#### **Project On Visual Analytics**

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#### 30 November 2016

#### hdd <- read.csv("hd.csv", header = TRUE)

#### summary(hdd)

```
02
##
                            01
                                                               Q3
            Oname
##
    Abdelhamid: 1
                     Min.
                             :22.00
                                       Min.
                                              : 5.00
                                                        Min.
                                                                :0.000
##
    Alex
               : 1
                     1st Qu.:24.50
                                       1st Qu.: 8.00
                                                        1st Qu.:1.000
                     Median :26.00
##
    Ayat
               : 1
                                       Median: 9.00
                                                        Median :1.000
##
    Bobby
               : 1
                     Mean
                             :28.65
                                       Mean
                                              :10.54
                                                        Mean
                                                                :1.587
##
    Chris
               : 1
                     3rd Qu.:29.00
                                       3rd Qu.:11.00
                                                        3rd Qu.:2.000
##
    David
                             :58.00
                                              :41.00
                                                        Max.
                                                                :7.000
               : 1
                     Max.
                                       Max.
##
    (Other)
               :17
##
          04
                             Q5
                                             06
                                                                07
##
            : 150.0
                      Min.
                                  0
                                       Min.
                                                 1.00
                                                                 :10.00
    Min.
                              :
                                                         Min.
##
    1st Qu.: 410.5
                      1st Qu.: 115
                                       1st Qu.: 50.00
                                                         1st Qu.:40.00
    Median :2694.0
##
                      Median: 230
                                       Median : 70.00
                                                         Median:50.00
            :3963.3
##
    Mean
                      Mean
                              :1147
                                       Mean
                                              : 60.52
                                                         Mean
                                                                 :55.04
##
    3rd Qu.:7050.0
                      3rd Qu.:2300
                                       3rd Qu.: 80.00
                                                         3rd Qu.:77.50
            :9304.0
##
    Max.
                      Max.
                              :2400
                                       Max.
                                              :100.00
                                                         Max.
                                                                 :92.00
##
##
          Q8
                             Q9
                                             Q10
                                                                Q11
##
    Min.
            : 1.00
                      Min.
                              :
                                1.0
                                        Min.
                                                  10.0
                                                          Min.
                                                                  : 0.00
##
    1st Qu.: 55.00
                      1st Qu.: 22.5
                                        1st Qu.:
                                                   90.0
                                                          1st Qu.: 16.50
##
    Median : 72.00
                      Median: 40.0
                                        Median : 300.0
                                                          Median : 30.00
           : 63.35
                                                                  : 51.74
##
    Mean
                      Mean
                              : 48.0
                                        Mean
                                                : 554.3
                                                          Mean
##
    3rd Qu.: 85.00
                       3rd Qu.: 71.5
                                        3rd Qu.: 525.0
                                                          3rd Qu.: 85.00
##
    Max.
            :100.00
                      Max.
                              :100.0
                                        Max.
                                               :3650.0
                                                          Max.
                                                                  :213.00
##
##
         Q12
                            Q13
                                              Q14
                                                                Q15
##
    Min.
            : 20.0
                      Min.
                                  0.0
                                         Min.
                                                : 0.00
                                                          Min.
                                                                  : 69.00
                                         1st Qu.:41.50
##
    1st Qu.: 250.0
                       1st Qu.: 142.0
                                                          1st Qu.: 80.00
    Median : 500.0
                      Median : 295.0
                                         Median:60.00
                                                          Median : 90.00
##
##
    Mean
            : 931.9
                      Mean
                              : 344.9
                                         Mean
                                                 :55.39
                                                          Mean
                                                                  : 89.22
##
    3rd Qu.:1173.0
                       3rd Qu.: 468.0
                                         3rd Qu.:76.50
                                                          3rd Qu.:100.00
##
    Max.
            :3000.0
                      Max.
                              :1150.0
                                         Max.
                                                 :99.00
                                                          Max.
                                                                  :100.00
##
##
         016
                            Q17
                                              018
                                                                Q19
##
    Min.
            : 50.00
                      Min.
                              : 1.000
                                         Min.
                                                : 2.00
                                                          Min.
                                                                  : 2.000
    1st Qu.: 64.50
##
                      1st Qu.: 3.500
                                         1st Qu.: 9.00
                                                          1st Qu.: 3.000
##
    Median : 83.00
                      Median : 5.000
                                         Median :16.00
                                                          Median : 5.000
##
    Mean
            : 80.48
                      Mean
                              : 6.478
                                         Mean
                                                 :16.52
                                                          Mean
                                                                  : 6.913
##
    3rd Qu.:100.00
                      3rd Qu.:10.000
                                         3rd Qu.:21.00
                                                          3rd Qu.: 9.000
##
    Max.
            :100.00
                      Max.
                              :15.000
                                         Max.
                                                 :49.00
                                                          Max.
                                                                  :22.000
##
```

