R Programming Introduction to Workshop Participants

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Use of this document

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Scripting language used

This document is created using R Markdown, a scripting language available as open source from R Foundation.

Loading all the required packages

```
#install.packages("readxl",repos = "http://cran.us.r-project.org")
library(readxl)

#install.packages("ggplot2",repos = "http://cran.us.r-project.org")
library(ggplot2)

#install.packages("dplyr",repos = "http://cran.us.r-project.org")
library(dplyr)
```

May need to load more libraries/packages depending on local computer/server

Loading the file into R data-frame

```
#Reading the csv file
port = read.csv('D:/Data Analytics Workshop/Data Analytics Technical Workshop
Singapore/Data/port.csv')

#Reading the excel file
#port_excel = read_excel('D:/Data Analytics Workshop/Data Analytics Technical
Workshop Singapore/Data/port.xlsx')
```

Analysing the dataset

```
#Looding at the dimension of the dataset (number of rows and columns)
dim(port)
## [1] 49993
                 26
#Looding at the class of the dataset
class(port)
## [1] "data.frame"
#Looding at the names of the column of the dataset
names(port)
                                                    "CNTR_OPR_C"
##
    [1] "ID"
                              "CNTR_N"
   [4] "CNTR_STATUS_C"
                              "PURPOSE C"
                                                    "LENGTH Q"
##
  [7] "CNTR_TYPE_C"
                              "WT_Q"
                                                    "LOAD_PORT_C"
## [10] "DISC_PORT1_C"
                              "DEST_PORT_C"
                                                    "DISC ABBR VESSEL M"
## [13] "DISC_SERVICE_C"
                              "LOAD_ABBR_VESSEL_M"
                                                    "LOAD SERVICE C"
                              "DISC_DT"
                                                    "GATE_OUT_DT"
## [16] "LOAD DT"
## [19] "GATE IN DT"
                              "BATCH ID"
                                                    "LOGISTICS PARTNER"
## [22] "DWELL DAYS"
                                                    "COMMODITY"
                              "PRODUCT"
## [25] "CARGO_OWNER"
                              "RF_TEMP"
#Looding at the first few rows
head(port)
              CNTR N CNTR OPR C CNTR STATUS C PURPOSE C LENGTH Q CNTR TYPE C
##
     ID
## 1
     1 NYKU 9701818
                              ON
                                              F
                                                        Τ
                                                                 20
                                                                             GP
                                              F
                                                        Τ
                                                                 40
                                                                             GP
## 2 2 APHU 6602779
                              EG
## 3
     3 PCIU 6007321
                              PΤ
                                              F
                                                        Т
                                                                 40
                                                                             RF
## 4 4 HALU 5642133
                              HE
                                              F
                                                        Ι
                                                                 40
                                                                             GP
                                              F
                                                        Τ
                                                                 20
## 5
      5 TEMU 1697343
                              YΜ
                                                                             GP
## 6 6 UACU 3529931
                                                        Т
                              HL
                                              F
                                                                 20
                                                                             GP
      WT_Q LOAD_PORT_C DISC_PORT1_C DEST_PORT_C DISC_ABBR_VESSEL_M
##
                 MYPGU
                               INCCU
                                                            PAC BANDA
## 1 22080
## 2 22932
                               IDPWG
                                                        CMA TANCREDI
                 CNSHA
## 3 15200
                 VNCLI
                               AUMEL
                                            AUMEL
## 4 27900
                 CNTXG
                                                           AGAMEMNON
## 5 15227
                 THBKK
                               INMUN
                                            INMUN
                                                          MATHU BHUM
## 6 25000
                 MYPKG
                               TRIST
                                                         HONOLULU BR
     DISC_SERVICE_C LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
##
                                                             LOAD DT
## 1
                PGU
                                                    CC1 2.018081e+13
                               DONG HAI
## 2
                ASC
                            MARCO P 118
                                                    IDO 2.018072e+13
## 3
                           O KUALALUMPU
                                                    AAA 2.018070e+13
## 4
                CIS
## 5
                TSB
                            CONTI CHAMP
                                                    CIS 2.018122e+13
## 6
                CIS
                              HAMBURG E
                                                    MD3 2.018093e+13
##
          DISC_DT GATE_OUT_DT GATE_IN_DT BATCH_ID LOGISTICS_PARTNER
```

```
## 1 2.018080e+13
                                             201808
                           NA
                                                                 <NA>
## 2 2.018072e+13 2.018072e+13 2.018072e+13
                                             201807
                                                                 <NA>
              NA
                                             201807
                                                                 <NA>
                           NA
## 4 2.018092e+13 2.018092e+13
                                        NA
                                             201809
                                                                 <NA>
## 5 2.018121e+13
                           NA
                                        NA
                                             201812
                                                                 <NA>
## 6 2.018092e+13
                           NA
                                        NA
                                             201809
                                                                 <NA>
     DWELL DAYS PRODUCT COMMODITY
                                                              CARGO OWNER
## 1
            3.1
                Weever
                         Sea Food
                                                                  Renault
## 2
           7.6
                  Snail Sea Food
                                                               Mitsubishi
## 3
           4.3
                   Snail
                          Sea Food
                                                               Mitsubishi
## 4
           2.7 Sorubim
                          Sea Food
                                                      Magna International
## 5
            2.8 pumpkin Vegetables
                                                                   Nissan
            9.6 delicata Vegetables Aviation Industry Corporation of China
## 6
## RF TEMP
## 1
          NA
## 2
          NA
## 3
          8
## 4
          NA
## 5
          NA
## 6
          NA
#Looking at all the columns and their types
str(port)
## 'data.frame': 49993 obs. of 26 variables:
                        : int 1 2 3 4 5 6 7 8 9 10 ...
## $ ID
## $ CNTR N
                        : Factor w/ 49839 levels "0526237", "AAMU 2604706",...:
28161 235 32621 16162 41583 47444 35444 25528 33586 47145 ...
## $ CNTR OPR C
                      : Factor w/ 155 levels "AA", "AB", "AC", ...: 99 41 106
61 151 62 119 88 88 62 ...
                       : Factor w/ 2 levels "E", "F": 2 2 2 2 2 2 2 1 2 1 ...
## $ CNTR STATUS C
                       : Factor w/ 4 levels "I", "P", "T", "X": 3 3 3 1 3 3 3
## $ PURPOSE C
3 3 ...
                      : int 20 40 40 40 20 20 20 40 20 40 ...
## $ LENGTH O
## $ CNTR_TYPE_C : Factor w/ 7 levels "FR", "GP", "OT", ...: 2 2 5 2 2 2
2 2 2 ...
## $ WT_Q
                      : int 22080 22932 15200 27900 15227 25000 17880 3880
26433 3660 ...
## $ LOAD PORT C : Factor w/ 433 levels "","AEAUH","AEDXB",..: 270 86
420 91 367 271 266 188 275 216 ...
                       : Factor w/ 348 levels "", "AEAUH", "AEDXB", ...: 123 115
## $ DISC PORT1 C
16 1 130 273 131 264 191 68 ...
                       : Factor w/ 948 levels "", "AEAJM", "AEAUH", ...: 1 1 27
## $ DEST_PORT_C
1 421 1 1 1 1 1 ...
## $ DISC ABBR VESSEL M: Factor w/ 1587 levels "","A IDEFIX",..: 1260 284 1
11 813 538 1373 578 581 1524 ...
                      : Factor w/ 261 levels "", "A5C", "AA1", ...: 170 24 1 52
## $ DISC_SERVICE_C
242 52 210 46 195 185 ...
## $ LOAD_ABBR_VESSEL_M: Factor w/ 1587 levels "","A IDEFIX",..: 423 779
1211 1 306 528 1175 948 842 1298 ...
```

```
## $ LOAD SERVICE C : Factor w/ 264 levels "", "888", "A5C", ...: 43 99 6 1
53 138 185 170 223 64 ...
                                2.02e+13 2.02e+13 2.02e+13 NA 2.02e+13 ...
##
  $ LOAD DT
                        : num
##
  $ DISC DT
                                2.02e+13 2.02e+13 NA 2.02e+13 2.02e+13 ...
                        : num
                        : num
##
  $ GATE_OUT_DT
                               NA 2.02e+13 NA 2.02e+13 NA ...
                        : num NA 2.02e+13 NA NA NA ...
##
  $ GATE IN DT
## $ BATCH ID
                         : int 201808 201807 201807 201809 201812 201809
201809 201810 201810 201807 ...
## $ LOGISTICS_PARTNER : Factor w/ 49 levels "Americold Logistics",..: NA NA
NA NA NA NA NA NA NA ...
## $ DWELL DAYS
                         : num 3.1 7.6 4.3 2.7 2.8 9.6 3.5 4.3 6.6 3.5 ...
## $ PRODUCT
                         : Factor w/ 979 levels "Abalone", "Abalone-style
Shellfish",..: 957 801 801 814 679 261 192 801 668 625 ...
                         : Factor w/ 25 levels "Adhesive", "Biscuit", ...: 22 22
## $ COMMODITY
22 22 24 24 22 22 22 24 ...
                         : Factor w/ 101 levels "AB Volvo", "Airbus", ...: 81 64
## $ CARGO OWNER
64 62 70 7 35 64 26 43 ...
## $ RF TEMP
                         : int NA NA 8 NA NA NA NA NA NA NA ...
#Looding at the summary of the entire dataset
summary(port)
##
          ID
                              CNTR N
                                            CNTR OPR C
                                                          CNTR STATUS C
                                                          E: 7449
##
  Min.
                1
                    TRHU 1605377:
