Lab 9

Burhan Ahmed Hanif 11:59PM April 14, 2019

"data wrangling / munging / carpentry" with dplyr.

First load dplyr, tidyr, magrittr and lubridate in one line.

```
rm(list = ls())
pacman::p_load(dplyr, tidyr, magrittr, lubridate)
## Installing package into 'C:/Users/burha/Documents/R/win-library/3.6'
## (as 'lib' is unspecified)
## Warning: unable to access index for repository http://www.stats.ox.ac.uk/pub/RWin/bin/windows/contri
     cannot open URL 'http://www.stats.ox.ac.uk/pub/RWin/bin/windows/contrib/3.6/PACKAGES'
## package 'tidyr' successfully unpacked and MD5 sums checked
##
## The downloaded binary packages are in
  C:\Users\burha\AppData\Local\Temp\Rtmpmw9d97\downloaded_packages
##
## tidyr installed
## Installing package into 'C:/Users/burha/Documents/R/win-library/3.6'
## (as 'lib' is unspecified)
## Warning: unable to access index for repository http://www.stats.ox.ac.uk/pub/RWin/bin/windows/contri
     cannot open URL 'http://www.stats.ox.ac.uk/pub/RWin/bin/windows/contrib/3.6/PACKAGES'
## package 'lubridate' successfully unpacked and MD5 sums checked
##
## The downloaded binary packages are in
  C:\Users\burha\AppData\Local\Temp\Rtmpmw9d97\downloaded_packages
##
## lubridate installed
Load the storms dataset from the dplyr package and investigate it using str and summary and head. Which
```

```
two columns should be converted to type factor? Do so below using the mutate and the overwrite pipe
operator %<>%. Verify.
data("storms")
str(storms)
## Classes 'tbl_df', 'tbl' and 'data.frame':
                                                10010 obs. of 13 variables:
## $ name
                 : chr
                       "Amy" "Amy" "Amy" "Amy" ...
                       1975 1975 1975 1975 ...
## $ year
                 : num
## $ month
                       6 6 6 6 6 6 6 6 6 6 ...
                 : num
## $ day
                 : int
                       27 27 27 27 28 28 28 28 29 29 ...
## $ hour
                 : num
                       0 6 12 18 0 6 12 18 0 6 ...
## $ lat
                        27.5 28.5 29.5 30.5 31.5 32.4 33.3 34 34.4 34 ...
                 : num
## $ long
                       -79 -79 -79 -79 -78.8 -78.7 -78 -77 -75.8 -74.8 ...
                 : num
                        "tropical depression" "tropical depression" "tropical depression" "tropical dep
## $ status
                 : chr
                 : Ord.factor w/ 7 levels "-1"<"0"<"1"<"2"<..: 1 1 1 1 1 1 1 2 2 ...
## $ category
```

```
: int 25 25 25 25 25 25 25 30 35 40 ...
## $ pressure
               : int 1013 1013 1013 1013 1012 1012 1011 1006 1004 1002 ...
## $ ts diameter: num NA ...
## $ hu_diameter: num NA ...
summary(storms)
##
                          year
                                       month
                                                        day
       name
## Length:10010
                     Min. :1975
                                   Min. : 1.000
                                                    Min. : 1.00
## Class :character
                     1st Qu.:1990
                                   1st Qu.: 8.000
                                                    1st Qu.: 8.00
## Mode :character
                     Median:1999
                                  Median : 9.000
                                                   Median :16.00
##
                     Mean
                            :1998
                                  Mean : 8.779
                                                   Mean :15.86
##
                     3rd Qu.:2006
                                  3rd Qu.: 9.000
                                                    3rd Qu.:24.00
##
                     Max.
                            :2015 Max.
                                          :12.000
                                                   Max. :31.00
##
##
        hour
                        lat
                                                      status
                                       long
   Min.
         : 0.000
                   Min.
                          : 7.20
                                  Min.
                                         :-109.30
                                                   Length: 10010
##
   1st Qu.: 6.000
                   1st Qu.:17.50
                                  1st Qu.: -80.70
                                                    Class : character
   Median :12.000
                   Median :24.40
                                  Median : -64.50
                                                    Mode :character
  Mean : 9.114
                                        : -64.23
                   Mean
                         :24.76
                                  Mean
   3rd Qu.:18.000
                   3rd Qu.:31.30
                                   3rd Qu.: -48.60
                                  Max. : -6.00
## Max. :23.000
                   Max. :51.90
##
## category
                               pressure
                                              ts_diameter
                 wind
   -1:2545
            Min. : 10.00
                           Min. : 882.0 Min. :
                                                       0.00
## 0 :4373
             1st Qu.: 30.00
                            1st Qu.: 985.0 1st Qu.: 69.05
## 1 :1685
           Median : 45.00
                            Median: 999.0 Median: 138.09
## 2:628 Mean :53.49
                            Mean : 992.1 Mean : 166.76
  3 : 363
            3rd Qu.: 65.00
                             3rd Qu.:1006.0 3rd Qu.: 241.66
             Max. :160.00 Max. :1022.0 Max.
## 4 : 348
                                                   :1001.18
## 5 : 68
                                             NA's
                                                    :6528
##
   hu_diameter
## Min. : 0.00
## 1st Qu.: 0.00
## Median: 0.00
## Mean : 21.41
## 3rd Qu.: 28.77
## Max.
          :345.23
## NA's
          :6528
head(storms)
## # A tibble: 6 x 13
                       day hour
                                  lat long status category wind pressure
    name
           year month
    <chr> <dbl> <dbl> <int> <dbl> <dbl> <dbl> <chr> <ord>
                                                           <int>
                                                                    <int>
## 1 Amy
                                  27.5 -79
                                                                     1013