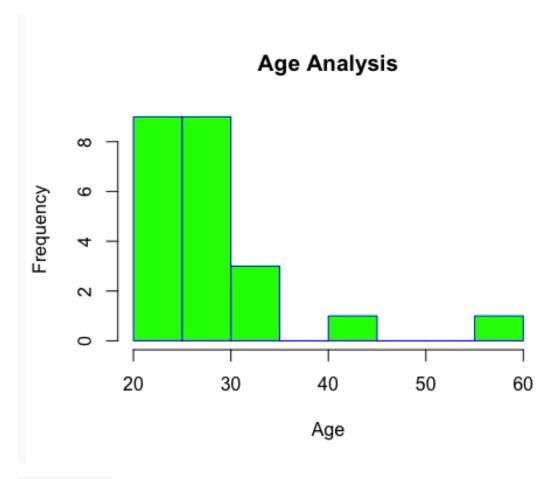
```
Q21
                                                              Q23
##
         Q20
                                            Q22
##
    Min.
           :32.00
                     Min.
                            : 1.00
                                       Min.
                                              : 0.000
                                                        Min.
                                                                   0.00
##
    1st Qu.:69.00
                     1st Qu.: 30.00
                                       1st Qu.: 1.000
                                                        1st Qu.:
                                                                   0.00
##
    Median :72.00
                     Median : 71.00
                                       Median : 3.500
                                                        Median :
                                                                   2.00
                                                                : 27.39
##
    Mean
           :70.83
                     Mean
                            : 58.87
                                       Mean
                                              : 5.748
                                                        Mean
##
    3rd Qu.:75.50
                     3rd Qu.: 80.00
                                       3rd Qu.: 9.000
                                                        3rd Qu.: 10.50
    Max.
           :89.00
                     Max.
                            :100.00
                                      Max.
                                              :34.000
##
                                                        Max.
                                                                :427.00
##
##
         Q24
                            Q25
                                             Q26
                                                               Q27
##
    Min.
              0.000
                       Min.
                              : 2.00
                                       Min.
                                               : 0.000
                                                         Min.
##
    1st Qu.:
              1.000
                                        1st Qu.: 2.000
                                                         1st Qu.: 10052
                       1st Qu.:10.00
##
    Median :
              3.000
                       Median :14.00
                                       Median : 3.000
                                                         Median : 45000
##
              9.739
                              :18.35
                                               : 4.609
                                                         Mean
                                                                 : 75014
    Mean
                      Mean
                                       Mean
##
    3rd Qu.: 7.500
                       3rd Qu.:25.00
                                        3rd Qu.: 5.500
                                                         3rd Qu.:122356
##
    Max.
           :100.000
                       Max.
                              :47.00
                                       Max.
                                               :20.000
                                                         Max.
                                                                 :245000
##
```

#### hist(hdd\$Q1)

#### Histograms

Histograms are the most commonly used graphs to show frequency distributions.

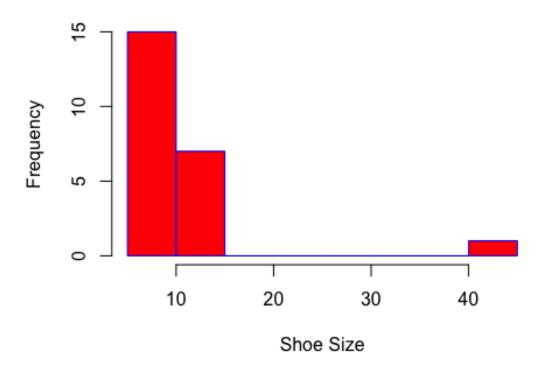
From the histograms below, it can be analysed that most number of people are in the age group 20- 30 years.



### hist(hdd\$Q2)

Here, histogram suggest most of the people in analysis are in age between 20-30.

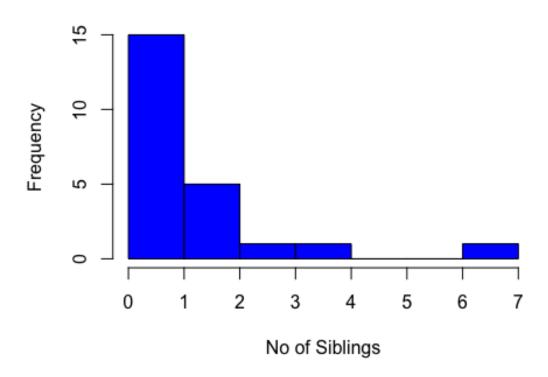
## Shoe size Analysis



### hist(hdd\$Q3)

This Histogram shows that most number of people have their shoe sizes between 0- 10.

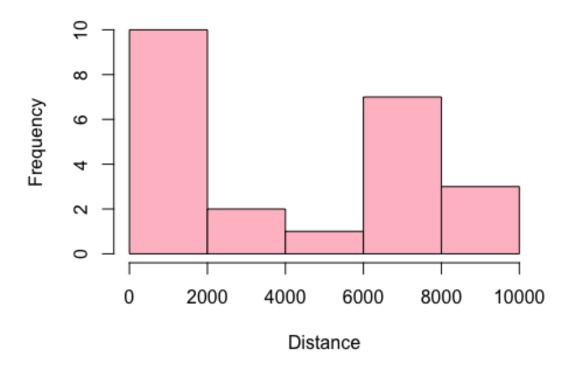
# **Sibling Analysis**



hist(hdd\$Q4)

Above histogram shows that most number of people have only one sibling.

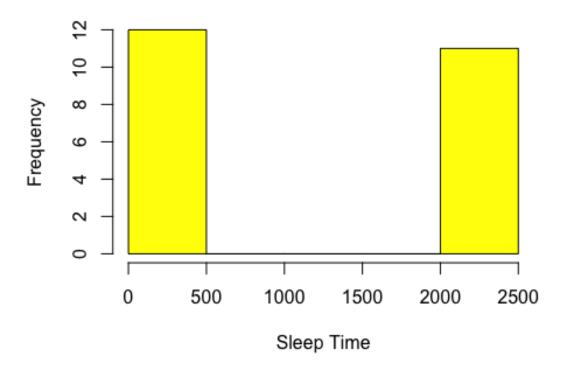
### **Distance from Datrmouth**



### hist(hdd\$Q5)

This histogram shows majority have distance greater than 5000 from their birthplace.

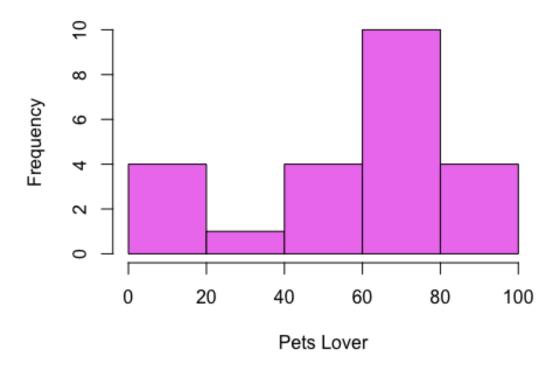
### Sleep Time Analysis



### hist(hdd\$Q6)

With the above histogram it can be analysed that the most people sleep between the time 12:00 am to 5:00 am and 8:00 pm to 12:00 am.

