

## Assignment 11.1

1. Use the given link and locate the bank marketing dataset. Data Set Link

Perform the below operations:

- a. Create a visual for representing missing values in the dataset.
- b. Show a distribution of clients based on a Job.
- c. Check whether is there any relation between Job and Marital Status?
- d. Check whether is there any association between Job and Education?

```
## The data set can be obtained from
http://archive.ics.uci.edu/ml/datasets/Bank+Marketing
## DATASET UNDERSTANDING
library(readr)
bank_full <- read_delim("C:/Sourav/R/bank-full.csv", ";",
escape_double = FALSE, trim_ws = TRUE)

## Parsed with column specification:
## cols(
##   age = col_integer(),
##   job = col_character(),
##   marital = col_character(),
##   education = col_character(),
##   default = col_character(),
##   balance = col_integer(),
##   housing = col_character(),
##   loan = col_character(),
##   contact = col_character(),
##   day = col_integer(),
##   month = col_character(),
##   duration = col_integer(),
##   campaign = col_integer(),
##   pdays = col_integer(),
##   previous = col_integer(),
##   poutcome = col_character(),
##   y = col_character()
## )
```

*#Lets look at dataset and generate initial understanding about the column types*

```
str(bank_full)
```

```
## Classes 'tbl_df', 'tbl' and 'data.frame':    45211 obs. of  17 variables:
## $ age      : int  58 44 33 47 33 35 28 42 58 43 ...
## $ job      : chr   "management" "technician" "entrepreneur" "blue-collar"
## ...
## $ marital  : chr   "married" "single" "married" "married" ...
## $ education: chr   "tertiary" "secondary" "secondary" "unknown" ...
## $ default  : chr   "no" "no" "no" "no" ...
## $ balance  : int  2143 29 2 1506 1 231 447 2 121 593 ...
## $ housing  : chr   "yes" "yes" "yes" "yes" ...
## $ loan     : chr   "no" "no" "yes" "no" ...
## $ contact  : chr   "unknown" "unknown" "unknown" "unknown" ...
## $ day      : int   5 5 5 5 5 5 5 5 5 5 ...
## $ month    : chr   "may" "may" "may" "may" ...
## $ duration : int  261 151 76 92 198 139 217 380 50 55 ...
## $ campaign : int   1 1 1 1 1 1 1 1 1 1 ...
## $ pdays    : int  -1 -1 -1 -1 -1 -1 -1 -1 -1 -1 ...
## $ previous : int   0 0 0 0 0 0 0 0 0 0 ...
## $ poutcome : chr   "unknown" "unknown" "unknown" "unknown" ...
## $ y        : chr   "no" "no" "no" "no" ...
## - attr(*, "spec")=List of 2
## ..$ cols   :List of 17
## .. ..$ age      : list()
## .. ..$- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ job      : list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ marital  : list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ education: list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ default  : list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ balance  : list()
## .. ..$- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ housing  : list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ loan     : list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ contact  : list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ day      : list()
## .. ..$- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ month    : list()
## .. ..$- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ duration : list()
## .. ..$- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ campaign : list()
```

```
## .. .. - attr(*, "class")= chr "collector_integer" "collector"
## .. ..$ pdays : list()
## .. .. - attr(*, "class")= chr "collector_integer" "collector"
## .. ..$ previous : list()
## .. .. - attr(*, "class")= chr "collector_integer" "collector"
## .. ..$ poutcome : list()
## .. .. - attr(*, "class")= chr "collector_character" "collector"
## .. ..$ y : list()
## .. .. - attr(*, "class")= chr "collector_character" "collector"
## ..$ default: list()
## .. - attr(*, "class")= chr "collector_guess" "collector"
## .. - attr(*, "class")= chr "col_spec"
```

