                                                       4.929552e+03 4.177244e+03
-5.233909e+01
                 1.887836e+02
                       7.043475e+03
                                       2.997791e+03
MntFishProducts
                                                       1.312988e+03 1.211803e+03
                 4.497494e+01
-1.508722e+01
MntSweetProducts
                       4.929552e+03
                                       1.312988e+03
                                                        1.686913e+03 7.607121e+02
-9.594450e+00
                 3.759347e+01
MntGoldProds
                       4.177244e+03
                                       1.211803e+03
                                                       7.607121e+02 2.684837e+03
5.173776e+00
                5.781290e+01
NumDealsPurchases
                      -5.233909e+01
                                      -1.508722e+01
                                                       -9.594450e+00 5.173776e+00
3.700682e+00
                1.273069e+00
NumWebPurchases
                       1.887836e+02
                                      4.497494e+01
                                                       3.759347e+01 5.781290e+01
1.273069e+00
               7.512813e+00
```

```
NumCatalogPurchases
                       4.818935e+02
                                       8.537148e+01
                                                         5.951876e+01 6.709421e+01
-6.822921e-02
                 3.103465e+00
                       3.543450e+02
NumStorePurchases
                                       8.147278e+01
                                                         6.078002e+01 6.555380e+01
                4.599825e+00
4.134032e-01
NumWebVisitsMonth
                      -2.934619e+02
                                      -5.928208e+01
                                                        -4.207423e+01 -3.112751e+01
1.614558e+00
               -3.405414e-01
                       1.079757e+00
AcceptedCmp3
                                      -3.130730e-03
                                                         1.909364e-02 1.690593e+00
-1.162060e-02
                 3.074398e-02
AcceptedCmp4
                       5.380436e+00
                                       2.308929e-01
                                                         3.152431e-01 3.258233e-01
8.097889e-03
                1.169357e-01
                                       2.798060e+00
AcceptedCmp5
                       2.200752e+01
                                                         2.772154e+00 2.447237e+00
                 1.007599e-01
-9.228716e-02
                                       3.508558e+00
                                                         2.465869e+00 2.159338e+00
AcceptedCmp1
                       1.719981e+01
                 1.069476e-01
-6.002029e-02
                                                         4.836730e-02 3.038566e-01
AcceptedCmp2
                       1.128272e+00
                                       1.484015e-02
-8.445453e-03
                 1.103446e-02
                                      -1.125916e-01
                                                        -9.011580e-02 -1.563297e-01
Complain
                      -5.168915e-01
9.269748e-05
               -4.420345e-03
Response
                       1.905840e+01
                                       2.116328e+00
                                                         1.705365e+00 2.598903e+00
2.372852e-03
                1.483516e-01
                    NumCatalogPurchases NumStorePurchases NumWebVisitsMonth
              AcceptedCmp4 AcceptedCmp5 AcceptedCmp1
AcceptedCmp3
                          -2.162818e+01
                                             -1.380552e+02
                                                               -6.142249e+01 -
ID
3.044993e+01 -2.036296e+01 -5.976632e+00 -1.450076e+01
Year_Birth
                                             -4.982937e+00
                                                                3.601796e+00
                          -4.271300e+00
1.933523e-01 -2.074696e-01
                           3.300030e-02 -2.821507e-02
                                              4.331890e+04
                                                               -3.376809e+04 -
Income
                           4.340648e+04
1.063120e+02 1.215450e+03
                                          1.706909e+03
                            2.201852e+03
                          -7.927482e-01
                                             -8.750212e-01
                                                                5.826892e-01