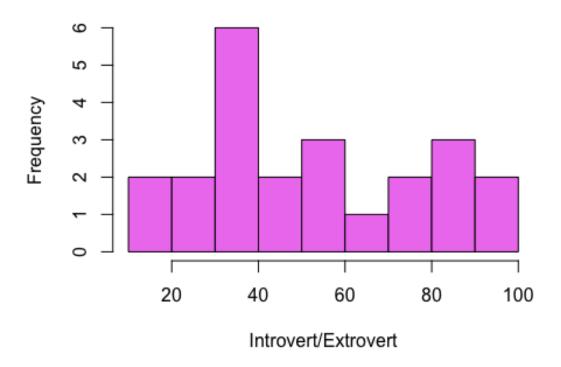
## **Pet Lover Analysis**



hist(hdd\$Q7)

From this histogram it can be inferred that majority of the pet lovers are in the range 60 and 80

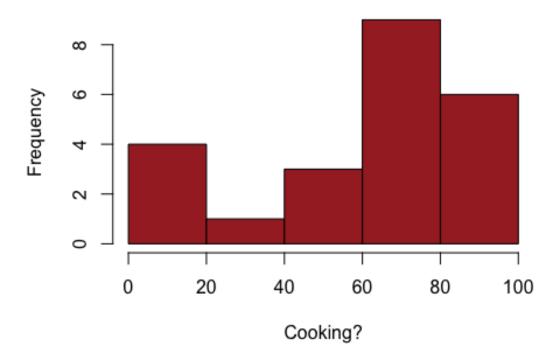
### Introvert/Extrovert Analysis



#### hist(hdd\$Q8)

From the above histogram it can be analysed that most number of people are more introverts than extroverts. The most number of introverts are in the range 30-40.

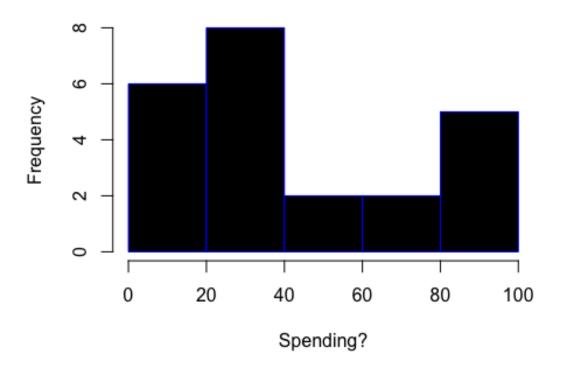
# **Cooking Analysis**



### hist(hdd\$Q9)

This histogram says that majority of them like to cook between 60 and 100.

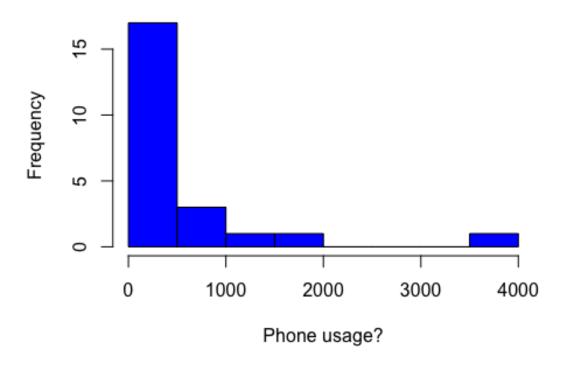
### **Money Spending Analysis**



#### hist(hdd\$Q10)

From the above histogram it can be analysed that the most number of people are money savers in the range 20-40 and 0-20, but there are also considerable amount of money spenders in the range 80-10, though it is less than jthe number of money savers.

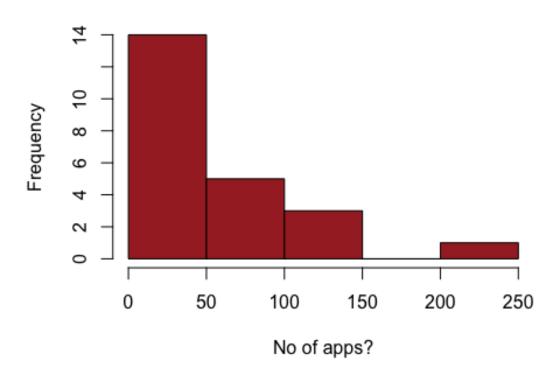
## Phone usage Analysis



#### hist(hdd\$Q11)

From the above histogram it can be analysed that most number of people spend 0-500 minutes talking on phone.

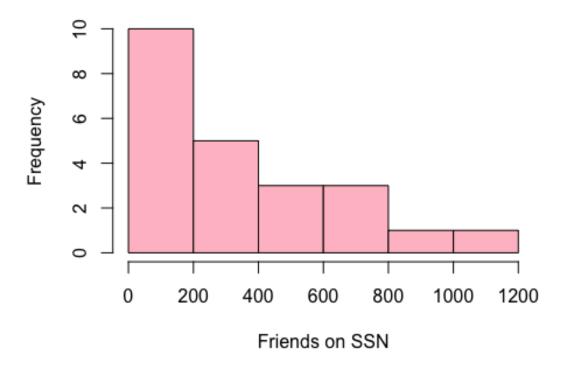
## **App Analysis**



### hist(hdd\$Q13)

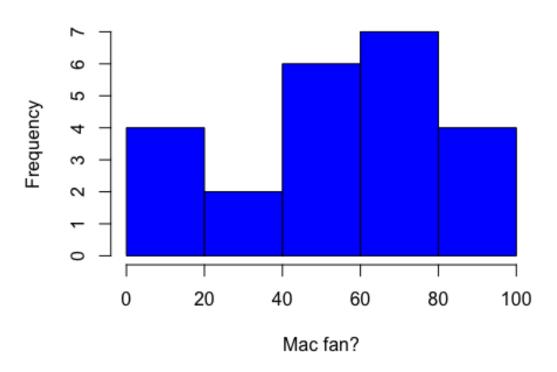
This Histogram shows that on an average there will be around 0  $\,$  to 50 application installed on the phone.

## **Social Network Analysis**



This shows that on an average there will 0 to 400 friends connected between each other on social networks.