                                      3
                                          MD
                                                 : 7393
           :
##
   1st Qu.:12499
                    AAMU 7000400:
                                      2
                                                          F:42544
                                          ON
                                                 : 6089
##
  Median :24997
                    APHU 6410966:
                                      2
                                          MS
                                                 : 5398
## Mean
           :24997
                    APZU 3041450:
                                      2
                                          HL
                                                 : 4086
##
    3rd Qu.:37495
                    APZU 4245377:
                                      2
                                          CM
                                                 : 3996
                                                 : 3469
##
   Max.
           :49993
                    BEAU 2376015:
                                      2
                                          PΙ
##
                    (Other)
                                 :49980
                                          (Other):19562
##
    PURPOSE_C
                 LENGTH Q
                              CNTR TYPE C
                                                WT_Q
                                                            LOAD PORT C
##
   I: 2837
              Min.
                     : 0.00
                               FR: 143
                                           Min.
                                                  : 1730
                                                            THLCH : 2580
##
   P:
              1st Ou.:20.00
                              GP:45829
                                           1st Ou.: 9400
                                                                   : 2269
         40
##
   T:43568
              Median :40.00
                              OT: 301
                                           Median :21156
                                                            BDCGP
                                                                   : 2098
   X: 3548
                              PF:
##
              Mean
                     :30.62
                                      3
                                           Mean
                                                  :18409
                                                            IDJKT : 1483
##
              3rd Qu.:40.00
                              RF: 3021
                                           3rd Qu.:27224
                                                            CNSHA
                                                                  : 1405
##
              Max.
                     :45.00
                              TK: 693
                                           Max.
                                                  :60000
                                                            IDSUB :
                                                                      999
##
                              UC:
                                      3
                                                            (Other):39159
##
     DISC PORT1 C
                     DEST PORT C
                                        DISC ABBR VESSEL M DISC SERVICE C
##
           : 2484
                            :22497
                                                 :10020
                                                                   :10020
##
    THLCH : 1960
                    IDJKT
                              905
                                     NYK JOANNA
                                                    193
                                                           AM1
                                                                      705
##
    CNSHA : 1664
                    BDCGP
                              875
                                     KANWAY GALAX:
                                                    157
                                                           AM4
                                                                      694
##
   IDJKT : 1592
                    ZZZZZ :
                              766
                                    ATOUT
                                                    154
                                                           IDO
                                                                      613
                              717
##
    BDCGP : 1351
                    CNSHA
                                     SINAR SABANG:
                                                    152
                                                           UE1
                                                                      581
##
    ZZZZZ : 1012
                    THLCH
                          :
                              672
                                     NYK FUJI
                                                    148
                                                           SW3
                                                                      578
                                                 :
##
    (Other):39930
                    (Other):23561
                                     (Other)
                                                 :39169
                                                            (Other):36802
       LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
##
                                              LOAD DT
##
                : 9491
                                  : 9492
                                           Min.
                                                  :2.018e+13
##
   MSC RAFAELA:
                   187
                          AM4
                                     851
                                           1st Qu.:2.018e+13
   NYK FUSHIMI :
                   156
                          AM1
                                  :
                                     682
                                           Median :2.018e+13
```

```
NYK JOANNA :
                   150
                          AM3
                                     640
                                           Mean
                                                  :2.018e+13
## ATOUT
                   142
                          FE1
                                     591
                                           3rd Qu.:2.018e+13
##
    BALTIMORE BR:
                   141
                          EU1
                                     580
                                           Max.
                                                  :2.018e+13
##
                :39726
                                           NA's
                                                  :9474
    (Other)
                          (Other):37157
       DISC_DT
##
                         GATE_OUT_DT
                                               GATE_IN_DT
##
   Min.
           :2.018e+13
                        Min.
                               :2.018e+13
                                             Min.
                                                    :2.018e+13
    1st Qu.:2.018e+13
                        1st Qu.:2.018e+13
                                             1st Ou.:2.018e+13
##
   Median :2.018e+13
                        Median :2.018e+13
                                             Median :2.018e+13
   Mean
           :2.018e+13
                               :2.018e+13
                                             Mean
                                                    :2.018e+13
##
    3rd Qu.:2.018e+13
                        3rd Qu.:2.018e+13
                                             3rd Qu.:2.018e+13
##
   Max.
           :2.018e+13
                        Max.
                               :2.018e+13
                                             Max.
                                                    :2.018e+13
##
   NA's
                        NA's
                                             NA's
                                                    :40687
           :9922
                                :40535
##
       BATCH ID
                                                       LOGISTICS PARTNER
##
   Min.
           :201807
                     UPS Supply Chain Solutions
                                                                    283
##
    1st Qu.:201808
                     Lineage Logistics
                                                                    257
   Median :201809
                     Performance Team
                                                                    234
## Mean
           :201809
                     Ingram Micro Commerce & Lifecycle Services:
                                                                    232
##
    3rd Qu.:201811
                     Total Quality Logistics
                                                                    209
##
   Max.
           :201812
                     (Other)
                                                                 : 1997
                     NA's
##
                                                                 :46781
##
      DWELL DAYS
                        PRODUCT
                                           COMMODITY
                                      Sea Food :35329
## Min.
          : 2.000
                     Snail :11397
##
    1st Qu.: 4.000
                     Crab
                                      Vegetables: 4710
                               680
##
   Median : 6.000
                     Clam
                               484
                                      Fruits
                                                : 3612
##
   Mean
          : 6.014
                     bean
                               416
                                      Flowers
                                                : 2651
##
    3rd Qu.: 8.000
                     Grunt :
                               316
                                      Meat
                                                : 1834
##
                     (Other):36687
                                                : 1844
   Max.
           :10.000
                                      (Other)
##
                     NA's
                            :
                                13
                                      NA's
                                                    13
##
                  CARGO OWNER
                                     RF_TEMP
## Mitsubishi
                                         :-30.00
                        :11550
                                 Min.
##
    Dongfeng Motor Group:
                           792
                                 1st Qu.:-20.00
##
                           747
                                 Median :-10.00
## Eni
                           663
                                 Mean
                                         :-10.23
## Lockheed Martin
                           642
                                  3rd Ou.: 0.00
## (Other)
                        :35586
                                  Max.
                                       : 10.00
## NA's
                                  NA's :46972
                            13
```