Kidhome
2.252243e-03 -2.277791e-02 -2.869955e-02 -2.290463e-02
Teenhome
                          -1.794819e-01
                                              8.798559e-02
                                                                1.732151e-01 -
6.041838e-03
              5.468132e-03 -2.703262e-02 -1.930878e-02
Recency
                           2.040276e+00
                                             -4.082519e-02
                                                               -1.303356e+00 -
              1.331502e-01 -3.632926e-03 -1.493428e-01
2.438192e-01
MntWines
                           6.266717e+02
                                              7.018246e+02
                                                               -2.634234e+02
5.413575e+00
              3.295845e+01 4.159149e+01
                                         2.903702e+01
MntFruits
                           5.663321e+01
                                              5.931107e+01
                                                               -4.041342e+01
1.498710e-01 6.664032e-02 2.205562e+00
                                          1.869725e+00
MntMeatProducts
                           4.818935e+02
                                              3.543450e+02
                                                               -2.934619e+02
1.079757e+00 5.380436e+00
                           2.200752e+01
                                          1.719981e+01
MntFishProducts
                           8.537148e+01
                                              8.147278e+01
                                                               -5.928208e+01 -
3.130730e-03
              2.308929e-01
                            2.798060e+00
                                          3.508558e+00
                                              6.078002e+01
MntSweetProducts
                           5.951876e+01
                                                               -4.207423e+01
1.909364e-02
              3.152431e-01
                            2.772154e+00
                                          2.465869e+00
MntGoldProds
                                                               -3.112751e+01
                           6.709421e+01
                                              6.555380e+01
1.690593e+00
              3.258233e-01
                           2.447237e+00
                                          2.159338e+00
NumDealsPurchases
                          -6.822921e-02
                                              4.134032e-01
                                                                1.614558e+00 -
1.162060e-02
              8.097889e-03 -9.228716e-02 -6.002029e-02
                                                               -3.405414e-01
NumWebPurchases
                           3.103465e+00
                                              4.599825e+00
3.074398e-02
              1.169357e-01 1.007599e-01
                                          1.069476e-01
NumCatalogPurchases
                           8.565770e+00
                                              4.926828e+00
                                                               -3.705380e+00
7.973918e-02
              1.074272e-01 2.457306e-01
                                          2.215413e-01
NumStorePurchases
                           4.926828e+00
                                              1.056760e+01
                                                               -3.409166e+00 -
5.849292e-02 1.515292e-01 1.802434e-01
                                          1.423291e-01
NumWebVisitsMonth
                          -3.705380e+00
                                             -3.409166e+00
                                                                5.882364e+00
3.882435e-02 -1.820456e-02 -1.754786e-01 -1.157129e-01
                           7.973918e-02
                                             -5.849292e-02
                                                                3.882435e-02
AcceptedCmp3
6.817624e-02 -5.446130e-03 5.455501e-03
                                          6.119663e-03
```

```
AcceptedCmp4
                          1.074272e-01
                                            1.515292e-01
                                                             -1.820456e-02 -
5.446130e-03
             6.856109e-02
                          2.122385e-02
                                        1.557155e-02
                          2.457306e-01
                                            1.802434e-01
                                                            -1.754786e-01
AcceptedCmp5