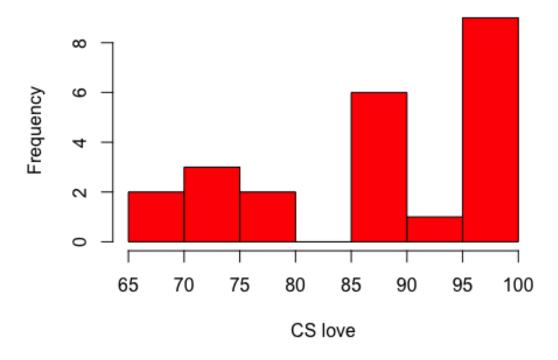
# **Mac Fan Analysis**



hist(hdd\$Q15)

This histogram shows that both Mac and PC fans are almost equal.

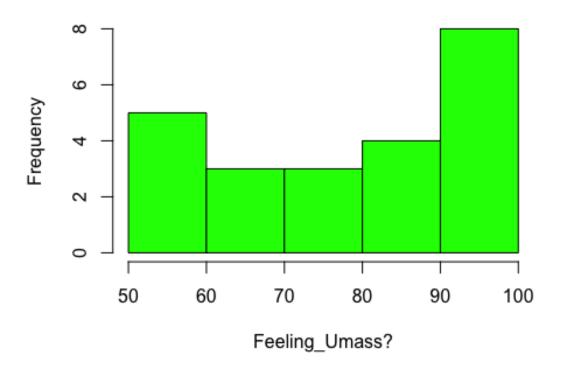
# **CS love Analysis**



hist(hdd\$Q16)

This Histogram shows that majority of them love computer science.

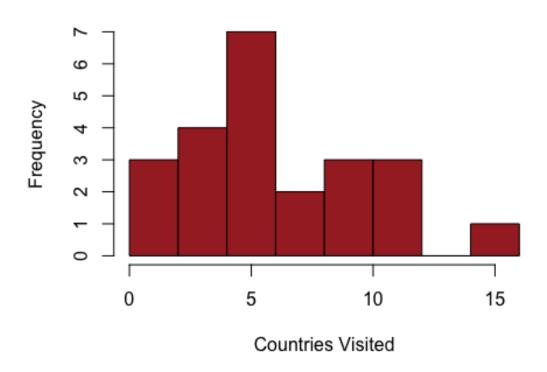
## Feeling\_Umass Analysis



### hist(hdd\$Q17)

the above histogram tells that most of the students love being at Umass in the range 90-100.

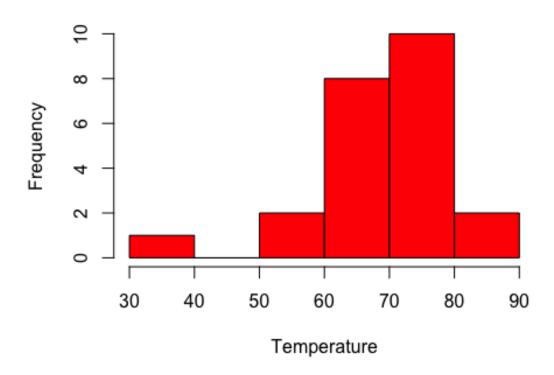
# **Visiting Analysis**



### hist(hdd\$Q20)

This Histogram shows that a minimum of 3 countries visited by everyone.

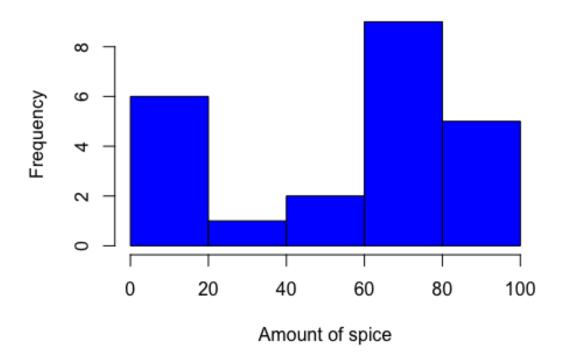
## **Preferred Temp Analysis**



### hist(hdd\$Q21)

From the Temperature analysis, it is seen most of the people like to be in the temperature range of 70F to 80F.

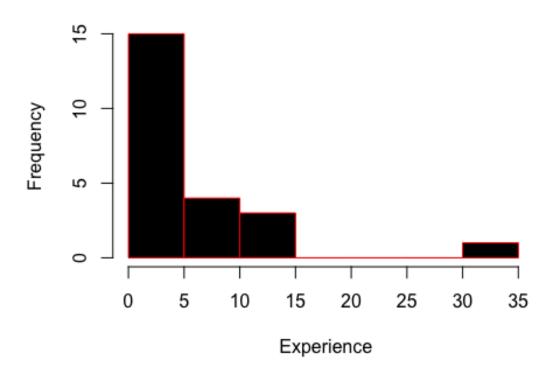
# Spicy Analysis



hist(hdd\$Q22)

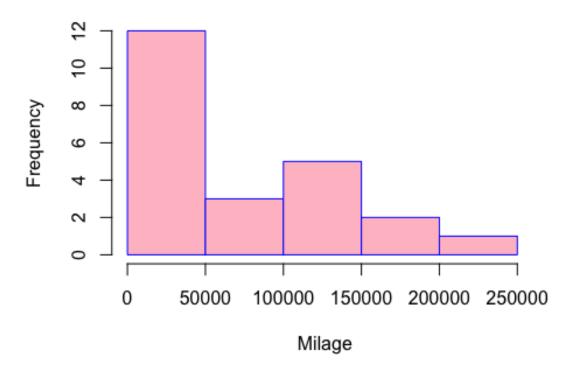
Most of the people like moderate Spicy food ranging from 60-80.