Creating Variables in R

```
#Simple Variables
x = 5
y = 'Singapore Terminal'

x
## [1] 5

y
## [1] "Singapore Terminal"
```

```
# List
a = c(2,3,4,5,8,9)
b = c('Singapore', 'Korea', 'India')
c = rnorm(20)

a
## [1] 2 3 4 5 8 9
b
## [1] "Singapore" "Korea" "India"
c
## [1] -0.384971244 0.533102544 -0.314481806 0.279168998 2.001850426
## [6] -0.947425142 0.334022465 1.663554674 1.131760299 -0.514487706
## [11] 0.002611893 -0.591702521 -0.274621276 1.553219713 -1.280334803
## [16] 0.193093233 0.340061201 -0.109923928 0.239997448 2.361260508
```

Basic Data Preparation Activities in R

Selecting Variables

```
# Take the selected columns in new dataset
newdata = select(port, CNTR N, COMMODITY, CARGO OWNER)
head(newdata)
##
           CNTR N COMMODITY
                                                        CARGO OWNER
## 1 NYKU 9701818 Sea Food
                                                            Renault
## 2 APHU 6602779
                    Sea Food
                                                         Mitsubishi
## 3 PCIU 6007321
                    Sea Food
                                                         Mitsubishi
## 4 HALU 5642133
                    Sea Food
                                                Magna International
## 5 TEMU 1697343 Vegetables
                                                             Nissan
## 6 UACU 3529931 Vegetables Aviation Industry Corporation of China
# keep the container number and all variables between logistics partner and
cargo owner
newdata = select(port, CNTR_N, LOGISTICS_PARTNER:CARGO_OWNER)
head(newdata)
           CNTR_N LOGISTICS_PARTNER DWELL_DAYS PRODUCT COMMODITY
## 1 NYKU 9701818
                               <NA>
                                           3.1
                                                 Weever
                                                          Sea Food
## 2 APHU 6602779
                               <NA>
                                           7.6
                                                  Snail
                                                          Sea Food
                                           4.3
## 3 PCIU 6007321
                               <NA>
                                                  Snail
                                                          Sea Food
                                           2.7 Sorubim
## 4 HALU 5642133
                               <NA>
                                                          Sea Food
## 5 TEMU 1697343
                               <NA>
                                           2.8 pumpkin Vegetables
## 6 UACU 3529931
                               <NA>
                                           9.6 delicata Vegetables
##
                               CARGO OWNER
## 1
                                    Renault
```

```
## 2
                                   Mitsubishi
## 3
                                  Mitsubishi
## 4
                         Magna International
## 5
                                       Nissan
## 6 Aviation Industry Corporation of China
# keep the container number and all variables except reefer temperature and
newdata = select(port, -BATCH_ID, -RF_TEMP)
head(newdata)
##
              CNTR_N CNTR_OPR_C CNTR_STATUS_C PURPOSE_C LENGTH_Q CNTR_TYPE_C
     ID
## 1
      1 NYKU 9701818
                              ON
                                              F
                                                         Т
                                                                 20
                                                                              GP
                                              F
                                                         Т
     2 APHU 6602779
                              EG
                                                                 40
                                                                              GP
                                              F
                                                         Τ
                                                                 40
      3 PCIU 6007321
                              PΙ
                                                                              RF
                                              F
                                                         Ι
                                                                 40
     4 HALU 5642133
                              HE
                                                                              GP
                                              F
## 5
     5 TEMU 1697343
                              YM
                                                         Τ
                                                                 20
                                                                              GP
## 6
      6 UACU 3529931
                              HL
                                                         Τ
                                                                 20
                                                                              GP
      WT_Q_LOAD_PORT_C_DISC_PORT1_C_DEST_PORT_C_DISC_ABBR_VESSEL_M
##
                                                            PAC BANDA
## 1 22080
                 MYPGU
                               INCCU
## 2 22932
                  CNSHA
                               IDPWG
                                                         CMA TANCREDI
## 3 15200
                               AUMEL
                                            AUMEL
                 VNCLI
## 4 27900
                 CNTXG
                                                            AGAMEMNON
## 5 15227
                  THBKK
                               INMUN
                                            INMUN
                                                           MATHU BHUM
## 6 25000
                 MYPKG
                                                          HONOLULU BR
                               TRIST
##
     DISC_SERVICE_C LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
                                                              LOAD DT
## 1
                 PGU
                               DONG HAI
                                                    CC1 2.018081e+13
## 2
                ASC
                            MARCO P 118
                                                     IDO 2.018072e+13
## 3
                           O KUALALUMPU
                                                     AAA 2.018070e+13
## 4
                CIS
                                                                   NA
## 5
                TSB
                            CONTI CHAMP
                                                     CIS 2.018122e+13
## 6
                CIS
                              HAMBURG E
                                                     MD3 2.018093e+13
##
          DISC DT GATE OUT DT
                                  GATE IN DT LOGISTICS PARTNER DWELL DAYS
## 1 2.018080e+13
                             NA
                                           NA
                                                            <NA>
                                                                         3.1
## 2 2.018072e+13 2.018072e+13 2.018072e+13
                                                            <NA>
                                                                         7.6
## 3
                                                            <NA>
                                                                         4.3
               NA
                             NA
                                           NA
## 4 2.018092e+13 2.018092e+13
                                           NA
                                                            <NA>
                                                                         2.7
## 5 2.018121e+13
                                           NA
                                                            <NA>
                                                                         2.8
                             NA
## 6 2.018092e+13
                                                            <NA>
                                                                         9.6
                             NA
                                           NA
##
      PRODUCT COMMODITY
                                                       CARGO OWNER
## 1
       Weever
                Sea Food
                                                           Renault
## 2
        Snail
                Sea Food
                                                        Mitsubishi
## 3
        Snail
                                                        Mitsubishi
                Sea Food
## 4
      Sorubim
                Sea Food
                                              Magna International
## 5
      pumpkin Vegetables
                                                            Nissan
## 6 delicata Vegetables Aviation Industry Corporation of China
```