5.455501e-03
             2.122385e-02 6.779099e-02 2.601315e-02
AcceptedCmp1
                          2.215413e-01
                                            1.423291e-01
                                                            -1.157129e-01
6.119663e-03
             1.557155e-02 2.601315e-02 6.000033e-02
AcceptedCmp2
                          3.380096e-02
                                            3.204073e-02
                                                            -2.063792e-03
2.164028e-03 8.929925e-03 6.684812e-03 5.001182e-03
Complain
                         -5.910432e-03
                                           -5.336726e-03
                                                             4.650154e-03
2.055643e-04 -7.016486e-04 -2.416246e-04 -6.075250e-04
Response
                          2.300440e-01
                                            4.210808e-02
                                                            -1.914865e-03
2.370468e-02 1.686483e-02 3.009306e-02 2.603230e-02
                    AcceptedCmp2
                                      Complain
                                                    Response
TD
                   -5.631422e+00 1.075466e+01 -2.495876e+01
Year_Birth
                   -9.305604e-03 -3.531753e-02
                                               1.014933e-01
Income
                    2.547302e+02 -6.641277e+01
                                               1.197060e+03
Kidhome
                   -5.080637e-03 2.132042e-03 -1.495037e-02
                   -9.762776e-04 1.743935e-04 -2.993375e-02
Teenhome
Recency
                   -4.685806e-03 3.825492e-02 -2.066911e+00
                    8.039391e+00 -1.290259e+00
MntWines
                                               2.969548e+01
MntFruits
                   -4.590583e-02 -2.053137e-02
                                               1.741506e+00
                    1.128272e+00 -5.168915e-01
MntMeatProducts
                                                1.905840e+01
MntFishProducts
                    1.484015e-02 -1.125916e-01
                                                2.116328e+00
MntSweetProducts
                    4.836730e-02 -9.011580e-02
                                                1.705365e+00
MntGoldProds
                    3.038566e-01 -1.563297e-01
                                               2.598903e+00
NumDealsPurchases
                   -8.445453e-03 9.269748e-05
                                               2.372852e-03
                    1.103446e-02 -4.420345e-03
                                               1.483516e-01
NumWebPurchases
NumCataloaPurchases
                    3.380096e-02 -5.910432e-03
                                               2.300440e-01
                    3.204073e-02 -5.336726e-03
NumStorePurchases
                                               4.210808e-02
                   -2.063792e-03 4.650154e-03
NumWebVisitsMonth
                                               -1.914865e-03
AcceptedCmp3
                    2.164028e-03 2.055643e-04
                                               2.370468e-02
                    8.929925e-03 -7.016486e-04
AcceptedCmp4
                                               1.686483e-02
AcceptedCmp5
                    6.684812e-03 -2.416246e-04
                                               3.009306e-02
AcceptedCmp1
                    5.001182e-03 -6.075250e-04
                                               2.603230e-02
AcceptedCmp2
                    1.336066e-02 -1.283504e-04
                                               6.994076e-03
                   -1.283504e-04 9.390967e-03 -7.028710e-05
Complain
Response
                    6.994076e-03 -7.028710e-05
                                               1.277471e-01
                             ID
                                  Year_Birth
                                                   Income
                                                              Kidhome
Teenhome
              Recency
                          MntWines
                                      MntFruits
                    1.000000000 0.002355230 0.013095483
                                                          0.001736197 -
0.003029801 -0.0443759646 -0.021083523 0.007326275
Year Birth
                    0.002355230 1.000000000 -0.161791428
                                                          0.233614617 -
0.350790573 -0.0162948997 -0.159451096 -0.017746520
                    0.013095483 -0.161791428 1.000000000 -0.428669008
Income
0.019133378 -0.0039697555 0.578649750 0.430841681
                    1.000000000 -
Kidhome
0.039869095
