# MINI PROJECT

### venkat

#### 13 November 2018

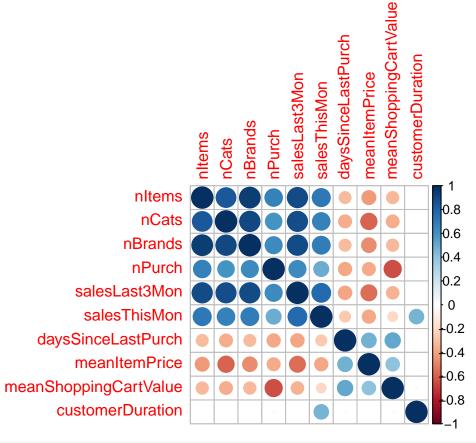
### R. Markdown

This is an R Markdown document. Markdown is a simple formatting syntax for authoring HTML, PDF, and MS Word documents. For more details on using R Markdown see http://rmarkdown.rstudio.com.

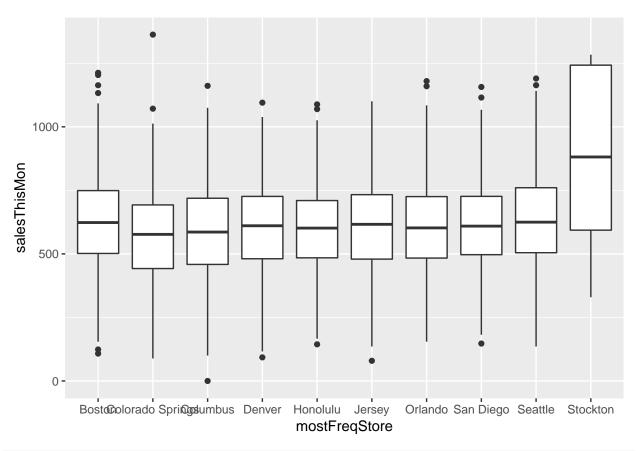
When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

```
#LOading data
salesData <- read.csv("C:/Users/venka/OneDrive/Desktop/MINI PROJECT/salesData.csv")</pre>
#install packages and load packages
library(readr)
library(dplyr)
##
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
##
       intersect, setdiff, setequal, union
##
library(corrplot)
## corrplot 0.84 loaded
library(ggplot2)
# Structure of dataset
str(salesData, give.attr = FALSE)
## 'data.frame':
                    5122 obs. of 14 variables:
## $ id
                           : int 1 2 3 4 5 6 7 8 9 10 ...
                           : int 1469 1463 262 293 108 216 174 122 204 308 ...
## $ nItems
## $ mostFreqStore
                           : Factor w/ 10 levels "Boston", "Colorado Springs",..: 10 10 2 2 2 1 3 9 6 9
                           : Factor w/ 10 levels "Alcohol", "Baby", ...: 1 1 10 3 4 1 8 10 3 1 ....
## $ mostFreqCat
## $ nCats
                           : int 72 73 55 50 32 41 36 31 41 52 ...
                           : Factor w/ 10 levels "Akar", "Alekto",...: 10 10 3 10 3 3 3 3 3 ...
## $ preferredBrand
## $ nBrands
                           : int 517 482 126 108 79 98 78 62 99 103 ...
## $ nPurch
                           : int 82 88 56 43 18 35 34 12 26 33 ...
## $ salesLast3Mon
                           : num 2742 2791 1530 1766 1180 ...
## $ salesThisMon
                           : num 1284 1243 683 730 553 ...
## $ daysSinceLastPurch
                          : int 1 1 1 1 12 2 2 4 14 1 ...
## $ meanItemPrice
                           : num 1.87 1.91 5.84 6.03 10.93 ...
## $ meanShoppingCartValue: num 33.4 31.7 27.3 41.1 65.6 ...
```

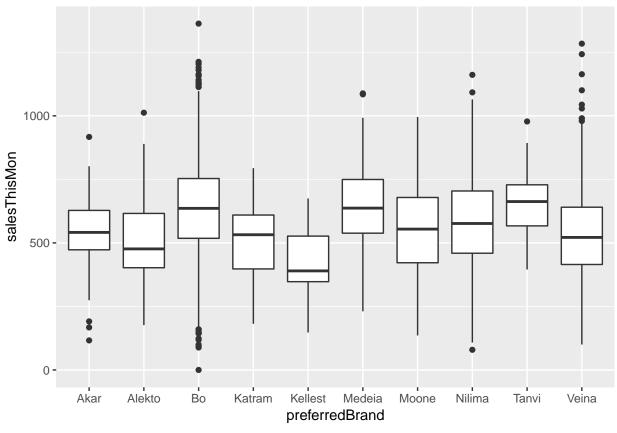
```
## $ customerDuration : int 821 657 548 596 603 673 612 517 709 480 ...
View(salesData)
# Visualization of correlations
salesData %>% select_if(is.numeric) %>%
    select(-id) %>%
    cor() %>% corrplot()
```



```
# Frequent stores
ggplot(salesData) +
  geom_boxplot(aes(x = mostFreqStore, y = salesThisMon))
```