a. Create a visual for representing missing values in the dataset.

```
#A deep check for NA in a particular column let say age
if(length(which(is.na(bank_full$age)==TRUE)>0)){
  print("Missing Value found in the specified column")
} else
  print("All okay: No Missing Value found in the specified column")

## [1] "All okay: No Missing Value found in the specified column"

# Check another example say
if(length(which(is.na(bank_full$campaign)==TRUE)>0)){print("Missing Value
found in the specified column")} else
  print("All okay: No Missing Value found in the specified column")

## [1] "All okay: No Missing Value found in the specified column"

head(bank_full) ## Displays first 6 rows for each variable

## # A tibble: 6 x 17
##   age job marital education default balance housing loan contact
##   <int> <chr> <chr> <chr> <chr> <int> <chr> <chr> <chr>
## 1 58 management married tertiary no 2143 yes no unknown
## 2 44 technician single secondary no 29 yes no unknown
## 3 33 entrepren~ married secondary no 2 yes yes unknown
## 4 47 blue-coll~ married unknown no 1506 yes no unknown
## 5 33 unknown single unknown no 1 no no unknown
## 6 35 management married tertiary no 231 yes no unknown
## # ... with 8 more variables: day <int>, month <chr>, duration <int>,
## # campaign <int>, pdays <int>, previous <int>, poutcome <chr>, y <chr>

str(bank_full) ## Describes each variables
```

```

## Classes 'tbl_df', 'tbl' and 'data.frame':    45211 obs. of  17 variables:
## $ age      : int  58 44 33 47 33 35 28 42 58 43 ...
## $ job       : chr   "management" "technician" "entrepreneur" "blue-collar"
...
## $ marital   : chr   "married" "single" "married" "married" ...
## $ education: chr   "tertiary" "secondary" "secondary" "unknown" ...
## $ default   : chr   "no" "no" "no" "no" ...
## $ balance   : int  2143 29 2 1506 1 231 447 2 121 593 ...
## $ housing   : chr   "yes" "yes" "yes" "yes" ...
## $ loan      : chr   "no" "no" "yes" "no" ...
## $ contact   : chr   "unknown" "unknown" "unknown" "unknown" ...
## $ day       : int   5 5 5 5 5 5 5 5 5 5 ...
## $ month     : chr   "may" "may" "may" "may" ...
## $ duration  : int  261 151 76 92 198 139 217 380 50 55 ...
## $ campaign  : int   1 1 1 1 1 1 1 1 1 1 ...
## $ pdays     : int  -1 -1 -1 -1 -1 -1 -1 -1 -1 -1 ...
## $ previous  : int   0 0 0 0 0 0 0 0 0 0 ...
## $ poutcome  : chr   "unknown" "unknown" "unknown" "unknown" ...
## $ y         : chr   "no" "no" "no" "no" ...
## - attr(*, "spec")=List of 2
## ..$ cols :List of 17
## .. ..$ age      : list()
## .. .. ..- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ job       : list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ marital   : list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ education: list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ default   : list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ balance   : list()
## .. .. ..- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ housing   : list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ loan      : list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ contact   : list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ day       : list()
## .. .. ..- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ month     : list()
## .. .. ..- attr(*, "class")= chr   "collector_character" "collector"
## .. ..$ duration  : list()
## .. .. ..- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ campaign  : list()
## .. .. ..- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ pdays     : list()
## .. .. ..- attr(*, "class")= chr   "collector_integer" "collector"
## .. ..$ previous  : list()

```

```
## .. ..- attr(*, "class")= chr "collector_integer" "collector"
## .. ..$ poutcome : list()
## .. ..- attr(*, "class")= chr "collector_character" "collector"
## .. ..$ y : list()
## .. ..- attr(*, "class")= chr "collector_character" "collector"
## ..$ default: list()
## .. ..- attr(*, "class")= chr "collector_guess" "collector"
## ..- attr(*, "class")= chr "col_spec"
```

**summary**(bank\_full) ## Provides basic statistical information of each variable

```
##      age      job      marital      education
## Min.   :18.00  Length:45211  Length:45211  Length:45211
## 1st Qu.:33.00  Class :character  Class :character  Class :character
## Median :39.00  Mode  :character  Mode  :character  Mode  :character
## Mean   :40.94
## 3rd Qu.:48.00
## Max.   :95.00
##      default      balance      housing      loan
## Length:45211  Min.   : -8019  Length:45211  Length:45211
## Class :character  1st Qu.:   72  Class :character  Class :character
## Mode  :character  Median :  448  Mode  :character  Mode  :character
##                      Mean    : 1362
##                      3rd Qu.: 1428
##                      Max.    :102127
##      contact      day      month      duration
## Length:45211  Min.   : 1.00  Length:45211  Min.   : 0.0
## Class :character  1st Qu.: 8.00  Class :character  1st Qu.: 103.0
## Mode  :character  Median :16.00  Mode  :character  Median : 180.0
##                      Mean    :15.81  Mean    : 258.2
##                      3rd Qu.:21.00  3rd Qu.: 319.0
##                      Max.    :31.00  Max.    :4918.0
##      campaign      pdays      previous      poutcome
## Min.   : 1.000  Min.   : -1.0  Min.   : 0.0000  Length:45211
## 1st Qu.: 1.000  1st Qu.: -1.0  1st Qu.: 0.0000  Class :character
## Median : 2.000  Median : -1.0  Median : 0.0000  Mode  :character
## Mean    : 2.764  Mean    :40.2  Mean    : 0.5803
## 3rd Qu.: 3.000  3rd Qu.: -1.0  3rd Qu.: 0.0000
## Max.    :63.000  Max.    :871.0  Max.    :275.0000
##      y
## Length:45211
## Class :character
## Mode  :character
##
##
##
```