# Job Experience Analysis



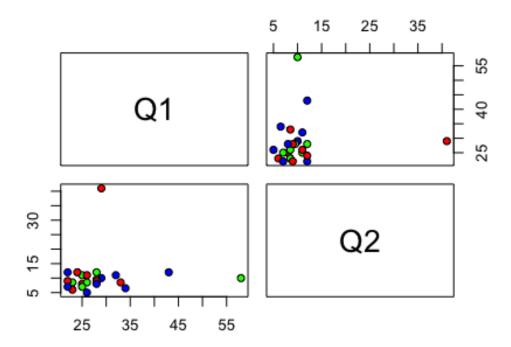
hist(hdd\$Q27)

# Milage Analysis



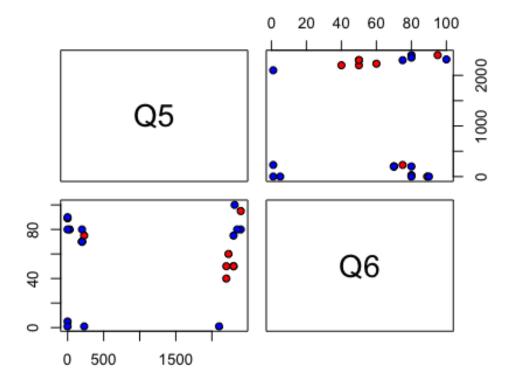
pairs(~Q1+Q2, data = hdd, main = "Data comparison", pch= 21 , bg = c("blue",
"red", "green"))

### Data comparison



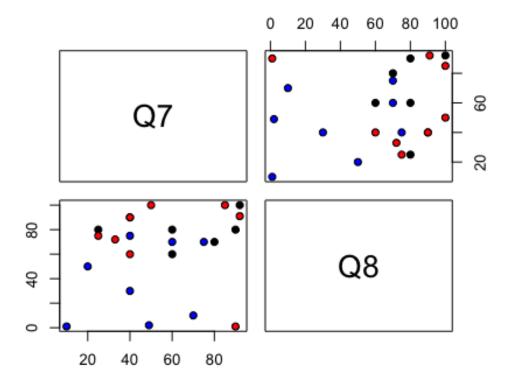
Here Q1 represents Age and Q2 Shoe size respectively. Note that there is more probability of small shoe size for small age as depicted in cluster of scattered plot.

pairs(~Q5+Q6, data = hdd, pch= 21, bg = c("blue", "red", "blue"))

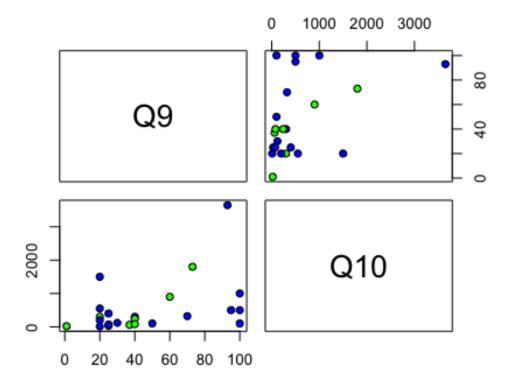


Q5 represents time to sleep and Q6 represents pet lover on scale. As we see there is hardly any cluster depicts there is very less probability of correlation between these two parameters in analysis.

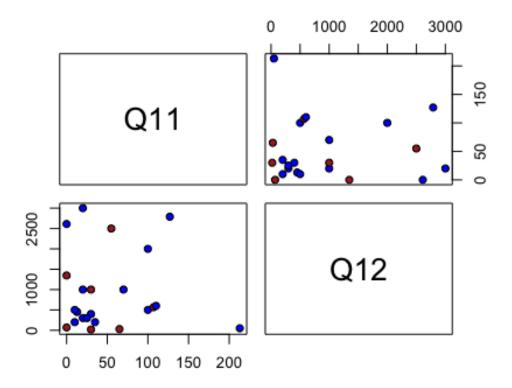
pairs(~Q7+Q8, data = hdd, pch= 21, bg = c("blue", "red", "black"))



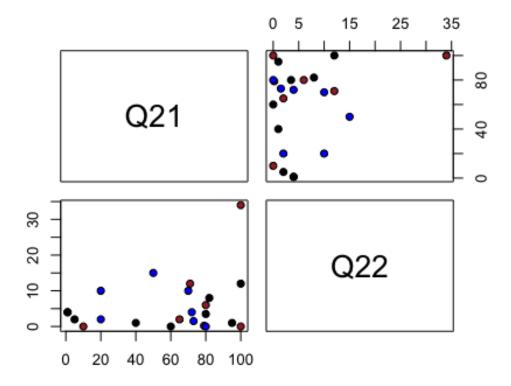
 $pairs(\sim Q9+Q10, data = hdd, pch= 21, bg = c("blue", "blue", "green"))$ 



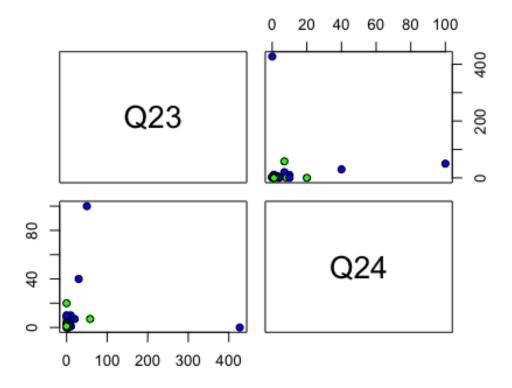
 $pairs(\sim Q11+Q12, data = hdd, pch= 21, bg = c("blue", "blue", "brown"))$ 



pairs(~Q21+Q22, data = hdd, pch= 21, bg = c("blue", "black", "brown"))