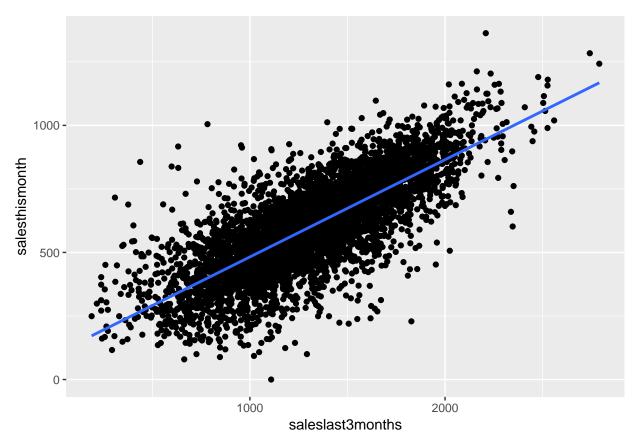


```
# Preferred brand
ggplot(salesData) +
  geom_boxplot(aes(x = preferredBrand, y = salesThisMon))
```



```
# Model specification using lm
salesSimpleModel <- lm(salesThisMon ~ salesLast3Mon,</pre>
                       data = salesData)
# Looking at model summary
summary(salesSimpleModel)
##
## Call:
## lm(formula = salesThisMon ~ salesLast3Mon, data = salesData)
## Residuals:
##
       Min
                1Q Median
                                3Q
  -570.18 -68.26
                      3.21
                             72.98 605.58
##
##
## Coefficients:
##
                  Estimate Std. Error t value Pr(>|t|)
                 99.690501
## (Intercept)
                             6.083886
                                        16.39
                                                <2e-16 ***
## salesLast3Mon 0.382696
                             0.004429
                                        86.40
                                                <2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 117.5 on 5120 degrees of freedom
## Multiple R-squared: 0.5932, Adjusted R-squared: 0.5931
## F-statistic: 7465 on 1 and 5120 DF, p-value: < 2.2e-16
ggplot(salesData,aes(salesLast3Mon,salesThisMon))+
  geom_point()+
```

```
geom_smooth(method=lm,se=FALSE)+
xlab("saleslast3months")+
ylab("salesthismonth")
```