Selecting Observations

```
# filter for the selected record in the dataset
newdata = filter(port, CNTR_N=='TEXU 1046448')
```

```
## Warning: package 'bindrcpp' was built under R version 3.4.4
head(newdata)
               CNTR_N CNTR_OPR_C CNTR_STATUS_C PURPOSE_C LENGTH_Q CNTR_TYPE_C
                      CM
## 1 985 TEXU 1046448
                                             F
                                                        Т
                                                                 20
                                                                             OT
      WT Q LOAD PORT C DISC PORT1 C DEST PORT C DISC ABBR VESSEL M
                              REPDG
## 1 28300
                 CNTAO
                                           YTLON
                                                           APL LION
     DISC_SERVICE_C LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
                                                            LOAD_DT
## 1
                          NYK DANIELLA
                                                   MXP 2.018093e+13
                EU5
##
          DISC DT GATE OUT DT GATE IN DT BATCH ID LOGISTICS PARTNER
## 1 2.018092e+13
                           NA
                                       NA
                                            201809
                                                                 <NA>
     DWELL DAYS PRODUCT COMMODITY CARGO OWNER RF TEMP
            6.5 Oilfish Sea Food
                                         Denso
newdata = filter(port, CARGO OWNER=='Airbus')
head(newdata)
               CNTR N CNTR OPR C CNTR STATUS C PURPOSE C LENGTH Q CNTR TYPE C
##
      ID
## 1 14 CXDU 1636132
                              ON
                                              F
                                                        Τ
                                                                 20
                                                                             GP
                                              Ε
                              HL
                                                        Τ
                                                                             GP
## 2 192 TGHU 4987564
                                                                 40
                                              F
                                                                 20
                                                                             GP
## 3 225 CRSU 1225190
                              OU
                                                        Χ
## 4 350 CAIU 9035123
                              RC
                                                        Ι
                                                                 40
                                                                             GP
                                                        Т
## 5 401 00LU 1386683
                              OR
                                              Ε
                                                                 20
                                                                             GΡ
                                                                             GP
## 6 408 GESU 6499627
                              MD
                                              F
                                                        Χ
      WT_Q LOAD_PORT_C DISC_PORT1_C DEST_PORT_C DISC_ABBR_VESSEL_M
## 1 21500
                 JPUKB
                               FRFOS
                                                        MOL EMERALD
## 2 3680
                 AUSYD
                               CNSHA
                                                          AL RAWDAH
## 3 18438
                               VNHPH
                                           VNHPH
## 4 7940
                 THLCH
                                                          MOL GLOBE
## 5 2280
                 INCCU
                              THLCH
## 6 14267
                 DKAAR
                              MYTPP
                                           NLRTM
                                                       MANCHESTE MS
     DISC SERVICE C LOAD ABBR VESSEL M LOAD SERVICE C
##
                                                            LOAD DT
## 1
                JSM
                          MANHATTAN BR
                                                   MD2 2.018101e+13
## 2
                NEN
                             YM WINNER
                                                   MD3 2.018113e+13
## 3
                              KOTA JATI
                                                   VCS 2.018113e+13
## 4
                HLX
                                                                  NA
## 5
                           O KAOHSIUNG
                                                   AAA 2.018070e+13
                                                   MAE 2.018121e+13
## 6
                           HOPE ISLAND
          DISC_DT GATE_OUT_DT
                                 GATE IN DT BATCH ID LOGISTICS PARTNER
                            NA
                                               201810
## 1 2.018101e+13
                                          NA
                                                                    <NA>
## 2 2.018113e+13
                            NA
                                          NA
                                               201811
                                                                    <NA>
## 3
                                                          DSC Logistics
               NA
                            NA 2.018113e+13
                                               201811
## 4 2.018123e+13 2.018123e+13
                                          NA
                                               201812
                                                                    <NA>
               NA 2.018070e+13 2.018070e+13
## 5
                                               201807
                                                                    <NA>
## 6 2.018120e+13 2.018120e+13 2.018121e+13
                                               201812 U.S. Xpress Inc.
##
     DWELL DAYS
                   PRODUCT COMMODITY CARGO_OWNER RF_TEMP
            8.0 topinambur Vegetables
                                            Airbus
## 1
                                                        NA
## 2
            3.9 Snakehead
                             Sea Food
                                            Airbus
                                                        NA
## 3
            6.1
                  Chimaera
                              Sea Food
                                            Airbus
                                                        NA
                             Sea Food
## 4
            6.7
                      Swai
                                            Airbus
                                                        NA
```

```
Herring
                               Sea Food
                                              Airbus
             8.9
                                                           NA
## 6
                                              Airbus
                                                           NA
             5.0
                       Goby
                               Sea Food
# Multiple type of operators can be used to filter records
newdata = filter(port, is.na(RF TEMP))
head(newdata)
               CNTR N CNTR OPR C CNTR STATUS C PURPOSE C LENGTH Q CNTR TYPE C
##
     ID
## 1
      1 NYKU 9701818
                               ON
                                               F
                                                          Τ
                                                                   20
                                                                               GP
                                               F
                                                          Τ
                                                                               GP
## 2
      2 APHU 6602779
                               EG
                                                                   40
                                               F
## 3
      4 HALU 5642133
                               HE
                                                          Ι
                                                                   40
                                                                               GP
                                               F
                                                          Τ
                                                                   20
                                                                               GP
## 4
      5 TEMU 1697343
                               YM
                                               F
                                                          Т
                                                                   20
                                                                               GP
## 5
      6 UACU 3529931
                               HL
                                               F
                                                          Т
     7 SIKU 2947904
                               SA
                                                                   20
                                                                               GP
##
      WT Q LOAD PORT C DISC PORT1 C DEST PORT C DISC ABBR VESSEL M
                  MYPGU
## 1 22080
                                INCCU
                                                             PAC BANDA
                                IDPWG
## 2 22932
                  CNSHA
                                                          CMA TANCREDI
## 3 27900
                  CNTXG
                                                             AGAMEMNON
## 4 15227
                  THBKK
                                INMUN
                                             INMUN
                                                            MATHU BHUM
