# Datacamp\_Importing & Cleaning Data in R: Case Studies\_\_MBTA Ridership Data

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Using readxl

```
# Load readxl
library(readxl)
# Import mbta.xlsx and skip first row: mbta
mbta<-read_excel("data/mbta.xlsx",skip = 1)</pre>
## New names:
## * `` -> ...1
Examining the data
# View the structure of mbta
str(mbta)
## Classes 'tbl_df', 'tbl' and 'data.frame':
                                                11 obs. of 60 variables:
           : num 1 2 3 4 5 6 7 8 9 10 ...
           : chr "All Modes by Qtr" "Boat" "Bus" "Commuter Rail" ...
   $ mode
   $ 2007-01: chr "NA" "4" "335.819" "142.2" ...
   $ 2007-02: chr "NA" "3.6" "338.675" "138.5" ...
   $ 2007-03: num 1188 40 340 138 459 ...
   $ 2007-04: chr "NA" "4.3" "352.162" "139.5" ...
   $ 2007-05: chr "NA" "4.9" "354.367" "139" ...
   $ 2007-06: num 1246 5.8 350.5 143 477 ...
##
   $ 2007-07: chr
                   "NA" "6.521" "357.519" "142.391" ...
   $ 2007-08: chr "NA" "6.572" "355.479" "142.364" ...
##
  $ 2007-09: num 1256.57 5.47 372.6 143.05 499.57 ...
   $ 2007-10: chr
                   "NA" "5.145" "368.847" "146.542" ...
   $ 2007-11: chr "NA" "3.763" "330.826" "145.089" ...
  $ 2007-12: num 1216.89 2.98 312.92 141.59 448.27 ...
   $ 2008-01: chr
                   "NA" "3.175" "340.324" "142.145" ...
                   "NA" "3.111" "352.905" "142.607" ...
##
   $ 2008-02: chr
   $ 2008-03: num
##
                   1253.52 3.51 361.15 137.45 494.05 ...
  $ 2008-04: chr
                   "NA" "4.164" "368.189" "140.389" ...
                   "NA" "4.015" "363.903" "142.585" ...
##
  $ 2008-05: chr
   $ 2008-06: num
                   1314.82 5.19 362.96 142.06 518.35 ...
                   "NA" "6.016" "370.921" "145.731" ...
   $ 2008-07: chr
   $ 2008-08: chr
                   "NA" "5.8" "361.057" "144.565" ...
   $ 2008-09: num 1307.04 4.59 389.54 141.91 517.32 ...
   $ 2008-10: chr
                   "NA" "4.285" "357.974" "151.957" ...
   $ 2008-11: chr "NA" "3.488" "345.423" "152.952" ...
  $ 2008-12: num 1232.65 3.01 325.77 140.81 446.74 ...
   $ 2009-01: chr "NA" "3.014" "338.532" "141.448" ...
```

```
$ 2009-02: chr
                   "NA" "3.196" "360.412" "143.529" ...
##
   $ 2009-03: num