## DATA EXPLORATION - Check for Missing Data

## Option 1

**is.na**(bank\_full) ## Displays True for a missing value

[illegible]

```
Deleted remaining false as it is very lengthy
FALSE      FALSE FALSE      FALSE      FALSE
```

[illegible]

```
## [5867,] FALSE
## [5868,] FALSE
## [5869,] FALSE
## [5870,] FALSE
## [5871,] FALSE
## [5872,] FALSE
## [5873,] FALSE
## [5874,] FALSE
## [5875,] FALSE
## [5876,] FALSE
## [5877,] FALSE
## [5878,] FALSE
## [5879,] FALSE
## [5880,] FALSE
## [5881,] FALSE
## [5882,] FALSE
## [ reached getOption("max.print") -- omitted 39329 rows ]
```

## Since it is a large dataset, graphical display of missing values will prove to be easier

##Option 2

```
require(Amelia)
```

```
## Loading required package: Amelia
```

```
## Loading required package: Rcpp
```

```
## ##
```

```
## ## Amelia II: Multiple Imputation
```

```
## ## (Version 1.7.5, built: 2018-05-07)
```

```
## ## Copyright (C) 2005-2018 James Honaker, Gary King and Matthew Blackwell
```

```
## ## Refer to http://gking.harvard.edu/amelia/ for more information
```

```
## ##
```

```
missmap(bank_full,main="Missing Data - Bank ",
```

```
col=c("red","grey"),legend=FALSE)
```

```
## Warning in if (class(obj) == "amelia") {: the condition has length > 1 and
## only the first element will be used
```

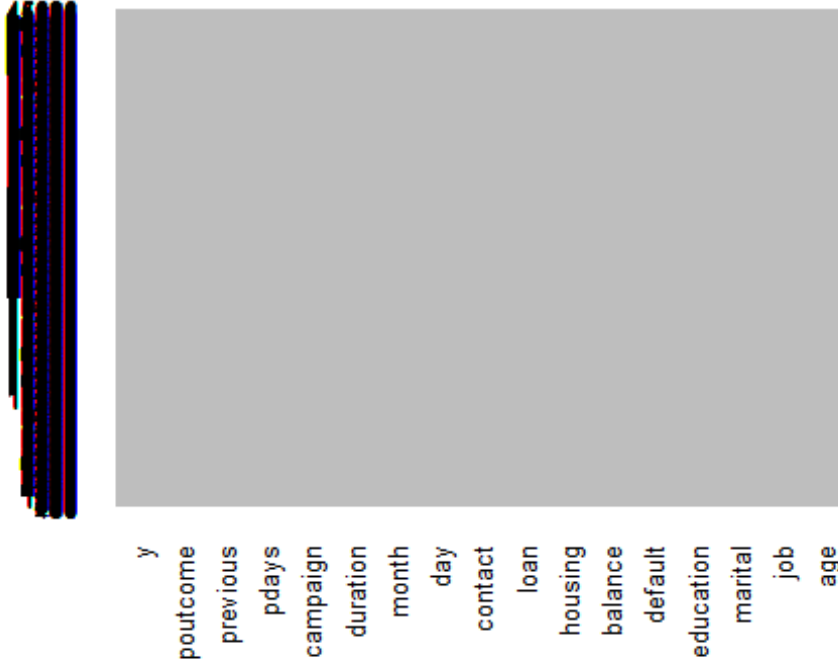
```
## Warning: Unknown or uninitialised column: 'arguments'.
```

```
## Warning: Unknown or uninitialised column: 'arguments'.
```

```
## Warning: Unknown or uninitialised column: 'imputations'.
```