           1975
                   6
                        27
                              0
                                           tropi~ -1
                                                              25
## 2 Amy
           1975
                        27
                               6 28.5 -79
                                            tropi~ -1
                                                              25
                                                                     1013
## 3 Amy
           1975
                   6
                        27
                              12 29.5 -79
                                            tropi~ -1
                                                              25
                                                                     1013
## 4 Amy
           1975
                        27
                              18
                                 30.5 -79
                                            tropi~ -1
                                                              25
                                                                     1013
                   6
           1975
                        28
                              0 31.5 -78.8 tropi~ -1
                                                              25
                                                                     1012
## 5 Amy
                   6
                   6
                        28
                              6 32.4 -78.7 tropi~ -1
## 6 Amy
           1975
                                                              25
                                                                     1012
## # ... with 2 more variables: ts_diameter <dbl>, hu_diameter <dbl>
storms %<>%
 mutate(name = factor(name), status = factor(status))
str(storms)
```

```
## Classes 'tbl_df', 'tbl' and 'data.frame':
                                                  10010 obs. of 13 variables:
                 : Factor w/ 198 levels "AL011993","AL012000",..: 44 44 44 44 44 44 44 44 44 ...
##
    $ name
                        1975 1975 1975 1975 ...
    $ year
##
                         6 6 6 6 6 6 6 6 6 6 ...
    $ month
                 : num
##
    $ day
                 : int
                         27 27 27 27 28 28 28 28 29 29 ...
##
                        0 6 12 18 0 6 12 18 0 6 ...
   $ hour
                 : num
                         27.5 28.5 29.5 30.5 31.5 32.4 33.3 34 34.4 34 ...
    $ lat
                 : num
                        -79 -79 -79 -79 -78.8 -78.7 -78 -77 -75.8 -74.8 ...
##
    $ long
                 : num
##
                 : Factor w/ 3 levels "hurricane", "tropical depression",..: 2 2 2 2 2 2 2 3 3 ...
    $ status
                 : Ord.factor w/ 7 levels "-1"<"0"<"1"<"2"<..: 1 1 1 1 1 1 1 1 2 2 ...
##
    $ category
  $ wind
                         25 25 25 25 25 25 25 30 35 40 ...
                 : int
                         1013 1013 1013 1013 1012 1012 1011 1006 1004 1002 ...
##
    $ pressure
                 : int
                        NA NA NA NA NA NA NA NA NA ...
    $ ts_diameter: num
    $ hu_diameter: num
                        NA NA NA NA NA NA NA NA NA ...
Reorder the columns so name is first, status is second, category is third and the rest are the same. Verify.
storms %<>%
  select(name, status, category, everything())
storms
## # A tibble: 10,010 x 13
      name
           status category year month
                                           day
                                                hour
                                                        lat long wind pressure
##
      <fct> <fct> <ord>
                             <dbl> <dbl> <int>
                                               <dbl> <dbl> <int>
                                                                            <int>
                                                                             1013
##
   1 Amv
            tropi~ -1
                              1975
                                       6
                                            27
                                                    0
                                                       27.5 - 79
                                                                      25
                                                    6 28.5 -79
##
   2 Amy
            tropi~ -1
                              1975
                                       6
                                            27
                                                                      25
                                                                             1013
##
   3 Amy
            tropi~ -1
                              1975
                                            27
                                                   12 29.5 -79
                                                                      25
                                                                             1013
                                       6
                                            27
                                                       30.5 -79
##
   4 Amy
            tropi~ -1
                              1975
                                       6
                                                   18
                                                                      25
                                                                             1013
## 5 Amy
            tropi~ -1
                              1975
                                       6
                                            28
                                                    0
                                                       31.5 -78.8
                                                                      25
                                                                             1012
##
  6 Amy
            tropi~ -1
                              1975
                                       6
                                            28
                                                    6
                                                      32.4 - 78.7
                                                                      25
                                                                             1012
            tropi~ -1
##
                              1975
                                             28