                   1209.79 3.33 353.69 142.89 467.22 ...
   $ 2009-04: chr
                   "NA" "4.049" "359.38" "142.34" ...
                   "NA" "4.119" "354.75" "144.225" ...
##
   $ 2009-05: chr
   $ 2009-06: num
                   1233.1 4.9 347.9 142 473.1 ...
##
   $ 2009-07: chr
                   "NA" "6.444" "339.477" "137.691" ...
   $ 2009-08: chr
                   "NA" "5.903" "332.661" "139.158" ...
   $ 2009-09: num
##
                   1230.5 4.7 374.3 139.1 500.4 ...
##
   $ 2009-10: chr
                    "NA" "4.212" "385.868" "137.104" ...
##
                   "NA" "3.576" "366.98" "129.343" ...
   $ 2009-11: chr
   $ 2009-12: num
                   1207.85 3.11 332.39 126.07 440.93 ...
                    "NA" "3.207" "362.226" "130.91" ...
##
   $ 2010-01: chr
                   "NA" "3.195" "361.138" "131.918" ...
   $ 2010-02: chr
## $ 2010-03: num 1208.86 3.48 373.44 131.25 483.4 ...
   $ 2010-04: chr
                    "NA" "4.452" "378.611" "131.722" ...
##
   $ 2010-05: chr
                    "NA" "4.415" "380.171" "128.8" ...
##
   $ 2010-06: num
                   1244.41 5.41 363.27 129.14 490.26 ...
##
   $ 2010-07: chr
                   "NA" "6.513" "353.04" "122.935" ...
  $ 2010-08: chr
                   "NA" "6.269" "343.688" "129.732" ...
##
##
   $ 2010-09: num
                   1225.5 4.7 381.6 132.9 521.1 ...
##
   $ 2010-10: chr
                   "NA" "4.402" "384.987" "131.033" ...
  $ 2010-11: chr
                   "NA" "3.731" "367.955" "130.889" ...
##
   $ 2010-12: num 1216.26 3.16 326.34 121.42 450.43 ...
   $ 2011-01: chr
                   "NA" "3.14" "334.958" "128.396" ...
## $ 2011-02: chr "NA" "3.284" "346.234" "125.463" ...
  $ 2011-03: num 1223.45 3.67 380.4 134.37 516.73 ...
                   "NA" "4.251" "380.446" "134.169" ...
##
   $ 2011-04: chr
                   "NA" "4.431" "385.289" "136.14" ...
   $ 2011-05: chr
## $ 2011-06: num 1302.41 5.47 376.32 135.58 529.53 ...
                   "NA" "6.581" "361.585" "132.41" ...
## $ 2011-07: chr
                   "NA" "6.733" "353.793" "130.616" ...
##
   $ 2011-08: chr
##
   $ 2011-09: num 1291 5 388 137 550 ...
   $ 2011-10: chr "NA" "4.484" "398.456" "128.72" ...
# View the first 6 rows of mbta
```