            0.0114921489 -0.497335858 -0.373396102
                   -0.003029801 -0.350790573 0.019133378 -0.039869095
Teenhome
1.000000000
            Recency
                   -0.044375965 -0.016294900 -0.003969756 0.011492149
            1.0000000000 0.015721019 -0.005843750
0.013837883
                   -0.021083523 -0.159451096 0.578649750 -0.497335858
MntWines
0.003746663
            0.0157210194 1.000000000 0.387023861
MntFruits
                    0.007326275 -0.017746520 0.430841681 -0.373396102 -
0.176557638 -0.0058437499 0.387023861 1.0000000000
```

```
-0.005902136 -0.033696745 0.584633357 -0.439260529 -
MntMeatProducts
MntFishProducts
MntSweetProducts
                MntGoldProds
                -0.011171885 -0.064207693 0.325916446 -0.355029425 -
NumDealsPurchases
               -0.040611507 -0.058668051 -0.083100896 0.216913048
NumWebPurchases
                -0.018476253 -0.153051375 0.387877811 -0.371976549
0.162077185 -0.0056408538 0.553785939 0.302038849
NumCatalogPurchases -0.002274242 -0.121763972 0.589162442 -0.504500622 -
-0.013069664 -0.127890722 0.529362140 -0.501348810
NumStorePurchases
0.049737024 -0.0004338266 0.640011908 0.458491031
NumWebVisitsMonth
               0.131240022 -0.0185636434 -0.321977901 -0.418728932
                AcceptedCmp3
0.042521542 -0.0322572663 0.061463221 0.014423960
AcceptedCmp4
                -0.023933266 -0.066108524 0.184400368 -0.162025971
AcceptedCmp5
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                -0.018218551 -0.009610507 0.276819864 -0.174163083 -
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                -0.014993538 -0.006716956   0.087544774 -0.081867930 -
AcceptedCmp2
0.015520861 -0.0014003821 0.206184929 -0.009980152
                0.034154007 -0.030407247 -0.027224512 0.040977949
Complain
0.003306980
          0.0136366703 -0.039470211 -0.005324099
Response
                -0.021490550 0.023692120 0.133046664 -0.077908722 -
0.153901199 -0.1997663693 0.246298957 0.122442679
               MntMeatProducts MntFishProducts MntSweetProducts MntGoldProds
NumDealsPurchases NumWebPurchases
ID
                  -0.005902136
                              -0.0239920406
                                            -0.005936196 -0.01117189
-0.0406115067
             -0.018476253
Year_Birth
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                              -0.0404250842
                                            -0.020204415
                                                       -0.06420769
-0.0586680509
             -0.153051375
                                             0.440743792
Income
                   0.584633357
                               0.4388713595
                                                        0.32591645
-0.0831008957
              0.387877811
Kidhome
                  -0.439260529
                              -0.3888842203
                                            -0.378026128
                                                       -0.35502942
0.2169130476
            -0.371976549
Teenhome
                  -0.261122385
                              -0.2052418665
                                            -0.163055777 -0.01988723
0.3862463041
             0.162077185
                               0.0005509232
                                             0.025109770
Recency
                   0.022517635
                                                        0.01766264
0.0021154508
            -0.005640854
MntWines
                               0.3977210502
                                             0.390325802
                                                        0.39273099
                   0.568860003
0.0088859288
             0.553785939
MntFruits
                   0.547822166
                               0.5934310503
                                             0.571606063
                                                        0.39648692
-0.1345120994
              0.302038849
                               0.5735740153
                                             0.535136109
MntMeatProducts
                   1.000000000
                                                        0.35944628
-0.1213077141
              0.307090366
MntFishProducts
                   0.573574015
                               1.0000000000
                                             0.583866955
                                                        0.42714204
-0.1432410856
              0.299687510
MntSweetProducts
                   0.535136109
                               0.5838669550
                                             1.000000000