                                                   12 33.3 -78
                                                                      25
                                                                             1011
   7 Amy
                                       6
                                             28
                                                   18 34
##
   8 Amy
            tropi~ -1
                              1975
                                       6
                                                            -77
                                                                      30
                                                                             1006
##
                              1975
                                             29
                                                    0
                                                       34.4 -75.8
                                                                      35
                                                                             1004
   9 Amy
            tropi~ 0
                                       6
## 10 Amy
            tropi~ 0
                              1975
                                       6
                                             29
                                                    6 34
                                                            -74.8
                                                                      40
                                                                             1002
## # ... with 10,000 more rows, and 2 more variables: ts_diameter <dbl>,
       hu diameter <dbl>
Sort the dataframe by year (most recent first) then category of the storm (most severe first). Verify.
storms %<>%
  arrange(desc(year), desc(category))
storms
## # A tibble: 10,010 x 13
##
      name status category
                                                        lat long wind pressure
                            year month
                                           day
                                                hour
##
      <fct> <fct> <ord>
                             <dbl> <dbl> <int> <dbl> <dbl> <int>
                                                                            <int>
   1 Joaq~ hurri~ 4
                              2015
                                                   12
                                                       23.1 -73.7
                                                                              942
##
                                      10
                                              1
                                                                    115
##
    2 Joaq~ hurri~ 4
                              2015
                                      10
                                              1
                                                   18
                                                       23
                                                            -74.2
                                                                    115
                                                                              936
                                                    0
                                                       22.9 - 74.4
                                                                    120
                                                                              931
##
   3 Joaq~ hurri~ 4
                              2015
                                      10
                                              2
##
  4 Joaq~ hurri~ 4
                              2015
                                      10
                                              2
                                                    6
                                                       23
                                                            -74.7
                                                                    120
                                                                              935
                                      10
                                                       23.4 -74.8
## 5 Joaq~ hurri~ 4
                              2015
                                              2
                                                   12
                                                                    115
                                                                              937
##
   6 Joaq~ hurri~ 4
                              2015
                                      10
                                              3
                                                    0
                                                       24.3 -74.3
                                                                    115
                                                                              943
                                                    6 24.8 -73.6
##
  7 Joaq~ hurri~ 4
                              2015
                                      10
                                              3
                                                                    120
                                                                              945
  8 Joaq~ hurri~ 4
                              2015
                                      10
                                              3
                                                   12 25.4 -72.6
                                                                    135
                                                                              934
    9 Joaq~ hurri~ 4
                                      10
                                              3
                                                   18 26.3 -71
##
                              2015
                                                                    130
                                                                              934
## 10 Joaq~ hurri~ 4
                              2015
                                      10
                                              4
                                                    0 27.4 -69.5
                                                                    115
                                                                              941
## # ... with 10,000 more rows, and 2 more variables: ts_diameter <dbl>,
```