### head(mbta, n=6)

```
## # A tibble: 6 x 60
      ...1 mode `2007-01` `2007-02` `2007-03` `2007-04` `2007-05` `2007-06`
##
     <dbl> <chr> <chr>
                           <chr>>
                                         <dbl> <chr>
                                                          <chr>
                                                                        <dbl>
## 1
        1 All ~ NA
                           NA
                                         1188. NA
                                                          NA
                                                                       1246.
## 2
         2 Boat 4
                           3.6
                                           40 4.3
                                                          4.9
                                                                          5.8
                 335.819
                                          340. 352.162
## 3
         3 Bus
                           338.675
                                                          354.367
                                                                        351.
## 4
         4 Comm~ 142.2
                           138.5
                                          138. 139.5
                                                          139
                                                                        143
## 5
         5 Heav~ 435.294
                           448.271
                                          459. 472.201
                                                          474.579
                                                                        477.
                           240.262
                                          241. 255.557
## 6
         6 Ligh~ 227.231
                                                          248.262
                                                                        246.
    ... with 52 more variables: `2007-07` <chr>, `2007-08` <chr>,
       '2007-09' <dbl>, '2007-10' <chr>, '2007-11' <chr>, '2007-12' <dbl>,
## #
      `2008-01` <chr>, `2008-02` <chr>, `2008-03` <dbl>, `2008-04` <chr>,
       `2008-05` <chr>, `2008-06` <dbl>, `2008-07` <chr>, `2008-08` <chr>,
## #
       `2008-09` <dbl>, `2008-10` <chr>, `2008-11` <chr>, `2008-12` <dbl>,
## #
       `2009-01` <chr>, `2009-02` <chr>, `2009-03` <dbl>, `2009-04` <chr>,
## #
      `2009-05` <chr>, `2009-06` <dbl>, `2009-07` <chr>, `2009-08` <chr>,
## #
      `2009-09` <dbl>, `2009-10` <chr>, `2009-11` <chr>, `2009-12` <dbl>,
## #
```

```
`2010-01` <chr>, `2010-02` <chr>, `2010-03` <dbl>, `2010-04` <chr>,
## #
      `2010-05` <chr>, `2010-06` <dbl>, `2010-07` <chr>, `2010-08` <chr>,
## #
      `2010-09` <dbl>, `2010-10` <chr>, `2010-11` <chr>, `2010-12` <dbl>,
## #
      `2011-01` <chr>, `2011-02` <chr>, `2011-03` <dbl>, `2011-04` <chr>,
      `2011-05` <chr>, `2011-06` <dbl>, `2011-07` <chr>, `2011-08` <chr>,
## #
## #
      `2011-09` <dbl>, `2011-10` <chr>
# View a summary of mbta
summary(mbta)
                                      2007-01
                                                         2007-02
##
        ...1
                      mode
## Min. : 1.0
                  Length:11
                                    Length:11
                                                       Length:11
   1st Qu.: 3.5
                  Class :character
                                    Class :character
                                                       Class : character
##
  Median: 6.0
                  Mode :character
                                    Mode :character
                                                       Mode :character
  Mean : 6.0
##
   3rd Qu.: 8.5
##
   Max. :11.0
      2007-03
                        2007-04
                                          2007-05
##
  Min. : 0.114
                      Length:11
                                        Length:11
   1st Qu.: 9.278
##
                      Class : character
                                        Class : character
   Median: 137.700
                      Mode :character
                                        Mode : character
##
  Mean : 330.293
   3rd Qu.: 399.225
  Max. :1204.725
##
      2007-06
                        2007-07
                                          2007-08
##
## Min. : 0.096
                      Length:11
                                        Length:11
   1st Qu.: 5.700
                      Class :character
                                        Class : character
   Median: 143.000
                      Mode :character
                                        Mode :character
##
##
   Mean : 339.846
##
   3rd Qu.: 413.788
##
  Max. :1246.129
      2007-09
##
                        2007-10
                                          2007-11
##
  Min. : -0.007
                      Length:11
                                        Length:11
   1st Qu.: 5.539
                      Class : character
                                        Class : character
  Median : 143.051
                      Mode :character
                                        Mode :character
##
##
   Mean : 352.554
##
   3rd Qu.: 436.082
   Max. :1310.764
##
      2007-12
                        2008-01
                                          2008-02
         : -0.060
##
  Min.
                     Length:11
                                        Length:11
##
  1st Qu.: 4.385
                      Class : character
                                        Class : character
## Median : 141.585
                      Mode :character
                                        Mode :character
   Mean : 321.588
##
   3rd Qu.: 380.594
##
   Max. :1216.890
##
##
      2008-03
                        2008-04
                                          2008-05
##
  Min.
         : 0.058
                      Length:11
                                        Length:11
   1st Qu.: 5.170
##
                      Class : character
                                        Class : character
  Median : 137.453
                      Mode :character
                                        Mode :character
## Mean : 345.604
##
   3rd Qu.: 427.601
   Max. :1274.031
##
```