## 5 25000
                  MYPKG
                                TRIST
                                                           HONOLULU BR
## 6 17880
                  MYKUA
                                INNSA
                                                          SINAR BANDUN
     DISC_SERVICE_C LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
##
                                                               LOAD DT
## 1
                 PGU
                                DONG HAI
                                                      CC1 2.018081e+13
## 2
                 ASC
                             MARCO P 118
                                                      IDO 2.018072e+13
## 3
                 CIS
                                                                     NA
## 4
                 TSB
                             CONTI CHAMP
                                                      CIS 2.018122e+13
## 5
                 CIS
                               HAMBURG E
                                                      MD3 2.018093e+13
## 6
                 SGX
                              NYK ATHENA
                                                     PS3 2.018093e+13
##
          DISC DT GATE OUT DT
                                   GATE IN DT BATCH ID LOGISTICS PARTNER
## 1 2.018080e+13
                              NA
                                            NA
                                                 201808
                                                                       <NA>
## 2 2.018072e+13 2.018072e+13 2.018072e+13
                                                 201807
                                                                       <NA>
## 3 2.018092e+13 2.018092e+13
                                                 201809
                                                                       <NA>
## 4 2.018121e+13
                              NA
                                            NA
                                                 201812
                                                                       <NA>
## 5 2.018092e+13
                              NA
                                            NA
                                                 201809
                                                                       <NA>
## 6 2.018092e+13
                              NA
                                            NA
                                                 201809
                                                                       <NA>
##
     DWELL DAYS
                        PRODUCT
                                  COMMODITY
## 1
             3.1
                         Weever
                                   Sea Food
## 2
             7.6
                                   Sea Food
                          Snail
## 3
             2.7
                        Sorubim
                                   Sea Food
                        pumpkin Vegetables
## 4
             2.8
## 5
             9.6
                       delicata Vegetables
## 6
             3.5 Climbing Perch
                                   Sea Food
##
                                  CARGO_OWNER RF_TEMP
## 1
                                       Renault
                                                    NA
## 2
                                   Mitsubishi
                                                    NA
## 3
                         Magna International
                                                    NA
## 4
                                       Nissan
                                                    NA
## 5 Aviation Industry Corporation of China
                                                    NA
## 6
                                    FAW Group
                                                    NA
```

```
newdata = filter(port, WT Q > 20000)
head(newdata)
##
     ID
               CNTR_N CNTR_OPR_C CNTR_STATUS_C PURPOSE_C LENGTH_Q CNTR_TYPE_C
## 1
      1 NYKU 9701818
                               ON
                                               F
                                                          Τ
                                                                  20
                                                                               GP
                                               F
                                                          Т
      2 APHU 6602779
                               EG
                                                                  40
                                                                               GP
                                               F
## 3
      4 HALU 5642133
                               HE
                                                          Ι
                                                                  40
                                                                               GP
                                               F
                                                          Т
                                                                  20
      6 UACU 3529931
                               HL
                                                                               GP
                                               F
                                                          Т
                                                                  20
                                                                               GP
## 5
      9 PONU 0165367
                               MS
## 6 12 TCLU 3225478
                               OR
                                               F
                                                          Т
                                                                               GP
                                                                  20
      WT Q LOAD PORT C DISC PORT1 C DEST PORT C DISC ABBR VESSEL M
##
## 1 22080
                  MYPGU
                                INCCU
                                                             PAC BANDA
## 2 22932
                                IDPWG
                  CNSHA
                                                          CMA TANCREDI
## 3 27900
                  CNTXG
                                                             AGAMEMNON
## 4 25000
                  MYPKG
                                TRIST
                                                           HONOLULU BR
## 5 26433
                  MYTPP
                                MYWSP
                                                          IRENES WARWI
## 6 22458
                                             CNFOC
                  IDBUN
                                TWKHH
                                                          MARCOPOLO298
     DISC_SERVICE_C LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
##
                                                               LOAD DT
## 1
                                                     CC1 2.018081e+13
                 PGU
                                DONG HAI
## 2
                 ASC
                            MARCO P 118
                                                     IDO 2.018072e+13
## 3
                 CIS
## 4
                 CIS
                               HAMBURG E
                                                     MD3 2.018093e+13
## 5
                 SAE
                           MERATUS MEDA
                                                     SSS 2.018102e+13
## 6
                 IDO
                           OOCL JAKARTA
                                                     KT3 2.018110e+13
                    GATE_OUT_DT
                                   GATE_IN_DT BATCH_ID LOGISTICS_PARTNER
##
          DISC DT
## 1 2.018080e+13
                                            NA
                                                 201808
                                                                       <NA>
                              NA
                                                                       <NA>
## 2 2.018072e+13 2.018072e+13 2.018072e+13
                                                 201807
## 3 2.018092e+13 2.018092e+13
                                            NA
                                                 201809
                                                                       <NA>
## 4 2.018092e+13
                                            NA
                                                                       <NA>
                              NA
                                                 201809
## 5 2.018102e+13
                              NA
                                            NA
                                                 201810
                                                                       <NA>
## 6 2.018110e+13 2.018110e+13 2.018110e+13
                                                                       <NA>
                                                 201811
##
     DWELL DAYS
                  PRODUCT COMMODITY
                                                                   CARGO OWNER
## 1
            3.1
                   Weever
                             Sea Food
                                                                       Renault
## 2
            7.6
                             Sea Food
                                                                    Mitsubishi
                    Snail
                                                           Magna International
## 3
            2.7
                  Sorubim
                            Sea Food
## 4
            9.6 delicata Vegetables Aviation Industry Corporation of China
## 5
            6.6
                    Porgy
                             Sea Food
                                                                   Continental
                             Sea Food
## 6
            7.0
                     Cusk
                                                                           Dell
##
     RF_TEMP
## 1
          NA
## 2
          NA
## 3
          NA
## 4
          NA
## 5
          NA
## 6
          NA
```