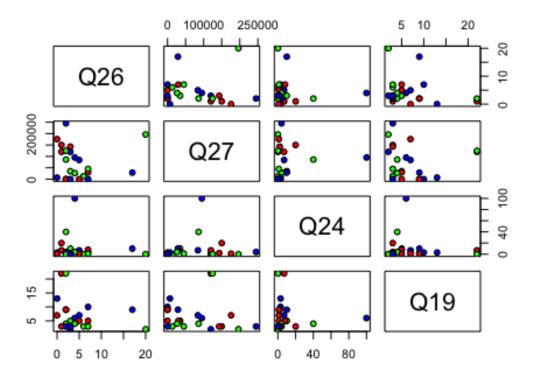


 $pairs(\sim Q23+Q24, data = hdd, pch= 21, bg = c("blue", "green", "blue"))$ 



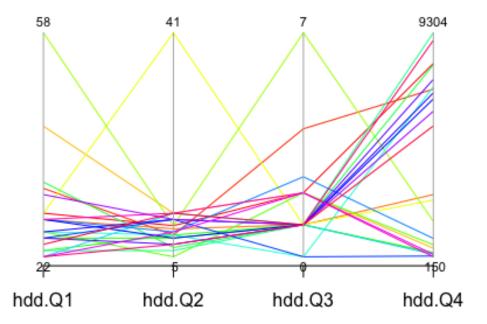
pairs( $\sim$ Q26+Q27+Q24+Q19, data = hdd, main= "Scatterplot",pch= 21, bg = c("blue", "red", "green"))

### Scatterplot



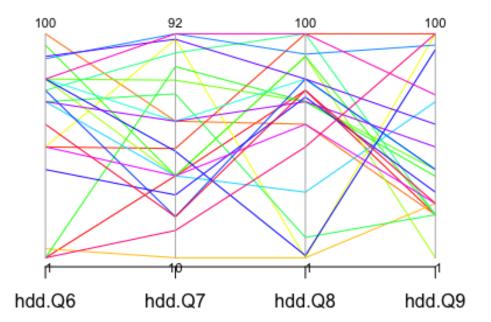
```
library(MASS)
pair1 <- data.frame(hdd$Q1, hdd$Q2, hdd$Q3, hdd$Q4)

parcoord(pair1, var.label = TRUE, col = rainbow(length(pair1[,1])))
#c("red", "green", "blue"))</pre>
```

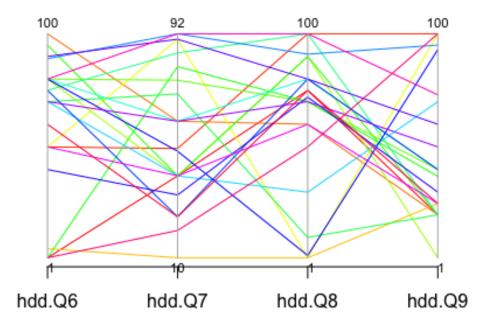


t<-data.frame(hdd\$Q6, hdd\$Q7, hdd\$Q8, hdd\$Q9)
#colnames("Pet Lover", "Introvert/Extrovert", "Cook", " Money Saver")
#parcoord(t, col=rainbow(length(t[,1])), var.label=TRUE)</pre>

parcoord(t, var.label = TRUE, col = rainbow(length(t[,1])))



```
#c("red", "green", "blue") )
t1<-data.frame(hdd$Q20, hdd$Q22, hdd$Q23, hdd$Q27)
parcoord(t, var.label = TRUE, col = rainbow(length(t1[,1])))</pre>
```



```
row.names(hdd) <- hdd[,1]
hdd1 <- hdd[,-1]
normalize <- scale(hdd1, scale=TRUE)
head(normalize)</pre>
```

```
##
                   Q1
                               Q2
                                         Q3
                                                     Q4
                                                                Q5
## Alex
          0.04349035 -0.07824244
                                 0.2846389 1.1776196 0.8548309 -1.9049899
## Ayat
          0.54362936 -0.29419159
                                 1.6628906 0.8750532 0.9445462 -0.3367477
## Bobby
         -0.08154440 -0.15022549 -0.4044869 -0.3657570 1.0477188 1.2634995
## Chris
          1.79397690 0.20968975 0.2846389 -0.9979766 -1.0291906 -1.7769701
## Elias
           0.04349035
                      4.38470661 -0.4044869 -0.4312554 1.0342615 -0.3367477
## Harold 3.66949821 -0.07824244
                                 3.7302681 -0.6810023 -1.0022761 0.6234006
##
                                                  Q10
                                                             Q11
                  Q7
                             Q8
                                        Q9
                                                                         Q12
## Alex
          -0.5935306
                     0.3586387 -0.8863245 -0.6603888 -0.5991015 0.07058334
## Ayat
          -0.1989871 1.1281059 1.6460312 0.5406538
                                                      0.9109626 -0.44741819
## Bobby
          0.1955563 -0.1030417 -0.8863245 -0.3085682 -0.4103435 -0.94469965
## Chris
         -1.7771609 -1.9189845 -0.7280523 -0.6361253 0.3446885
                                                                 0.07058334
          1.3791866 -1.9189845 1.6460312 -0.5512031 -0.7878595 -0.75821910
## Elias
## Harold -0.5935306
                     0.8203190 -1.4877590 -0.6482571
                                                      0.2503095 -0.93433962
##
                 Q13
                            Q14
                                      Q15
                                                  Q16
                                                             Q17
## Alex
          1.1948527
                    1.1096729 0.97477565 -1.6542721 -0.3784090
                                                                 0.03974396
## Ayat
          -0.6558742 -1.7439709 0.97477565
                                           1.0595837 -1.4023392 -1.20677100
         -0.2016049 0.4684046 0.97477565
## Bobby
                                           1.0595837 0.1335561
                                                                 0.70455193
```

```
## Chris -1.1269683 1.3982436 0.07074985
                                           0.5168125
                                                      0.1335561
                                                                 2.61587487
## Elias -0.4876263 -1.7439709 0.97477565
                                           1.0595837
                                                      0.9015038 -0.54196303
## Harold -1.1572530 -0.1728636 0.97477565
                                           1.0595837
                                                      0.9015038
                                                                 2.69897587
##
                019
                            020
                                      Q21
                                                 022
                                                             Q23
                                                                         Q24
          0.5536930 0.10685384 -1.724062 -0.2286354 -0.25283162 -0.31232993
## Alex
## Ayat
          0.3743277 -0.98542982
                                 1.225367
                                           0.8178551 -0.28670615 -0.35867566
## Bobby
         -0.3431337 -3.53409167
                                 1.225367 -0.7518807 -0.19637408
                                                                  0.01209019
## Chris
                                           1.2102891
          -0.1637683 0.37992475 -0.264244
                                                      0.25528630
                                                                  4.18320598
## Elias
         -0.7018643 -0.07519344 -1.724062 -0.2286354 -0.30928917
                                                                  0.47554750
## Harold -0.5224990 0.83504294 1.225367
                                           3.6957042 0.02945611 1.40246212
##
                Q25
                           Q26
                                      Q27
## Alex
          -0.2653021 0.4902266 -1.0297044
          -1.0577629 -0.5347926 -1.0297044
## Ayat
## Bobby
          0.9233891 -0.3297888 -0.5492659
## Chris
          0.9233891 -0.1247850 0.2743429
## Elias
         -1.0577629 -0.7397965 1.0293176
## Harold -1.2955012 -0.5347926 0.1508016
```