2008-08

Length:11

2008-07

Length:11

##

2008-06

## Min. : 0.060

```
## 1st Qu.: 5.742
                     Class : character
                                       Class : character
## Median : 142.057
                     Mode :character
                                       Mode :character
## Mean : 359.667
   3rd Qu.: 440.656
##
  Max. :1320.728
##
      2008-09
                       2008-10
                                         2008-11
## Min. : 0.021
                     Length:11
                                       Length:11
  1st Qu.: 5.691
                     Class : character
                                       Class : character
##
   Median: 141.907
                     Mode :character
                                       Mode : character
## Mean : 362.099
   3rd Qu.: 453.430
## Max. :1338.015
      2008-12
                       2009-01
                                         2009-02
## Min. : -0.015
                     Length:11
                                       Length:11
  1st Qu.: 4.689
                     Class :character
                                       Class :character
## Median : 140.810
                     Mode :character
                                       Mode :character
## Mean : 319.882
  3rd Qu.: 386.255
## Max. :1232.655
                       2009-04
      2009-03
##
                                         2009-05
## Min. : -0.050
                     Length:11
                                       Length:11
  1st Qu.: 5.003
                     Class : character
                                       Class : character
## Median : 142.893
                     Mode :character
                                       Mode :character
## Mean : 330.142
## 3rd Qu.: 410.455
  Max. :1210.912
##
      2009-06
                       2009-07
                                         2009-08
## Min. : -0.079
                     Length:11
                                       Length:11
  1st Qu.: 5.845
                     Class :character
                                       Class : character
## Median : 142.006
                     Mode :character
                                       Mode :character
## Mean : 333.194
   3rd Qu.: 410.482
##
  Max. :1233.085
##
      2009-09
                       2009-10
                                         2009-11
## Min. : -0.035
                     Length:11
                                       Length:11
  1st Qu.: 5.693
                     Class : character
                                       Class : character
## Median : 139.087
                     Mode :character
                                       Mode :character
## Mean : 346.687
   3rd Qu.: 437.332
   Max. :1291.564
##
##
      2009-12
                       2010-01
                                         2010-02
## Min. : -0.022
                     Length:11
                                       Length:11
  1st Qu.: 4.784
                     Class :character
                                       Class :character
## Median : 126.066
                     Mode :character
                                       Mode :character
## Mean : 312.962
## 3rd Qu.: 386.659
   Max. :1207.845
##
##
      2010-03
                       2010-04
                                         2010-05
## Min. : 0.012
                     Length:11
                                       Length:11
## 1st Qu.: 5.274
                     Class : character
                                       Class : character
## Median : 131.252
                     Mode :character
                                       Mode :character
## Mean : 332.726
## 3rd Qu.: 428.420
## Max. :1225.556
```

```
2010-07
                                          2010-08
##
      2010-06
##
   Min. : 0.008
                     Length:11
                                       Length:11
   1st Qu.:
              6.436
                     Class :character
                                       Class : character
  Median : 129.144
                     Mode :character
                                       Mode :character
##
##
   Mean
         : 335.964
##
   3rd Qu.: 426.769
##
   Max.
         :1244.409
      2010-09
                       2010-10
                                          2010-11
##
##
   Min.
        : 0.001
                     Length:11
                                       Length:11
##
              5.567
                                       Class :character
   1st Qu.:
                     Class : character
  Median : 132.892
                     Mode :character
                                       Mode :character
  Mean : 346.524
##
   3rd Qu.: 451.361
##
##
  Max.
         :1293.117
##
      2010-12
                       2011-01
                                          2011-02
##
   Min. : -0.004
                     Length:11
                                       Length:11
##
   1st Qu.:
              4.466
                     Class :character
                                       Class :character
##
  Median : 121.422
                     Mode :character
                                       Mode :character
##
  Mean
         : 312.917
   3rd Qu.: 388.385
##
         :1216.262
##
  Max.
##
      2011-03
                      2011-04
                                        2011-05
##
  Min. : 0.05
                    Length:11
                                       Length:11
   1st Qu.:
              6.03
                    Class :character
                                     Class : character
##
##
  Median : 134.37
                    Mode :character Mode :character
  Mean : 345.17
##
   3rd Qu.: 448.56
   Max. :1286.66
##
##
      2011-06
                       2011-07
                                          2011-08
##
  Min. : 0.054
                     Length:11
                                       Length:11
  1st Qu.:
##
              6.926
                     Class : character
                                       Class : character
## Median : 135.581
                     Mode :character
                                       Mode :character
  Mean : 353.331
##
##
  3rd Qu.: 452.923
## Max. :1302.414
      2011-09
##
                       2011-10
## Min. : 0.043
                     Length:11
## 1st Qu.: 6.660
                     Class : character
## Median : 136.901
                     Mode :character
## Mean : 362.555
## 3rd Qu.: 469.204
## Max. :1348.754
```

Removing unnecessary rows and columns

```
# Remove rows 1, 7, and 11 of mbta: mbta2
mbta2 <- mbta[-c(1,7,11),]

# Remove the first column of mbta2: mbta3
mbta3 <- mbta2[,-1]</pre>
```