hu_diameter <dbl>

Create a new feature wind_speed_per_unit_pressure.

```
storms %<>%
 mutate(wind_speed_per_unit_pressure = wind / pressure)
storms
## # A tibble: 10,010 x 14
##
     name status category year month
                                          day hour
                                                     lat long wind pressure
##
      <fct> <fct> <ord>
                            <dbl> <dbl> <int> <dbl> <dbl> <int>
## 1 Joaq~ hurri~ 4
                            2015
                                     10
                                                12 23.1 -73.7
                                                                           942
                                            1
                                                                 115
## 2 Joaq~ hurri~ 4
                            2015
                                     10
                                            1
                                                 18 23
                                                          -74.2
                                                                 115
                                                                           936
## 3 Joaq~ hurri~ 4
                            2015
                                     10
                                            2
                                                 0 22.9 -74.4
                                                                 120
                                                                          931
## 4 Joaq~ hurri~ 4
                            2015
                                     10
                                            2
                                                 6 23
                                                         -74.7
                                                                 120
                                                                          935
## 5 Joaq~ hurri~ 4
                            2015
                                    10
                                            2
                                                12 23.4 -74.8
                                                                          937
                                                                 115
## 6 Joaq~ hurri~ 4
                            2015
                                    10
                                            3
                                                 0 24.3 -74.3
                                                                 115
                                                                          943
## 7 Joaq~ hurri~ 4
                                    10
                                            3
                                                 6 24.8 -73.6
                            2015
                                                                 120
                                                                          945
## 8 Joaq~ hurri~ 4
                            2015
                                    10
                                            3
                                                12 25.4 -72.6
                                                                 135
                                                                          934
## 9 Joaq~ hurri~ 4
                                                 18 26.3 -71
                            2015
                                     10
                                            3
                                                                 130
                                                                          934
## 10 Joaq~ hurri~ 4
                             2015
                                     10
                                            4
                                                 0 27.4 -69.5
                                                                 115
                                                                           941
## # ... with 10,000 more rows, and 3 more variables: ts_diameter <dbl>,
      hu_diameter <dbl>, wind_speed_per_unit_pressure <dbl>
```

Create a new feature: average_diameter which averages the two diameters.

```
storms %<>%
  mutate(average_diameter = (ts_diameter + hu_diameter) / 2)
storms
```

```
## # A tibble: 10,010 x 15
##
     name status category year month
                                         day hour lat long wind pressure
##
      <fct> <fct> <ord>
                           <dbl> <dbl> <int> <dbl> <dbl> <int>
                                                                        <int>
## 1 Joaq~ hurri~ 4
                            2015
                                                12 23.1 -73.7
                                                                          942
                                    10
                                           1
                                                                 115
## 2 Joaq~ hurri~ 4
                            2015
                                    10
                                                18 23
                                                         -74.2
                                                                 115
                                                                          936
                                    10
                                                 0 22.9 -74.4
## 3 Joaq~ hurri~ 4
                            2015
                                           2
                                                                 120
                                                                          931
## 4 Joaq~ hurri~ 4
                            2015
                                    10
                                           2
                                                 6 23
                                                         -74.7
                                                                 120
                                                                          935
## 5 Joaq~ hurri~ 4
                            2015
                                    10
                                           2
                                                12 23.4 -74.8
                                                                          937
                                                                 115
## 6 Joaq~ hurri~ 4
                            2015
                                    10
                                           3
                                                0 24.3 -74.3
                                                                 115
                                                                          943
## 7 Joaq~ hurri~ 4
                                                 6 24.8 -73.6
                            2015
                                    10
                                           3
                                                                 120
                                                                          945
## 8 Joaq~ hurri~ 4
                            2015
                                    10
                                           3
                                                12 25.4 -72.6
                                                                 135
                                                                          934
## 9 Joaq~ hurri~ 4
                            2015
                                    10
                                           3
                                                18 26.3 -71
                                                                 130
                                                                          934
## 10 Joaq~ hurri~ 4
                            2015
                                    10
                                           4
                                                 0 27.4 -69.5
                                                                 115
                                                                          941
## # ... with 10,000 more rows, and 4 more variables: ts_diameter <dbl>,
      hu_diameter <dbl>, wind_speed_per_unit_pressure <dbl>,
      average_diameter <dbl>
```

Calculate the distance from each storm observation to Miami in a new variable distance_to_miami.

```
MIAMI_COORDS = c(25.7617, -80.1918)
compute_globe_distance = function(destination, origin){
   RAD_EARTH = 3958.8
   dlon = (destination[2] - origin[2]) * 180 / pi
   dlat = (destination[1] - origin[1]) * 180 / pi
   a = (sin(dlat/2))^2 + cos(origin[1]) * cos(destination[1]) * (sin(dlon/2))^2
   c = 2 * atan2( sqrt(a), sqrt(1-a) )
   RAD_EARTH * c
}
```

```
storms %<>%
 rowwise() %>%
 mutate(distance_to_miami = compute_globe_distance(MIAMI_COORDS, c(lat, long))) %>%
 select(lat, long, distance_to_miami, everything())
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(a): NaNs produced
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## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
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```
## Warning in sqrt(a): NaNs produced
```