Creating/Recoding variables

```
# changes the weight to ton
newdata = mutate(port, WT_Q = WT_Q/1000)
head(newdata)
```

```
ID CNTR N CNTR OPR C CNTR STATUS C PURPOSE C LENGTH Q CNTR TYPE C
      1 NYKU 9701818
                               ON
                                               F
                                                                  20
                                                                               GP
## 1
                                                          Τ
                                               F
                                                          Т
                                                                               GΡ
      2 APHU 6602779
                               EG
                                                                  40
      3 PCIU 6007321
                                               F
## 3
                               ΡI
                                                          Т
                                                                  40
                                                                               RF
                                               F
                                                          Ι
      4 HALU 5642133
                               HE
                                                                  40
                                                                               GP
                                               F
                                                          Τ
                                                                  20
## 5
      5 TEMU 1697343
                               YM
                                                                               GP
                                               F
      6 UACU 3529931
                               HL
                                                          Т
                                                                  20
                                                                               GP
       WT_Q LOAD_PORT_C DISC_PORT1_C DEST_PORT_C DISC_ABBR_VESSEL_M
##
## 1 22.080
                   MYPGU
                                 INCCU
                                                              PAC BANDA
## 2 22.932
                   CNSHA
                                 IDPWG
                                                           CMA TANCREDI
## 3 15.200
                   VNCLI
                                 AUMEL
                                              AUMEL
## 4 27.900
                   CNTXG
                                                              AGAMEMNON
## 5 15.227
                                 INMUN
                                              INMUN
                   THBKK
                                                             MATHU BHUM
## 6 25.000
                   MYPKG
                                 TRIST
                                                            HONOLULU BR
     DISC_SERVICE_C LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
##
                                                               LOAD_DT
## 1
                 PGU
                                DONG HAI
                                                     CC1 2.018081e+13
## 2
                 ASC
                            MARCO P 118
                                                     IDO 2.018072e+13
## 3
                           O KUALALUMPU
                                                     AAA 2.018070e+13
## 4
                 CIS
## 5
                 TSB
                             CONTI CHAMP
                                                     CIS 2.018122e+13
## 6
                                                     MD3 2.018093e+13
                 CIS
                               HAMBURG E
##
          DISC DT
                    GATE_OUT_DT
                                   GATE_IN_DT BATCH_ID LOGISTICS_PARTNER
                                                 201808
## 1 2.018080e+13
                              NA
                                            NA
                                                                       <NA>
## 2 2.018072e+13 2.018072e+13 2.018072e+13
                                                 201807
                                                                       <NA>
## 3
                NA
                                                 201807
                                                                       <NA>
## 4 2.018092e+13 2.018092e+13
                                            NA
                                                 201809
                                                                       <NA>
## 5 2.018121e+13
                                            NA
                                                 201812
                                                                       <NA>
## 6 2.018092e+13
                              NA
                                           NA
                                                 201809
                                                                       <NA>
     DWELL DAYS
##
                  PRODUCT
                           COMMODITY
                                                                    CARGO OWNER
## 1
            3.1
                   Weever
                            Sea Food
                                                                        Renault
## 2
            7.6
                    Snail
                            Sea Food
                                                                    Mitsubishi
## 3
            4.3
                            Sea Food
                    Snail
                                                                    Mitsubishi
## 4
            2.7
                  Sorubim
                            Sea Food
                                                           Magna International
            2.8 pumpkin Vegetables
            9.6 delicata Vegetables Aviation Industry Corporation of China
## 6
     RF TEMP
##
## 1
          NA
## 2
          NA
## 3
           8
## 4
          NA
## 5
          NA
## 6
          NA
# create a new variable to store weight in ton
newdata = mutate(port, WT_Q_TON = WT_Q/1000)
head(newdata)
               CNTR N CNTR OPR C CNTR STATUS C PURPOSE C LENGTH Q CNTR TYPE C
##
                                               F
                               ON
                                                                  20
                                                                               GP
## 1
      1 NYKU 9701818
                                                          Τ
                                               F
                               EG
                                                          Τ
## 2 2 APHU 6602779
                                                                  40
                                                                               GP
```

```
3 PCIU 6007321
                               PΙ
                                                                  40
                                                                               RF
                                               F
                                                          Ι
                                                                  40
                                                                               GP
                               HE
      4 HALU 5642133
                               ΥM
                                               F
                                                          Т
                                                                  20
                                                                               GP
## 5
      5 TEMU 1697343
                                               F
                                                          Т
## 6
     6 UACU 3529931
                               HL
                                                                  20
                                                                               GP
      WT_Q_LOAD_PORT_C_DISC_PORT1_C_DEST_PORT_C_DISC_ABBR_VESSEL_M
##
                                INCCU
## 1 22080
                  MYPGU
                                                             PAC BANDA
## 2 22932
                  CNSHA
                                IDPWG
                                                          CMA TANCREDI
## 3 15200
                  VNCLI
                                AUMEL
                                             AUMEL
## 4 27900
                  CNTXG
                                                             AGAMEMNON
## 5 15227
                  THBKK
                                INMUN
                                             INMUN
                                                            MATHU BHUM
## 6 25000
                  MYPKG
                                TRIST
                                                           HONOLULU BR
     DISC SERVICE C LOAD ABBR VESSEL M LOAD SERVICE C
##
                                                               LOAD DT
## 1
                 PGU
                                DONG HAI
                                                     CC1 2.018081e+13
## 2
                 ASC
                             MARCO P 118
                                                     IDO 2.018072e+13