### **Including Plots**

You can also embed plots, for example:

```
##
      salesLast3Mon + salesThisMon + daysSinceLastPurch + meanItemPrice +
##
      meanShoppingCartValue + customerDuration, data = salesData)
##
## Residuals:
               1Q Median
                               3Q
                                      Max
  -322.95
           -50.81
                     0.74
                            50.87
##
                                   398.94
## Coefficients:
##
                                  Estimate Std. Error t value Pr(>|t|)
## (Intercept)
                                -2.614e+02 1.775e+01 -14.726 < 2e-16 ***
## salesLast3Mon
                                 3.751e-01 8.600e-03 43.614 < 2e-16 ***
                                 9.248e-04 6.918e-04
                                                        1.337 0.181367
## id
## nItems
                                 1.620e-01 2.711e-02
                                                        5.975 2.46e-09 ***
## mostFreqStoreColorado Springs -7.023e+00 4.351e+00 -1.614 0.106591
## mostFreqStoreColumbus
                                 1.194e+00
                                            3.684e+00
                                                        0.324 0.745900
## mostFreqStoreDenver
                                -8.219e+00 5.138e+00
                                                       -1.600 0.109710
## mostFreqStoreHonolulu
                                -1.566e+01 4.919e+00 -3.184 0.001463 **
## mostFreqStoreJersey
                                -2.158e+01 5.031e+00 -4.291 1.82e-05 ***
                                -1.028e+01 4.496e+00 -2.286 0.022322 *
## mostFreqStoreOrlando
## mostFreqStoreSan Diego
                                -1.989e+01 5.718e+00 -3.479 0.000507 ***
## mostFreqStoreSeattle
                                -9.585e+00 3.541e+00 -2.707 0.006822 **
## mostFreqStoreStockton
                                -1.156e+02 3.583e+01 -3.225 0.001268 **
## mostFreqCatBaby
                                -3.453e+00 3.513e+00 -0.983 0.325620
## mostFreqCatBakery
                                -1.025e+01 5.456e+00 -1.878 0.060376 .
## mostFreqCatBeverages
                                 3.728e-01 7.007e+00
                                                        0.053 0.957574
## mostFreqCatClothes
                                -8.677e+00 6.214e+00 -1.396 0.162667
## mostFreqCatFresh food
                                -6.299e+00 7.244e+00 -0.869 0.384642
## mostFreqCatFrozen food
                                -8.083e+00 3.840e+00 -2.105 0.035322 *
## mostFreqCatPackaged food
                                -9.868e-01 4.357e+00 -0.226 0.820838
## mostFreqCatPets
                                 8.664e+00 7.242e+00
                                                       1.196 0.231633
## mostFreqCatShoes
                                 3.327e+00 3.285e+00
                                                        1.013 0.311294
## nCats
                                -7.828e-01 2.346e-01 -3.336 0.000855 ***
## preferredBrandAlekto
                                -5.085e+00 1.649e+01 -0.308 0.757863
## preferredBrandBo
                                -2.466e+01 1.438e+01 -1.715 0.086432
## preferredBrandKatram
                                -6.272e+01 2.333e+01
                                                      -2.688 0.007213 **
                                -5.288e+01 2.214e+01 -2.388 0.016955 *
## preferredBrandKellest
## preferredBrandMedeia
                                -2.116e+01 1.556e+01 -1.360 0.173856
## preferredBrandMoone
                                -4.103e+01 1.627e+01 -2.522 0.011711 *
## preferredBrandNilima
                                -2.843e+01 1.454e+01 -1.955 0.050631 .
## preferredBrandTanvi
                                                        1.530 0.126133
                                 3.260e+01 2.131e+01
## preferredBrandVeina
                                -1.818e+01 1.452e+01 -1.252 0.210471
## nBrands
                                -5.314e-02 8.476e-02 -0.627 0.530745
## nPurch
                                 4.767e-01 1.513e-01
                                                        3.151 0.001636 **
## daysSinceLastPurch
                                 1.801e-01 1.524e-01
                                                        1.181 0.237512
## meanItemPrice
                                 1.779e-01 9.289e-02
                                                        1.915 0.055532 .
## meanShoppingCartValue
                                 2.593e-01 2.618e-02
                                                        9.905 < 2e-16 ***
## customerDuration
                                 5.713e-01 7.147e-03 79.938 < 2e-16 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
## Residual standard error: 77.34 on 5084 degrees of freedom
## Multiple R-squared: 0.825, Adjusted R-squared: 0.8237
## F-statistic: 647.7 on 37 and 5084 DF, p-value: < 2.2e-16
```

### library(rms)

```
## Loading required package: Hmisc
## Loading required package: lattice
## Loading required package: survival
## Loading required package: Formula
##
## Attaching package: 'Hmisc'
## The following objects are masked from 'package:dplyr':
##
##
       src, summarize
## The following objects are masked from 'package:base':
##
##
       format.pval, units
## Loading required package: SparseM
## Attaching package: 'SparseM'
## The following object is masked from 'package:base':
##
       backsolve
```