## Missing Data - Bank



## No red colour stripes are visible. hence no missing values.

`summary(bank_full)` ## displays missing values if any under every variable

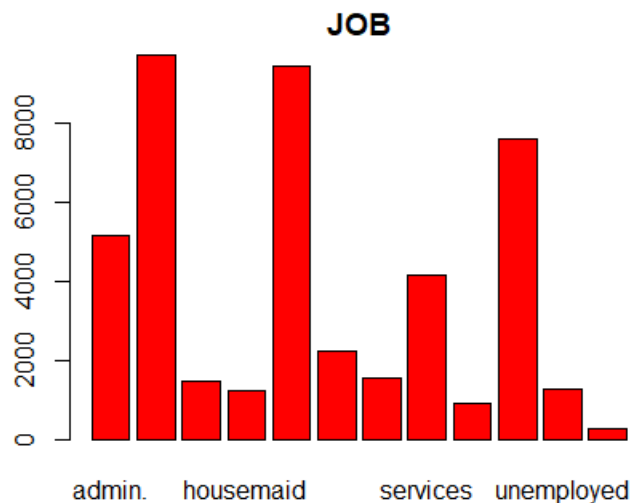
```
##      age      job      marital      education
## Min.   :18.00   Length:45211   Length:45211   Length:45211
## 1st Qu.:33.00   Class :character   Class :character   Class :character
## Median :39.00   Mode  :character   Mode  :character   Mode  :character
## Mean   :40.94
## 3rd Qu.:48.00
## Max.   :95.00
##      default      balance      housing      loan
## Length:45211   Min.    : -8019   Length:45211   Length:45211
## Class :character 1st Qu.:    72   Class :character   Class :character
## Mode  :character Median :   448   Mode  :character   Mode  :character
##                  Mean    :  1362
##                  3rd Qu.:  1428
##                  Max.    :102127
##      contact      day      month      duration
## Length:45211   Min.    :  1.00   Length:45211   Min.    :    0.0
## Class :character 1st Qu.:  8.00   Class :character 1st Qu.:  103.0
## Mode  :character Median :16.00   Mode  :character Median :  180.0
##                  Mean    :15.81   Mean    :  258.2
##                  3rd Qu.:21.00   3rd Qu.:  319.0
##                  Max.    :31.00   Max.    :4918.0
##      campaign      pdays      previous      poutcome
## Min.    :  1.000   Min.    : -1.0   Min.    :  0.0000   Length:45211
## 1st Qu.:  1.000   1st Qu.: -1.0   1st Qu.:  0.0000   Class :character
```

```
## Median : 2.000 Median : -1.0 Median : 0.0000 Mode :character
## Mean : 2.764 Mean : 40.2 Mean : 0.5803
## 3rd Qu.: 3.000 3rd Qu.: -1.0 3rd Qu.: 0.0000
## Max. :63.000 Max. :871.0 Max. :275.0000
## y
## Length:45211
## Class :character
## Mode :character
##
##
##
```

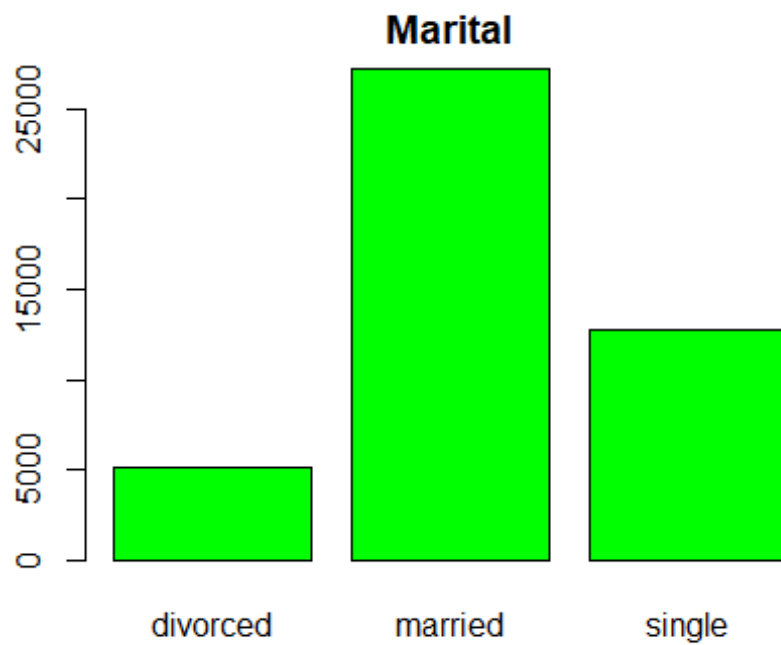
- b. Show a distribution of clients based on a Job.
- c. Check whether is there any relation between Job and Marital Status?
- d. Check whether is there any association between Job and Education?