## 3
                           O KUALALUMPU
                                                     AAA 2.018070e+13
## 4
                 CIS
## 5
                 TSB
                             CONTI CHAMP
                                                     CIS 2.018122e+13
## 6
                                                     MD3 2.018093e+13
                 CIS
                               HAMBURG E
##
          DISC DT GATE OUT DT
                                   GATE IN DT BATCH ID LOGISTICS PARTNER
                                                 201808
## 1 2.018080e+13
                              NA
                                            NA
                                                                       <NA>
## 2 2.018072e+13 2.018072e+13 2.018072e+13
                                                 201807
                                                                       <NA>
## 3
                NΑ
                              NA
                                            NA
                                                 201807
                                                                       <NA>
## 4 2.018092e+13 2.018092e+13
                                            NA
                                                 201809
                                                                       <NA>
## 5 2.018121e+13
                                           NA
                                                 201812
                                                                       <NA>
                              NA
## 6 2.018092e+13
                              NA
                                           NA
                                                 201809
                                                                       <NA>
##
     DWELL_DAYS
                  PRODUCT
                           COMMODITY
                                                                   CARGO_OWNER
## 1
            3.1
                   Weever
                            Sea Food
                                                                       Renault
## 2
            7.6
                    Snail
                             Sea Food
                                                                    Mitsubishi
## 3
            4.3
                    Snail
                            Sea Food
                                                                    Mitsubishi
## 4
            2.7
                  Sorubim
                            Sea Food
                                                           Magna International
## 5
                  pumpkin Vegetables
            2.8
                                                                         Nissan
## 6
            9.6 delicata Vegetables Aviation Industry Corporation of China
##
     RF_TEMP_WT_Q_TON
## 1
          NA
                22.080
## 2
          NA
                22.932
## 3
           8
                15.200
## 4
          NA
                27.900
## 5
          NA
                15.227
## 6
          NA
                25.000
# create a new flag to indicate heavy containers
newdata = mutate(port, HEAVY_FLAG = ifelse(WT_Q > 20000,
                                        "Heavy",
                                        "Not Heavy"))
head(newdata)
##
              CNTR_N CNTR_OPR_C CNTR_STATUS_C PURPOSE_C LENGTH_Q CNTR_TYPE_C
     ID
      1 NYKU 9701818
                               ON
                                               F
                                                          Т
                                                                  20
                                                                               GP
                                               F
                                                          Т
## 2
      2 APHU 6602779
                               EG
                                                                  40
                                                                               GP
## 3 3 PCIU 6007321
                                                                  40
                               PΙ
                                                                               RF
```

```
## 4 4 HALU 5642133
                              HE
                                                                 40
                                                                              GP
                                              F
                                                         Τ
                                                                 20
                              YΜ
                                                                              GP
## 5 5 TEMU 1697343
                                              F
                                                         Т
                                                                              GP
## 6 6 UACU 3529931
                              HL
                                                                 20
      WT Q LOAD PORT C DISC PORT1 C DEST PORT C DISC ABBR VESSEL M
##
## 1 22080
                 MYPGU
                               INCCU
                                                            PAC BANDA
## 2 22932
                  CNSHA
                               IDPWG
                                                         CMA TANCREDI
## 3 15200
                 VNCLI
                               AUMEL
                                            AUMEL
## 4 27900
                  CNTXG
                                                            AGAMEMNON
## 5 15227
                  THBKK
                               INMUN
                                            INMUN
                                                           MATHU BHUM
## 6 25000
                 MYPKG
                               TRIST
                                                          HONOLULU BR
     DISC_SERVICE_C LOAD_ABBR_VESSEL_M LOAD_SERVICE_C
##
                                                              LOAD DT
## 1
                PGU
                               DONG HAI
                                                     CC1 2.018081e+13
## 2
                ASC
                            MARCO P 118
                                                     IDO 2.018072e+13
## 3
                           O KUALALUMPU
                                                     AAA 2.018070e+13
## 4
                CIS
                                                                   NA
## 5
                TSB
                            CONTI CHAMP
                                                     CIS 2.018122e+13
## 6
                CIS
                              HAMBURG E
                                                     MD3 2.018093e+13
##
          DISC DT GATE OUT DT
                                   GATE IN DT BATCH ID LOGISTICS PARTNER
## 1 2.018080e+13
                             NA
                                           NA
                                                201808
                                                                      <NA>
## 2 2.018072e+13 2.018072e+13 2.018072e+13
                                                201807
                                                                      <NA>
## 3
                                                201807
                                                                      <NA>
               NA
                             NA
                                           NA
## 4 2.018092e+13 2.018092e+13
                                           NA
                                                201809
                                                                      <NA>
## 5 2.018121e+13
                             NA
                                           NA
                                                201812
                                                                      <NA>
## 6 2.018092e+13
                                           NA
                                                201809
                                                                      <NA>
                             NA
     DWELL DAYS PRODUCT COMMODITY
                                                                  CARGO OWNER
## 1
            3.1
                  Weever
                            Sea Food
                                                                       Renault
## 2
            7.6
                    Snail
                            Sea Food
                                                                   Mitsubishi
            4.3
## 3
                    Snail
                            Sea Food
                                                                   Mitsubishi
## 4
            2.7
                 Sorubim
                            Sea Food
                                                          Magna International
## 5
            2.8 pumpkin Vegetables
                                                                        Nissan
            9.6 delicata Vegetables Aviation Industry Corporation of China
## 6
##
     RF_TEMP HEAVY_FLAG
## 1
          NA
                  Heavy
## 2
          NA
                   Heavy
## 3
           8
              Not Heavy
## 4
          NA
                   Heavy
## 5
          NA
              Not Heavy
## 6
          NA
                   Heavy
```