## vif(MultipleLM)

##	salesLast3Mon	id
##	8.702133	1.014808
##	nItems	mostFreqStoreColorado Springs
##	11.793761	1.479010
##	mostFreqStoreColumbus	mostFreqStoreDenver
##	1.750119	1.293184
##	mostFreqStoreHonolulu	mostFreqStoreJersey
##	1.339893	1.317457
##	mostFreqStoreOrlando	mostFreqStoreSan Diego
##	1.403759	1.220688
##	${\tt mostFreqStoreSeattle}$	${ t mostFreqStoreStockton}$
##	1.798055	1.072300
##	${ t mostFreqCatBaby}$	${ t mostFreqCatBakery}$
##	1.457026	1.246035
##	${\tt mostFreqCatBeverages}$	${\tt mostFreqCatClothes}$
##	1.079024	1.157217
##	${\tt mostFreqCatFresh}$ food	${\tt mostFreqCatFrozen}$ food
##	1.070048	1.296358
##	mostFreqCatPackaged food	${\tt mostFreqCatPets}$
##	1.268867	1.077766
##	${\tt mostFreqCatShoes}$	nCats
##	1.417865	8.408871
##	${\tt preferredBrandAlekto}$	${\tt preferredBrandBo}$
##	3.846192	41.092962
##	${\tt preferredBrandKatram}$	${\tt preferredBrandKellest}$
##	1.632990	1.714237
##	${\tt preferredBrandMedeia}$	${\tt preferredBrandMoone}$

```
##
                         6.123156
                                                          4.595465
##
            preferredBrandNilima
                                              preferredBrandTanvi
##
                        22.726586
                                                          1.889467
##
                                                           nBrands
             preferredBrandVeina
##
                        20.749246
                                                         14.179569
##
                           nPurch
                                               daysSinceLastPurch
##
                         3.084009
                                                          1.585075
                    meanItemPrice
                                            meanShoppingCartValue
##
##
                          1.987908
                                                          2.247795
##
                 customerDuration
##
                         1.004680
# Estimating the full model
salesModel1 <- lm(salesThisMon ~ . - id,</pre>
                   data = salesData)
# Checking variance inflation factors
vif(salesModel1)
```

```
##
                           nItems mostFreqStoreColorado Springs
##
                        11.772600
                                                         1.478098
##
           mostFreqStoreColumbus
                                             mostFreqStoreDenver
##
                         1.746101
                                                         1.289203
##
           mostFreqStoreHonolulu
                                             mostFreqStoreJersey
##
                         1.338330
                                                         1.317158
##
            mostFreqStoreOrlando
                                          mostFreqStoreSan Diego
##
                         1.401396
                                                         1.219922
##
            mostFreqStoreSeattle
                                           mostFreqStoreStockton
##
                                                         1.070250
                         1.794891
##
                  mostFreqCatBaby
                                               mostFreqCatBakery
##
                         1.456921
                                                         1.246035
##
            mostFreqCatBeverages
                                              mostFreqCatClothes
##
                         1.079007
                                                         1.156841
##
           mostFreqCatFresh food
                                          mostFreqCatFrozen food
##
                         1.069987
                                                         1.296358
##
        mostFreqCatPackaged food
                                                  mostFreqCatPets
##
                                                         1.077488
                         1.268000
##
                mostFreqCatShoes
                                                            nCats
                                                         8.402073
##
                         1.417807
                                                 preferredBrandBo
##
            preferredBrandAlekto
##
                         3.844176
                                                        41.075930
            preferredBrandKatram
                                           preferredBrandKellest
##
##
                         1.632978
                                                         1.713510
##
            preferredBrandMedeia
                                             preferredBrandMoone
##
                         6.120384
                                                         4.591570
##
            preferredBrandNilima
                                             preferredBrandTanvi
##
                        22.714376
                                                         1.885777
##
             preferredBrandVeina
                                                          nBrands
##
                        20.739114
                                                        14.150868
##
                                                    salesLast3Mon
                           nPurch
##
                         3.083952
                                                         8.697663
##
              daysSinceLastPurch
                                                    meanItemPrice
##
                         1.585057
                                                         1.987665
##
           meanShoppingCartValue
                                                 customerDuration
##
                         2.247579
                                                         1.004664
```

```
# Estimating new model by removing information on brand
salesModel2 <- lm(salesThisMon ~ . - id-preferredBrand-nBrands,</pre>
                   data = salesData)
# Checking variance inflation factors
vif(salesModel2)
##
                           nItems mostFreqStoreColorado Springs
##
                         6.987456
                                                         1.470508
##
                                             mostFreqStoreDenver
           mostFreqStoreColumbus
##
                         1.737790
                                                         1.283222
##
           mostFreqStoreHonolulu
                                             mostFreqStoreJersey
##
                         1.335457
                                                         1.299889
##
            mostFreqStoreOrlando
                                          mostFreqStoreSan Diego
##
                         1.398318
                                                         1.213865
##
            mostFreqStoreSeattle
                                           mostFreqStoreStockton
##
                         1.788777
                                                         1.052065
##
                  mostFreqCatBaby
                                               mostFreqCatBakery
##
                         1.412755
                                                         1.236939
##
            mostFreqCatBeverages
                                              mostFreqCatClothes
##
                         1.077907
                                                         1.105054
##
           mostFreqCatFresh food
                                          mostFreqCatFrozen food
##
                         1.067089
                                                         1.270953
##
        mostFreqCatPackaged food
                                                 mostFreqCatPets
```

### # getting an overview of new data

1.235165

1.384861

3.069046

1.579426

2.238410

nPurch

mostFreqCatShoes

daysSinceLastPurch

meanShoppingCartValue

##

##

##

##

## ##

##

##

salesData2\_4 <- read.csv("C:/Users/venka/OneDrive/Desktop/MINI PROJECT/salesData2\_4.csv")
head(salesData2\_4)</pre>