Observations are stored in columns

```
# Load tidyr
library(tidyr)
# Gather columns of mbta3: mbta4
mbta4 <- gather(mbta3, month,thou_riders,-mode)</pre>
# View the head of mbta4
head(mbta4)
## # A tibble: 6 x 3
## mode
           month thou_riders
    <chr>
                <chr>
##
                         <chr>
                2007-01 4
## 1 Boat
## 2 Bus
                 2007-01 335.819
## 3 Commuter Rail 2007-01 142.2
## 4 Heavy Rail 2007-01 435.294
## 5 Light Rail 2007-01 227.231
## 6 Private Bus 2007-01 4.772
Type conversions
# Coerce thou_riders to numeric
mbta4$thou_riders <- as.numeric(mbta4$thou_riders)</pre>
Variables are stored in both rows and columns
# Spread the contents of mbta4: mbta5
mbta5 <- spread(mbta4, mode,thou_riders)</pre>
# View the head of mbta5
head(mbta5)
## # A tibble: 6 x 9
    month Boat Bus 'Commuter Rail' 'Heavy Rail' 'Light Rail' 'Private Bus'
##
##
    <chr> <dbl> <dbl>
                               <dbl>
                                            <dbl>
                                                   <dbl>
                                                                      <dbl>
## 1 2007~ 4
                 336.
                               142.
                                            435.
                                                        227.
                                                                       4.77
## 2 2007~
          3.6 339.
                               138.
                                            448.
                                                        240.
                                                                       4.42
## 3 2007~ 40
                 340.
                                138.
                                             459.
                                                         241.
                                                                       4.57
## 4 2007~
           4.3 352.
                                140.
                                             472.
                                                          256.
                                                                       4.54
## 5 2007~
          4.9 354.
                                139
                                             475.
                                                          248.
                                                                       4.77
## 6 2007~ 5.8 351.
                                143
                                             477.
                                                          246.
                                                                       4.72
## # ... with 2 more variables: RIDE <dbl>, `Trackless Trolley` <dbl>
Separating columns
# View the head of mbta5
head(mbta5)
## # A tibble: 6 x 9
## month Boat Bus `Commuter Rail` `Heavy Rail` `Light Rail` `Private Bus`
##
   <chr> <dbl> <dbl>
                               <dbl>
                                            <dbl>
                                                   <dbl>
                                                                      <dbl>
```

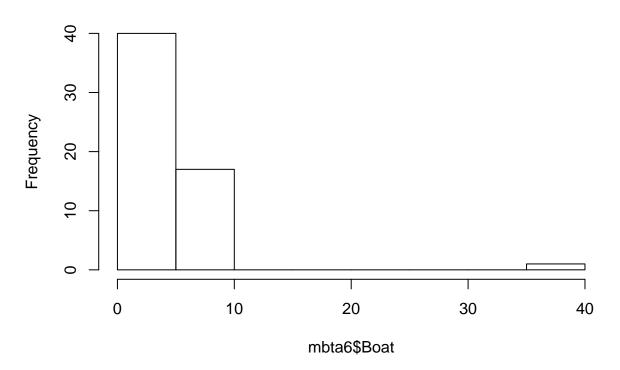
```
## 1 2007~
                                                435.
                                                             227.
                                                                           4.77
            4
                  336.
                                  142.
## 2 2007~
            3.6 339.
                                  138.
                                               448.
                                                             240.
                                                                           4.42
                  340.
                                  138.
                                               459.
                                                             241.
## 3 2007~ 40
                                                                           4.57
## 4 2007~
            4.3 352.
                                  140.
                                                472.
                                                             256.
                                                                           4.54
## 5 2007~
             4.9
                  354.
                                  139
                                                475.
                                                             248.
                                                                           4.77
## 6 2007~
             5.8 351.
                                  143
                                                477.
                                                             246.
                                                                           4.72
## # ... with 2 more variables: RIDE <dbl>, `Trackless Trolley` <dbl>
# Split month column into month and year: mbta6
mbta6 <- separate(mbta5,month,c("year","month"))</pre>
# View the head of mbta6
head(mbta6)
## # A tibble: 6 x 10
    year month Boat
                         Bus `Commuter Rail` `Heavy Rail` `Light Rail`
##
     <chr> <chr> <dbl> <dbl>
                                       <dbl>
                                                     <dbl>
                                                                  <dbl>
## 1 2007 01
                   4
                        336.
                                        142.
                                                      435.
                                                                   227.
## 2 2007 02
                   3.6 339.
                                        138.
                                                      448.
                                                                   240.
## 3 2007 03
                  40
                        340.
                                        138.
                                                      459.
                                                                   241.
## 4 2007 04
                  4.3 352.
                                                      472.
                                                                   256.
                                         140.
## 5 2007 05
                   4.9
                        354.
                                         139
                                                      475.
                                                                   248.
## 6 2007 06
                   5.8 351.
                                        143
                                                      477.
                                                                   246.
## # ... with 3 more variables: `Private Bus` <dbl>, RIDE <dbl>, `Trackless
       Trolley` <dbl>
```

Do your values seem reasonable?