## b. Show a distribution of clients based on a Job.

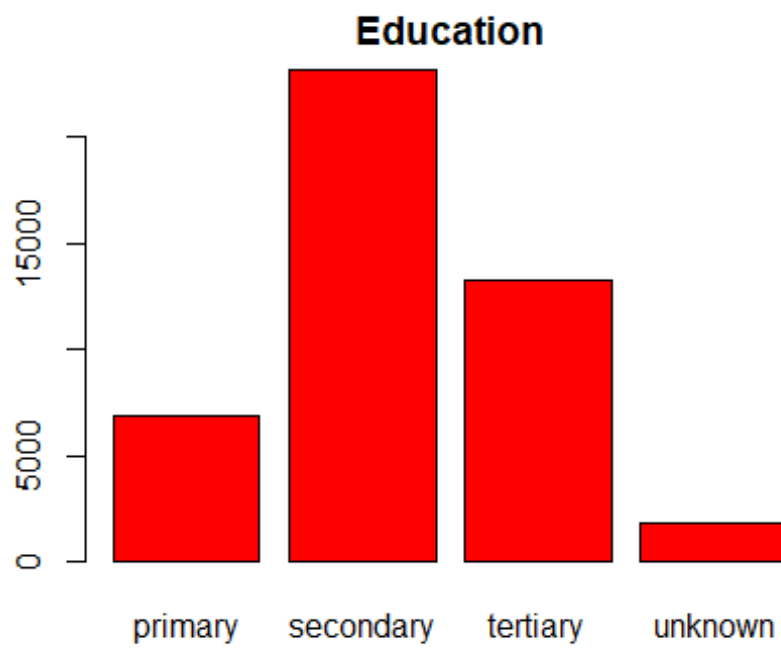
```
## Barplotsfor Categorical Variables
barplot(table(bank_full$job),col="red",main="JOB")
```



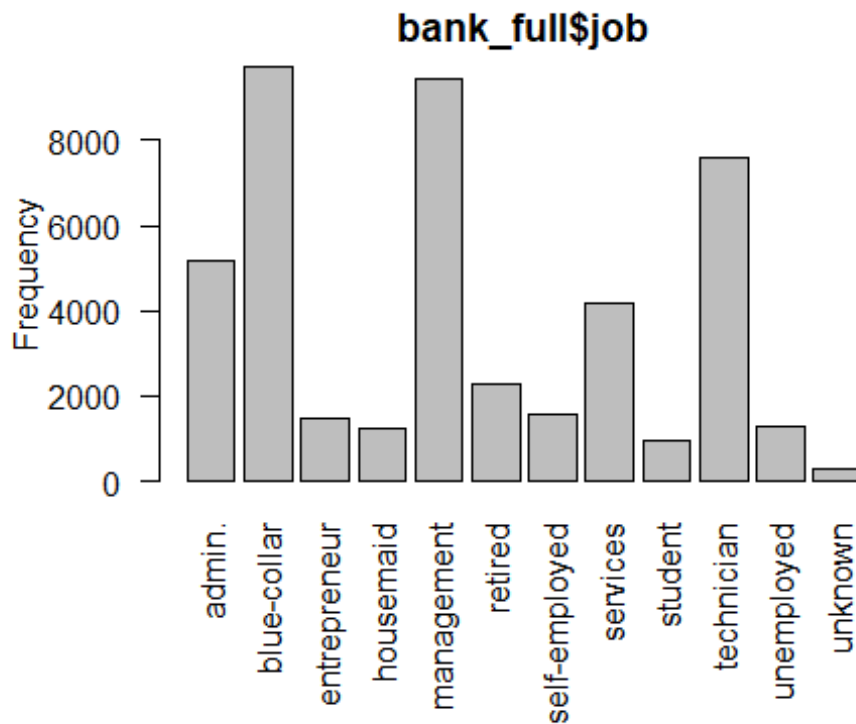
```
barplot(table(bank_full$marital),col="green",main="Marital")
```



```
barplot(table(bank_full$education),col="red",main="Education")
```