1.072278

8,412520

1.925494

1.002981

salesLast3Mon

meanItemPrice

customerDuration

nCats 5.813494

```
id nItems
                   mostFreqStore
                                    mostFreqCat nCats preferredBrand nBrands
## 1
          1401
                        Stockton
                                        Alcohol
     1
                                                    73
                                                                 Veina
                                                                            483
## 2
      2
          1461
                        Stockton
                                        Alcohol
                                                    74
                                                                 Veina
                                                                            484
  3
                                                                            131
           262 Colorado Springs
                                          Shoes
                                                    55
                                                                    Rο
           250 Colorado Springs
                                         Bakery
                                                                 Veina
                                                                             93
                                                                             90
## 5
      5
           149 Colorado Springs Packaged food
                                                    36
                                                                    Rο
   6
                                                                             82
                          Boston
                                          Shoes
     nPurch salesLast3Mon daysSinceLastPurch meanItemPrice
## 1
         85
                   2712.99
                                              3
                                                     1.936467
                                              2
## 2
         86
                   2744.57
                                                     1.878556
                   1527.10
                                              1
                                                     5.828626
## 4
         44
                   1675.11
                                              2
                                                     6.700440
## 5
         27
                   1265.18
                                              4
                                                     8.491141
                   1353.23
## 6
                                              1
                                                     6.505913
     meanShoppingCartValue customerDuration
##
                                          852
## 1
                   31.91753
```

```
## 3
                 27.76545
                                      579
## 4
                                      627
                 38.07068
## 5
                 46.85852
                                      634
## 6
                 41.00697
                                      704
summary(salesData2_4)
##
                                           mostFreqStore
         id
                      nItems
##
   Min.
          :
                  Min. : 1.0
                                  Seattle
                                                  :1104
              1
   1st Qu.:1372
                  1st Qu.: 84.0
                                                  : 952
##
                                  Columbus
  Median:2733
                  Median : 155.0
                                  Boston
                                                  : 873
  Mean :2729
                  Mean
                       : 185.9
                                  Colorado Springs: 530
##
   3rd Qu.:4085
                  3rd Qu.: 257.0
                                  Orlando
                                                  : 467
   Max.
                  Max. :1461.0
                                                  : 359
##
          :5455
                                  Honolulu
##
                                   (Other)
                                                  : 888
                                       preferredBrand
##
          mostFreqCat
                           nCats
                                                         nBrands
##
  Alcohol
                :1506
                        Min. : 1.00
                                       Во
                                              :3328
                                                     Min.
                                                           : 1.00
##
   Shoes
                : 930
                        1st Qu.:27.00
                                       Nilima: 771
                                                      1st Qu.: 45.00
## Baby
                : 857
                        Median :37.00
                                       Veina : 709
                                                     Median: 75.00
## Frozen food : 549
                        Mean
                              :36.23
                                       Medeia: 152
                                                     Mean : 81.66
## Packaged food: 471
                        3rd Qu.:46.00
                                       Moone: 75
                                                      3rd Qu.:110.00
##
   Bakery
                : 276
                        Max. :74.00
                                       Alekto: 61
                                                      Max.
                                                             :484.00
##
   (Other)
                : 584
                                       (Other): 77
                   salesLast3Mon daysSinceLastPurch meanItemPrice
##
       nPurch
                                 Min. : 1.000
##
  Min. : 1.00
                   Min. : 189
                                                    Min. : 1.879
                   1st Qu.:1068
                                 1st Qu.: 2.000
                                                    1st Qu.: 6.049
##
   1st Qu.:11.00
  Median :17.00
                   Median:1331
                                 Median : 4.000
                                                    Median: 8.556
## Mean :20.02
                   Mean :1324
                                 Mean : 6.589
                                                    Mean : 12.116
##
   3rd Qu.:27.00
                   3rd Qu.:1570
                                 3rd Qu.: 7.000
                                                    3rd Qu.: 12.969
## Max. :86.00
                   Max.
                          :2745
                                 Max.
                                        :87.000
                                                    Max.
                                                          :313.050
##
## meanShoppingCartValue customerDuration
## Min. : 17.58
                         Min. : 31.0
  1st Qu.: 53.88
                         1st Qu.: 580.0
##
## Median: 75.77
                         Median: 682.0
## Mean : 91.88
                         Mean : 676.8
   3rd Qu.: 109.74
                         3rd Qu.: 777.0
##
  Max. :1147.66
                         Max. :1386.0
##
# predicting sales
predSales5 <- predict(salesModel2, newdata = salesData2_4)</pre>
# calculating mean of future sales
```

688

31.91360

## [1] 625.1438

mean(predSales5 ,na.rm=TRUE)

## 2