Normalize the data columns (R scale), computes a distance matrix (R dist) which is the opposite of a similarity matrix, and generate an Multi-Dimensional Scaling (MDS) 2D plot (R cmdscale). A weighting scheme is implemented to allow place more emphasis on some dimensions, and see how that affects MDS plot. Below are list of insights gained from your MDS investigations about the patterns of relationships among the participants in this survey.

#### Below is normalized data columns.

Also we can see here are the insights that we can draw from the normalized data that represents the values as distance between two persons.

```
aa <- dist(normalize, method = "euclidean", diag = FALSE, upper = FALSE)
print(aa)</pre>
```

##		Alex	Ayat	Bobby	Chris	Elias	Harold
##	Ayat	7.081259					
##	Bobby	7.132254	6.672798				
##	Chris	8.099717	9.591771	8.557536			
##	Elias	8.404103	8.161979	8.336198	9.528454		
##	Harold	9.807577	8.585894	9.513487	7.591897	10.856015	
##	Jessica	5.423777	6.761043	5.591036	8.347032	8.089530	10.009185
##	Lauren	5.458503	6.100273	5.175505	7.929764	7.983310	8.599683
##	Luke	6.500680	6.982805	6.225259	8.027256	8.557779	10.061631
##	Manjula	5.783260	6.555485	6.071308	7.557627	8.433576	8.759948
##	Manpreet	5.998123	5.709198	5.921135	9.668146	8.700588	9.779337
##	David	4.229962	5.969088	5.796540	8.545341	7.053541	9.698909
##	Michael	7.522507	7.663266	7.234314	8.295266	8.158642	9.824892
##	Nino	7.324890	6.696555	7.477909	8.939331	8.825268	9.384535
##	Nathan	6.093882	6.753545	6.601508	8.845222	7.724745	9.925909
##	Neda	8.406100	8.967689	9.038122	9.211299	10.186744	11.452956

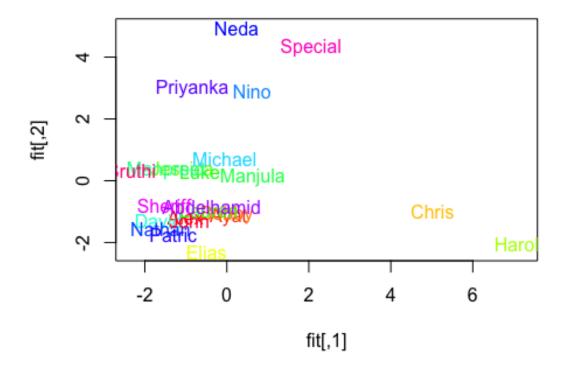
```
## Patric
               3.604155
                          5.973367
                                    6.333908
                                               8.128201
                                                         7.170609
                                                                    9.580970
## Priyanka
                                    8.795337 10.292246
               8.077307
                          9.190068
                                                         9.654203 10.782895
## Abdelhamid
               5.999680
                                               8.298486
                                                         6.750905
                          6.471333
                                    6.435202
                                                                    9.017079
## Sheriff
               4.992051
                          7.426456
                                    6.480438
                                               8.576085
                                                         8.208652 10.050842
## Special
               8.887918
                          8.916798
                                    8.627911
                                               9.669321
                                                         9.932237 10.217758
## Sruthi
               6.814386
                          5.995489
                                    7.967705
                                               9.290619
                                                         8.598325 11.250092
## John
               5.684607
                          6.418547
                                    6.238563
                                               8.349653
                                                         6.631934
                                                                    9.287143
##
                Jessica
                            Lauren
                                         Luke
                                                Manjula
                                                         Manpreet
                                                                       David
## Ayat
## Bobby
## Chris
## Elias
## Harold
## Jessica
## Lauren
               4.329426
## Luke
                          5.745993
               5.826314
## Manjula
               6.197691
                          5.504934
                                    6.063826
## Manpreet
               5.750066
                          4.681386
                                    6.449141
                                               5.367192
## David
               4.300300
                          3.584483
                                    6.293567
                                               5.279875
                                                         4.388672
## Michael
               7.435158
                          6.273908
                                    5.240318
                                               6.424638
                                                         7.663434
                                                                    6.778874
## Nino
               5.850056
                          6.334607
                                    6.104530
                                               6.917877
                                                         6.879508
                                                                    6.775898
## Nathan
               5.782968
                          3.747085
                                    5.320529
                                               6.672849
                                                         6.467621
                                                                    4.794061
## Neda
               7.744923
                          8.170769
                                               7.635958
                                    8.133352
                                                         8.002346
                                                                    8.056700
## Patric
               5.231969
                          4.372397
                                    5.665883
                                               5.696587
                                                         5.704007
                                                                    3.069190
## Priyanka
               7.388739
                          7.144261
                                    8.166806
                                               6.799575
                                                         6.644834
                                                                    7.419318
## Abdelhamid
               5.188847
                          5.440832
                                    6.815207
                                               6.004772
                                                         5.234062
                                                                    4.684327
## Sheriff
               5.187242
                                               6.753121
                                                         6.257178
                          4.362625
                                    5.712199
                                                                    5.170504
## Special
                                               8.638172
                                                                    8.512909
               7.438358
                          7.925571
                                    8.433107
                                                         8.217954
## Sruthi
               6.391592
                          6.756158
                                    6.112619
                                               7.222264
                                                         6.140584
                                                                    6.178490
                          4.522847
## John
               5.816082
                                    6.270725
                                               6.516247
                                                         6.052672
                                                                    4.394771
##
                Michael
                              Nino
                                       Nathan
                                                   Neda
                                                            Patric
                                                                    Priyanka
## Ayat
## Bobby
## Chris
## Elias
## Harold
## Jessica
## Lauren
## Luke
## Manjula
## Manpreet
## David
## Michael
## Nino
               6.042761
## Nathan
               5.934213
                          6.828701
## Neda
               7.457429
                          7.096589
                                    8.870789
## Patric
               6.328146
                          6.786514
                                    4.172949
                                               8.018905
## Privanka
               7.572228
                          7.395270
                                    8.295173
                                               8.406801
                                                         8.650352
## Abdelhamid
               6.898763
                          6.690272
                                    6.377795
                                               8.800831
                                                         5.706180
                                                                    6.770119
## Sheriff
               5.238897
                          6.386962
                                    4.541168
                                                         4.971908
                                               8.626762
                                                                    7.374285
```

```
## Special
              9.150708 6.120952 8.869344 7.936528 8.515540 9.105634
## Sruthi
              7.643622 7.418543 6.501392 7.976100 6.131437 8.092368
## John
              5.797240 6.790495 4.328141 8.065627
                                                      3.454866 7.784032
##
             Abdelhamid
                          Sheriff
                                    Special
                                               Sruthi
## Ayat
## Bobby
## Chris
## Elias
## Harold
## Jessica
## Lauren
## Luke
## Manjula
## Manpreet
## David
## Michael
## Nino
## Nathan
## Neda
## Patric
## Priyanka
## Abdelhamid
## Sheriff
               5.549136
## Special
               8.178914 8.968400
## Sruthi
               6.615520 7.145691 9.592108
## John
               4.994213 4.943915 8.171835 6.593794
#as.dist(normalize, diag = FALSE, upper = FALSE)
```