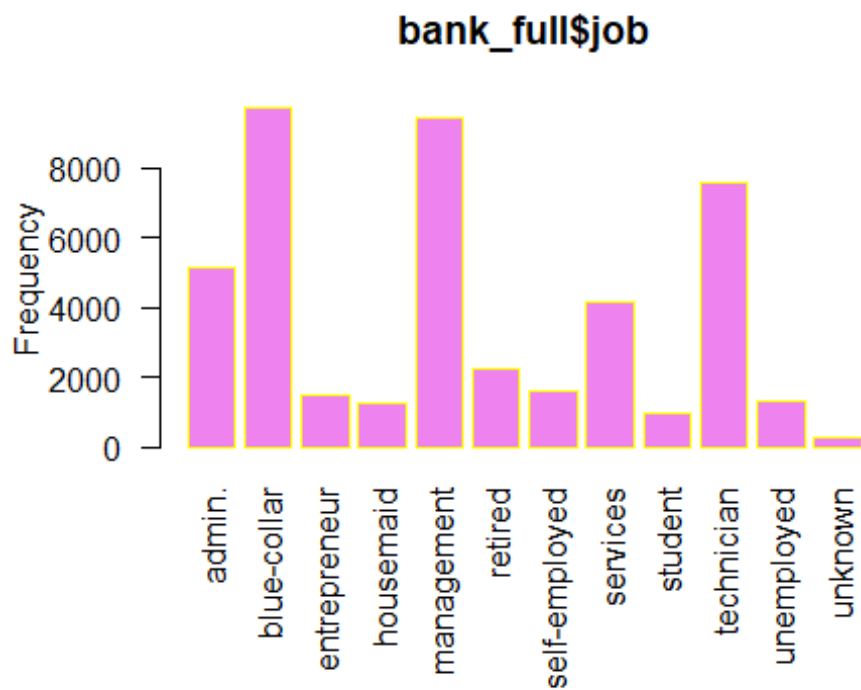


```
par(oma=c(2,0,0,0)) #so labels are not cut off
barplot(table(bank_full$job),ylab = "Frequency", main = "bank_full$job",
        border="black", col="grey",las=2)
```