                                                        0.35744975
-0.1214319277
              0.333937217
MntGoldProds
                   0.359446281
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                                             0.357449747
                                                        1.00000000
0.0519048294
             0.407065666
```

	1307714 -	0.1432410856	-0.121431928	0.05190483
1.0000000000 0.241440318 NumWebPurchases 0.307	7090366	0.2996875104	0.333937217	0.40706567
0.2414403183 1.000000000				
NumCatalogPurchases 0.734 -0.0121184280 0.386867640		0.5327567837	0.495135818	0.44242825
		0.4577450432	0.455225164	0.38918017
0.0661065938	2494417	0.4464232918	-0.422370804	-0.24769056
0.3460483800 -0.051226263	9484417 -	0.4464232918	-0.422370804	-0.24769056
		0.0002189921	0.001780434	0.12495786
-0.0231350800 0.042957829 AcceptedCmp4 0.093		0.0161053845	0.029313012	0.02401509
0.0160765205 0.162932258	1010130	0.0101033013	0.023313012	0.02 101303
		0.1962774512	0.259229874	0.18139738
-0.1842529426 0.141188893 AcceptedCmp1 0.313		0.2616081098	0.245101963	0.17013156
-0.1273738919				
AcceptedCmp2 0.043 -0.0379811505 0.034828599		0.0023448970	0.010188062	0.05073361
		0.0212202304	-0.022641200	-0.03113346
0.0004972467 -0.016641779	7746440	0 4004454000	0.446470272	0.14022164
Response 0.237 0.0034510733 0.151431233	7746418	0.1081451099	0.116170373	0.14033164
NumCatalo			ses NumWebVisit	sMonth
AcceptedCmp3 AcceptedCmp4 Accep	•		620 0 007	702020
ID -0 0.0358896940 -0.023933266 -0	0.002274242 0070643232		638 -0.007	793839 -
	.0070043232 0.121763972		218 0.123	903937
0.0617838002 -0.066108524 0	.0105748401	-0.009610507		
	0.589162442		403 -0.553	088012 -
	.3359432660 0.504500622		007 0 117	476941
0.0160660223 -0.162025971 -0			0.141	+105+1
	0.112692198		244 0.131	240022 -
0.0425215424 0.038375728 -0			266 0 010	FC2C42
Recency 0.0322572663 0.017566259 -0	0.024081408 0.004819997		200 -0.018	563643 -
	0.634752741		079 -0.321	977901
	.4735504474			
	0.486263071 .2128710748		315 -0.418	728932
	. 21287 10748 0. 734126598		453 -0.539	484417
	.3768671185			
	0.532756784		432 -0.446	423292 -
	.1962774512		626 0 422	270004
	0.495135818 .2592298738		636 -0.422	370804
	0.442428252		722 -0.247	690557
	.1813973755			
	0.012118428		938 0.346	048380 -
0.0231350800 0.016076520 -0 NumWebPurchases	.1842329426 0.386867640		827 -0.051	226263
	.1411888909		J. J	
_	1.000000000		511 -0.522	003774
	.3224705753 0.517840451		000 0 422	398257 -
0.0689125892 0.178020190 0			-W.432	J902J1 -

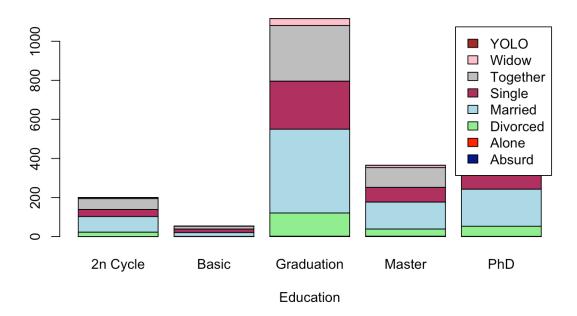
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AcceptedCmp3	0.104345099 -0.0689125892	0.061307235
1.0000000000 -0.0796	658582 0.0802476149 0.095682869	
AcceptedCmp4	0.140181992	-0.028665890 -
0.0796585824 1.0000	000000 0.3113144998 0.242781770	
AcceptedCmp5	0.322470575	-0.277883101
0.0802476149 0.3113	314500 1.0000000000 0.407877928	
AcceptedCmp1	0.309025718 0.1787428896	-0.194773181
0.0956828688 0.2427	781770 0.4078779280 1.0000000000	
AcceptedCmp2	0.099915281 0.0852707767	-0.007361665
0.0717021724 0.2950	049565 0.2221208209 0.176637073	
Complain	-0.020839191 -0.0169407070	0.019785006
0.0081241135 -0.0276	651942 -0.0095763509 -0.025593647	
Response	0.219913612	-0.002208954
0.2540048632 0.1802	205293 0.3233738479 0.297344741	
	AcceptedCmp2 Complain Response	
ID	-0.014993538	
Year_Birth	-0.006716956 -0.0304072467 0.023692120	
Income	0.087544774 -0.0272245123 0.133046664	
Kidhome	-0.081867930 0.0409779490 -0.077908722	
Teenhome	-0.015520861 0.0033069800 -0.153901199	
Recency	-0.001400382 0.0136366703 -0.199766369	
MntWines	0.206184929 -0.0394702112 0.246298957	
MntFruits	-0.009980152 -0.0053240986 0.122442679	
MntMeatProducts	0.043521399 -0.0237819441 0.237746418	
MntFishProducts	0.002344897 -0.0212202304 0.108145110	
MntSweetProducts	0.010188062 -0.0226412002 0.116170373	
MntGoldProds	0.050733610 -0.0311334593 0.140331644	
NumDealsPurchases	-0.037981151 0.0004972467 0.003451073	
NumWebPurchases	0.034828595 -0.0166417790 0.151431233	
NumCatalogPurchases	0.099915281 -0.0208391906 0.219913612	
NumStorePurchases	0.085270777 -0.0169407070 0.036241129	
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AcceptedCmp5	0.222120821 -0.0095763509 0.323373848	
AcceptedCmp1	0.176637073 -0.0255936473 0.297344741	
AcceptedCmp2	1.000000000 -0.0114585043 0.169293709	
Complain	-0.011458504 1.0000000000 -0.002029294	
Response	0.169293709 -0.0020292937 1.0000000000	

This is useful in helping us see the strength of the correlation of a number of different variables and seeing which are more strongly correlated to further explore whether there is a meaningful relationship.