**Multidimensional scaling (MDS)** is a means of visualizing the level of similarity of individual cases of a dataset. It refers to a set of related ordination techniques used in information visualization, in particular to display the information contained in a distance matrix. Here we can observe that Ayat and Alex have greater distance and low similarity while

**Shruti and Harold** have maximum difference in behaviour after normalization while **John and David** have the least.

```
fit <- cmdscale(aa, k=2)
#print(fit)
plot(fit,type="n")
text(fit[,1], fit[,2], labels(aa), col = rainbow(length(fit[,1])))</pre>
```



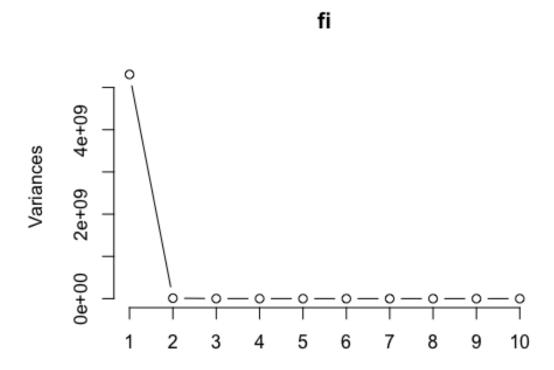
Principle Components Analysis (PCA) and biploting the components. This compare to the unweighted MDS using Euclidian distance metric.

As we see in deviation in principal component analysis suggest similar elements(person) to be across similar variance and the larger the distance, the more is the differences in behaviour. Below are the plots that suggests results associated.

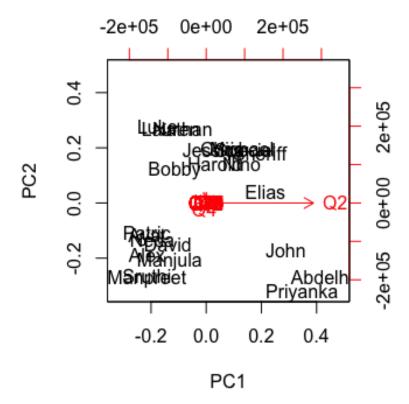
# fi <- prcomp(hdd1) summary(fi) # print variance accounted for</pre>

```
## Importance of components:
##
                                PC1
                                           PC2
                                                     PC3
                                                               PC4
                                                                          PC5
## Standard deviation
                          7.286e+04 3.354e+03 1259.5770 841.08615 620.43074
## Proportion of Variance 9.974e-01 2.110e-03
                                                  0.0003
                                                           0.00013
                                                                     0.00007
## Cumulative Proportion 9.974e-01 9.995e-01
                                                  0.9998
                                                           0.99991
                                                                     0.99999
##
                                PC6
                                       PC7
                                             PC8
                                                   PC9
                                                        PC10 PC11 PC12
                                                                        PC13
## Standard deviation
                          242.05782 79.37 39.98 39.07 32.73 25.2 23.4 16.04
## Proportion of Variance
                            0.00001
                                     0.00
                                           0.00
                                                  0.00
                                                        0.00
                                                              0.0
## Cumulative Proportion
                                     1.00
                            1.00000
                                           1.00
                                                  1.00
                                                        1.00
                                                              1.0
                                                                   1.0
                                                                        1.00
##
                           PC14 PC15 PC16 PC17 PC18 PC19 PC20 PC21
```

```
## Standard deviation 15.47 9.927 7.871 6.973 5.125 4.789 3.445 1.802 ## Proportion of Variance 0.00 0.000 0.000 0.000 0.000 0.000 0.000 0.000 0.000 ## Cumulative Proportion 1.00 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 1.000 ## Proportion of Variance 0.000 0.000e+00 ## Cumulative Proportion 1.000 1.000e+00 1.000 1.000e+00 1.000 1.000 1.000e+00 ## NULL plot(fi,type="lines") # scree plot
```



fi\$scores # the principal components
## NULL
biplot(fi)



All group members contributed equally to the assignment.