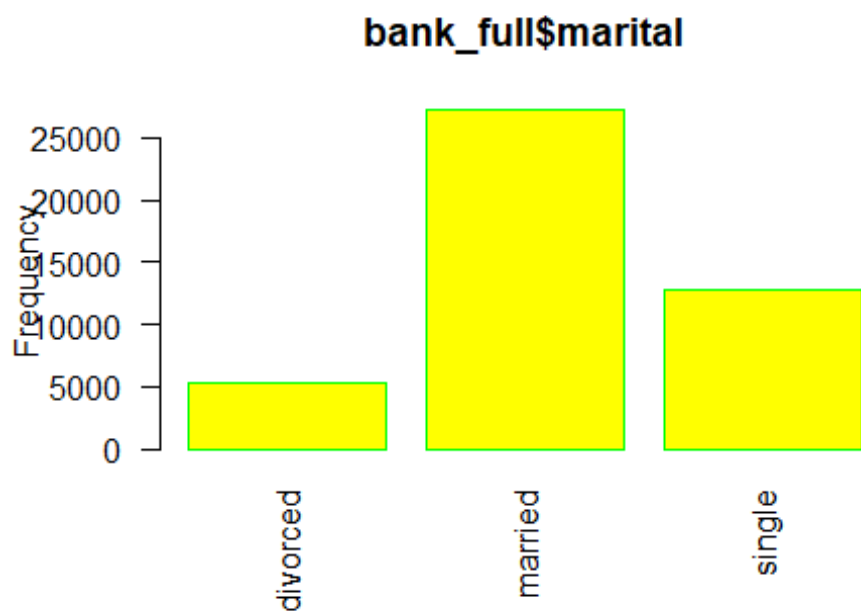


*#Histogram for job,marital and education - three categorical variables*

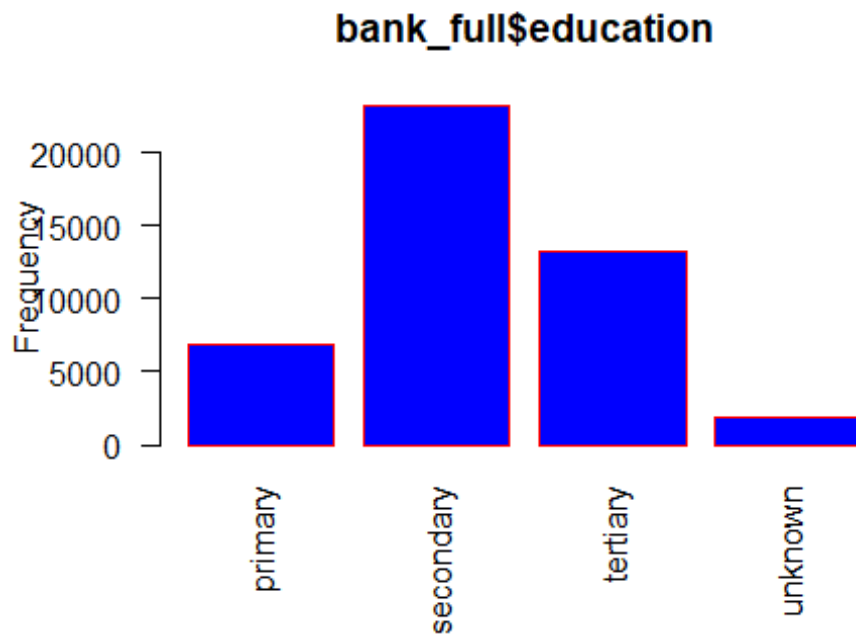
```
par(oma=c(2,0,0,0)) #so labels are not cut off
barplot(table(bank_full$job),ylab = "Frequency", main = "bank_full$job",
        border="yellow", col="violet",las=2)
```



```
par(oma=c(2,0,0,0)) #so labels are not cut off
barplot(table(bank_full$marital),ylab = "Frequency", main =
"bank_full$marital",
        border="green", col="yellow",las=2)
```



```
par(oma=c(2,0,0,0)) #so labels are not cut off
barplot(table(bank_full$education),ylab = "Frequency", main =
"bank_full$education",
        border="red", col="blue",las=2)
```



c. Check whether is there any relation between Job and Marital Status?

As both are a categorical variable this can be checked with `chisq.test`

```
with(bank_full, chisq.test( job, marital))

##
##  Pearson's Chi-squared test
##
## data:  job and marital
## X-squared = 3837.6, df = 22, p-value < 2.2e-16

with(bank_full, table( job, marital) )

##           marital
## job   divorced married single
## admin.         750    2693   1728
## blue-collar     750    6968   2014
## entrepreneur   179    1070    238
## housemaid       184     912    144
## management    1111    5400   2947
## retired         425    1731    108
## self-employed   140     993    446
## services        549    2407   1198
## student         6      54    878
```

```
## technician      925    4052    2620
## unemployed      171     731     401
## unknown         17     203      68
```

*# OR*

```
with(bank_full, prop.table(table( job,education)))
```

```
##              education
## job           primary  secondary  tertiary  unknown
## admin.        0.0046227688 0.0933179978 0.0126517883 0.0037822654
## blue-collar   0.0831213643 0.1187985225 0.0032956581 0.0100418040
## entrepreneur 0.0040476875 0.0119882330 0.0151732985 0.0016810068
## housemaid     0.0138683064 0.0087368118 0.0038265024 0.0009953330
## management    0.0065028422 0.0247948508 0.1725465042 0.0053526797
## retired       0.0175842162 0.0217646148 0.0080953750 0.0026321028
## self-employed 0.0028754064 0.0127623808 0.0184247196 0.0008626219
## services      0.0076308863 0.0764636925 0.0044679392 0.0033177766
## student       0.0009732145 0.0112362036 0.0049324279 0.0036053173
## technician    0.0034947247 0.1156576939 0.0435292296 0.0053526797
## unemployed    0.0056844573 0.0161022760 0.0063922497 0.0006414368
## unknown       0.0011280441 0.0015704143 0.0008626219 0.0028090509
```