9) Multivariate graphical EDA: bar plots for categorical variables

Stacked Bar Plot for two categorical variables

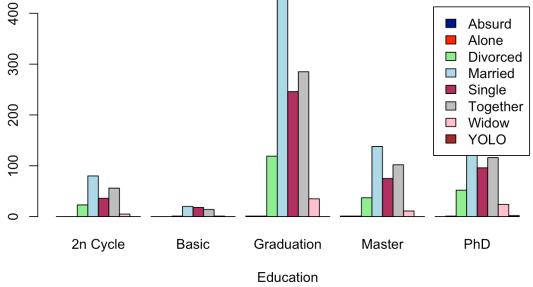
Education and Marital Status



Grouped Bar Plot for two categorical variables



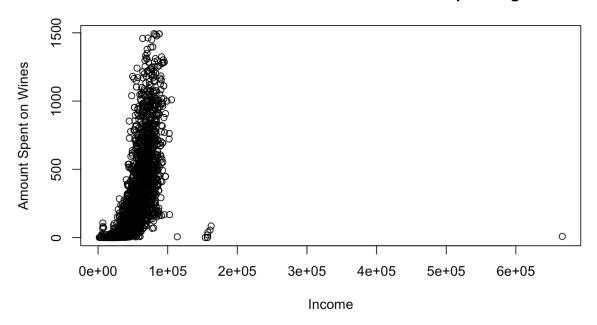
Education and Marital Status



Multivariate graphical EDA: quantitative variables

#scatter plot of two quantitative variables

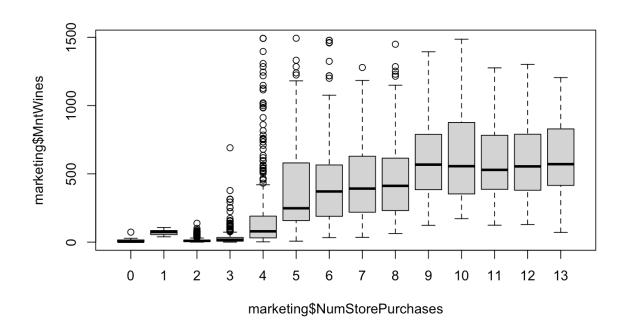
Correlation between income and Wine Spending

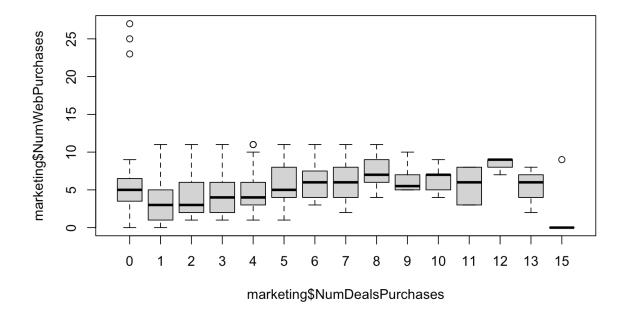


People who purchase in stores are on average more likely to spend more on wine.

Box plot by group - two quantitative variables

boxplot(marketing\$MntWines ~ marketing\$NumStorePurchases)





Interesting findings

- Looking at the correlation matrix, I found that none of the variables are strongly correlated. By looking through the results, it seems that the strongest correlation is between the amount spent on wine and number of store purchases at 0.6400119079. This is a positive correlation.
- #Both the graph and correlation tab show a moderate positive relationship between income amount and amount spent on wines (cor = 0.5786498)
- In the Multivariate Graphical EDA we can see how scattered the data is. The stacked and group bar chart makes it easier to understand visually the relationship between the two variables i.e. Education and Marital Status.
- The cross-tabulation method in the Multivariate Non-Graphical EDA makes the data very streamlined and easy to understand. We can easily comprehend the relationship between the two variables. The statistical computation of co-variance and correlation shows the numerical measures of quantitative variables which is a more accurate depiction of a relationship as opposed to looking at a graph alone.
- The correlation matrix is incredibly useful in finding out the correlations among variables and guiding further analysis what variables to explore. By indicating a

potential correlation between two variables, we can explore this further for our research purposes.