Summarizing Data

```
newdata = summarise(newdata, MEAN LENGTH = mean(LENGTH Q, na.rm=TRUE),
                     MEAN WEIGHT = mean(WT Q, na.rm=TRUE))
newdata
## # A tibble: 26 x 3
      COMMODITY
                      MEAN_LENGTH MEAN_WEIGHT
##
      <fct>
                             <dbl>
                                         <dbl>
##
  1 Adhesive
                              29.3
                                        20584.
## 2 Biscuit
                              31.0
                                        19735.
## 3 Chemicals
                              29.5
                                        17702.
## 4 Confectionaries
                              30.2
                                        15466.
## 5 Dairy
                              27.4
                                        17438.
## 6 Diary
                              30.9
                                        18370.
## 7 Drink
                              30.9
                                        19969.
## 8 Eggs
                              27.5
                                        16272.
## 9 Films
                              33.6
                                        15314.
## 10 Flowers
                              30.6
                                        18471.
## # ... with 16 more rows
```

Missing Data

```
# what is the proportion of missing data for each variable
Percent Miss <- colSums(is.na(port))/nrow(port)</pre>
as.data.frame(Percent Miss)
##
                       Percent Miss
## ID
                       0.0000000000
## CNTR N
                       0.0000000000
## CNTR_OPR_C
                       0.0000000000
## CNTR STATUS C
                       0.0000000000
## PURPOSE C
                       0.0000000000
## LENGTH_Q
                       0.0000000000
## CNTR_TYPE_C
                       0.0000000000
## WT_Q
                       0.0000000000
## LOAD PORT C
                       0.0000000000
## DISC PORT1 C
                       0.0000000000
## DEST PORT C
                       0.0000000000
## DISC_ABBR_VESSEL_M 0.0000000000
## DISC SERVICE C
                       0.0000000000
## LOAD ABBR VESSEL M 0.0000000000
## LOAD SERVICE C
                       0.0000000000
## LOAD DT
                       0.1895065309
## DISC DT
                       0.1984677855
## GATE_OUT_DT
                       0.8108135139
## GATE_IN_DT
                       0.8138539396
## BATCH ID
                       0.0000000000
## LOGISTICS PARTNER
                      0.9357510051
## DWELL DAYS
                       0.0000000000
## PRODUCT
                       0.0002600364
## COMMODITY
                      0.0002600364
```

CARGO_OWNER ## RF_TEMP

0.0002600364
0.9395715400

End of the Script