*#<2.2e-16 means 0.00000000000000022. It is (very much) Less than 0.05*

## d. Check whether is there any association between Job and Education?

As both are a categorical variable this can be checked with `chisq.test`

```
with(bank_full, chisq.test( job,education))
```

```
##
## Pearson's Chi-squared test
##
## data:  job and education
## X-squared = 28483, df = 33, p-value < 2.2e-16
```

```
with(bank_full, table( job, education) )
```

```
##              education
## job           primary secondary tertiary unknown
## admin.         209      4219      572      171
## blue-collar    3758      5371      149      454
## entrepreneur   183       542      686       76
## housemaid      627       395      173       45
## management     294      1121     7801      242
## retired        795       984      366      119
```



```
## self-employed      130      577      833      39
## services           345     3457      202     150
## student            44      508      223     163
## technician         158     5229     1968     242
## unemployed         257      728      289      29
## unknown            51       71       39     127
```

*# OR*

```
with(bank_full, prop.table(table( job,education)))
```

```
##                education
## job            primary    secondary    tertiary    unknown
## admin.         0.0046227688 0.0933179978 0.0126517883 0.0037822654
## blue-collar    0.0831213643 0.1187985225 0.0032956581 0.0100418040
## entrepreneur   0.0040476875 0.0119882330 0.0151732985 0.0016810068
## housemaid      0.0138683064 0.0087368118 0.0038265024 0.0009953330
## management     0.0065028422 0.0247948508 0.1725465042 0.0053526797
## retired        0.0175842162 0.0217646148 0.0080953750 0.0026321028
## self-employed  0.0028754064 0.0127623808 0.0184247196 0.0008626219
## services       0.0076308863 0.0764636925 0.0044679392 0.0033177766
## student        0.0009732145 0.0112362036 0.0049324279 0.0036053173
## technician     0.0034947247 0.1156576939 0.0435292296 0.0053526797
## unemployed     0.0056844573 0.0161022760 0.0063922497 0.0006414368
## unknown        0.0011280441 0.0015704143 0.0008626219 0.0028090509
```

*#<2.e-16 means 0.00000000000000022. It is (very much) less than 0.05*

## 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>.

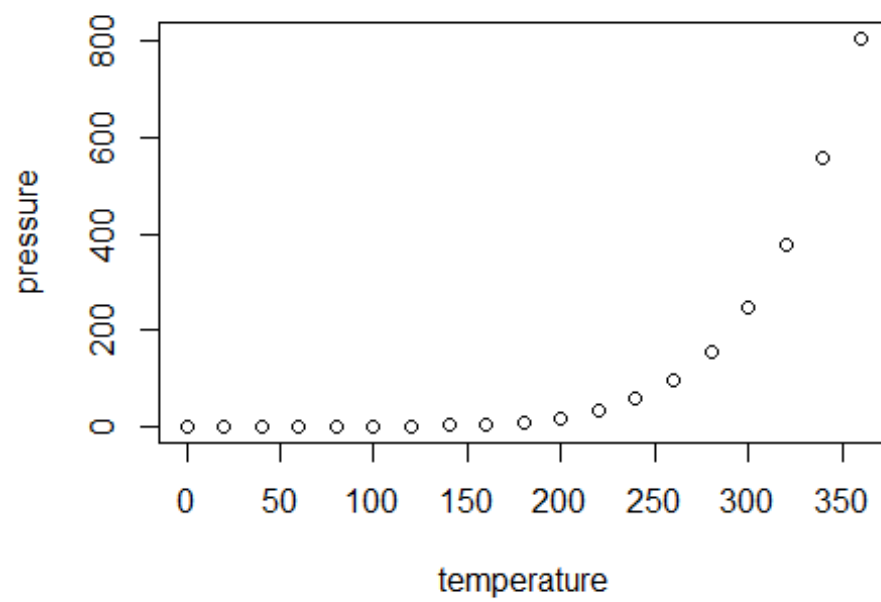
When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

```
summary(cars)
```

```
##      speed      dist
## Min.   : 4.0    Min.   :  2.00
## 1st Qu.:12.0    1st Qu.: 26.00
## Median :15.0    Median : 36.00
## Mean   :15.4    Mean   : 42.98
## 3rd Qu.:19.0    3rd Qu.: 56.00
## Max.   :25.0    Max.   :120.00
```

## Including Plots

You can also embed plots, for example:



Note that the `echo = FALSE` parameter was added to the code chunk to prevent printing of the R code that generated the plot.