## # View a summary of mbta6 summary(mbta6)

```
##
                       month
                                          Boat
                                                          Bus
       year
##
  Length:58
                    Length:58
                                      Min. : 2.985
                                                     Min.
                                                            :312.9
  1st Qu.: 3.494
                                                     1st Qu.:345.6
                                      Median : 4.293
##
  Mode :character Mode :character
                                                     Median :359.9
##
                                      Mean
                                           : 5.068
                                                     Mean
                                                            :358.6
##
                                      3rd Qu.: 5.356
                                                     3rd Qu.:372.2
##
                                      Max.
                                            :40.000
                                                     Max.
                                                            :398.5
##
   Commuter Rail
                   Heavy Rail
                                  Light Rail
                                                Private Bus
##
  Min.
         :121.4
                 Min.
                       :435.3
                                Min. :194.4
                                               Min.
                                                     :2.213
  1st Qu.:131.4
                 1st Qu.:471.1
                                1st Qu.:220.6
                                               1st Qu.:2.641
## Median :138.8
                 Median :487.3
                                Median :231.9
                                               Median :2.820
## Mean
        :137.4
                 Mean :489.3
                                Mean
                                      :233.0
                                               Mean
                                                     :3.352
##
   3rd Qu.:142.4
                  3rd Qu.:511.3
                                3rd Qu.:244.5
                                               3rd Qu.:4.167
##
  Max.
         :153.0
                  Max.
                        :554.9
                                Max.
                                       :271.1
                                               Max. :4.878
##
        RIDE
                  Trackless Trolley
         :4.900
                        : 5.777
## Min.
                  Min.
  1st Qu.:5.965
##
                 1st Qu.:11.679
## Median :6.615
                 Median :12.598
## Mean :6.604
                  Mean :12.125
## 3rd Qu.:7.149
                  3rd Qu.:13.320
## Max. :8.598
                 Max. :15.109
```

#### Histogram of mbta6\$Boat



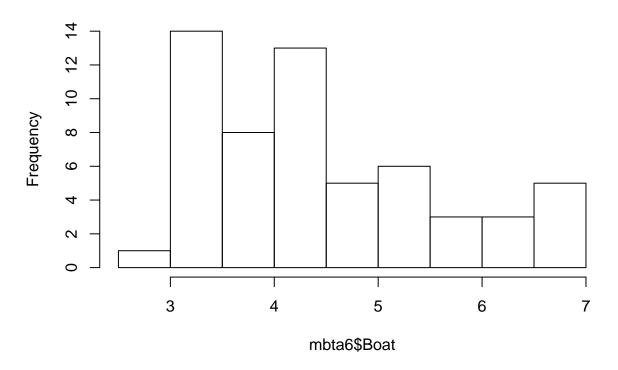
Dealing with entry error

```
# Find the row number of the incorrect value: i
i <- which(mbta6$Boat > 15)

# Replace the incorrect value with 4
mbta6$Boat[i] <- 4

# Generate a histogram of Boat column
hist(mbta6$Boat)</pre>
```

#### Histogram of mbta6\$Boat



```
# # Look at Boat and Trackless Trolley ridership over time (don't change)
# ggplot(mbta\_boat, aes(x = month, y = thou\_riders, col = mode)) + geom\_point() +
# scale\_x\_discrete(name = "Month", breaks = c(200701, 200801, 200901, 201001, 201101)) +
# scale\_y\_continuous(name = "Avg Weekday Ridership (thousands)")
# # Look at all T ridership over time (don't change)
# ggplot(mbta\_all, aes(x = month, y = thou\_riders, col = mode)) + geom\_point() +
# scale\_x\_discrete(name = "Month", breaks = c(200701, 200801, 200901, 201001, 201101)) +
# scale\_y\_continuous(name = "Avg Weekday Ridership (thousands)")
```