- ## Warning in sqrt(a): NaNs produced
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## Warning in sqrt(a): NaNs produced
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## Warning in sqrt(1 - a): NaNs produced
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## Warning in sqrt(1 - a): NaNs produced
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- ## Warning in sqrt(a): NaNs produced
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- ## Warning in sqrt(1 a): NaNs produced

```
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
storms
## Source: local data frame [10,010 x 16]
## Groups: <by row>
##
## # A tibble: 10,010 x 16
       lat long distance_to_mia~ name status category year month
##
      <dbl> <dbl>
                            <dbl> <fct> <fct> <ord>
                                                         <dbl> <dbl> <int>
## 1 23.1 -73.7
                            5788. Joaq~ hurri~ 4
                                                         2015
                                                                 10
                                                                        1
## 2 23
          -74.2
                            NaN Joaq~ hurri~ 4
                                                         2015
                                                                 10
                                                                         1
## 3 22.9 -74.4
                            NaN Joaq~ hurri~ 4
                                                         2015
                                                                 10
                                                                         2
## 4 23
                                                                         2
          -74.7
                            4340. Joaq~ hurri~ 4
                                                         2015
                                                                 10
## 5 23.4 -74.8
                                                                 10
                                                                         2
                          10732. Joaq~ hurri~ 4
                                                         2015
## 6 24.3 -74.3
                            NaN Joaq~ hurri~ 4
                                                          2015
                                                                 10
                                                                         3
## 7 24.8 -73.6
                            6425. Joaq~ hurri~ 4
                                                          2015
                                                                  10
                                                                         3
## 8 25.4 -72.6
                                                          2015
                                                                  10
                                                                         3
                           11564. Joaq~ hurri~ 4
## 9 26.3 -71
                                                          2015
                                                                  10
                                                                         3
                            3385. Joaq~ hurri~ 4
## 10 27.4 -69.5
                             NaN Joaq~ hurri~ 4
                                                          2015
## # ... with 10,000 more rows, and 7 more variables: hour <dbl>, wind <int>,
       pressure <int>, ts_diameter <dbl>, hu_diameter <dbl>,
       wind_speed_per_unit_pressure <dbl>, average_diameter <dbl>
At home: convert year, month, day, hour into the variable timestamp using the lubridate package.
storms %<>%
 rowwise() %>%
 mutate(timestamp = ymd_h( pasteO( toString(year), "-", toString(month), "-",
   toString(day), " ", toString(hour), sep = ""), locale = "English"))
```

At home: using the lubridate package, create new variables day_of_week which is a factor with levels "Sunday", "Monday", ... "Saturday" and week_of_year which is integer 1, 2, ..., 52.

```
storms %<>%
  mutate(day_of_week = wday(timestamp, label = TRUE)) %<>%
  mutate(week_of_the_year = week(timestamp))
```

Create a new data frame serious_storms which are category 3 and above hurricanes.

```
serious storms = storms %>%
  filter(category >= 3)
serious_storms
## Source: local data frame [779 x 19]
## Groups: <by row>
##
## # A tibble: 779 x 19
        lat long distance_to_mia~ name status category year month
      <dbl> <dbl>
                              <dbl> <fct> <fct> <ord>
##
                                                           <dbl> <dbl> <int>
##
   1 23.1 -73.7
                              5788. Joaq~ hurri~ 4
                                                            2015
                                                                    10
    2 23
            -74.2
                                    Joaq~ hurri~ 4
##
                                                            2015
                                                                    10
                                                                           1
                              {\tt NaN}
##
    3
       22.9 - 74.4
                              \mathtt{NaN}
                                    Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           2
                                                                           2
##
   4 23
            -74.7
                                                            2015
                                                                    10
                             4340. Joaq~ hurri~ 4
                                                                           2
##
   5 23.4 -74.8
                             10732. Joaq~ hurri~ 4
                                                            2015
                                                                    10
##
    6 24.3 -74.3
                               NaN Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           3
##
    7
       24.8 -73.6
                             6425. Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           3
                                                                           3
##
   8 25.4 -72.6
                             11564. Joaq~ hurri~ 4
                                                            2015
                                                                    10
                             3385. Joaq~ hurri~ 4
##
  9 26.3 -71
                                                            2015
                                                                    10
                                                                           3
## 10 27.4 -69.5
                               NaN Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           4
## # ... with 769 more rows, and 10 more variables: hour <dbl>, wind <int>,
       pressure <int>, ts diameter <dbl>, hu diameter <dbl>,
## #
       wind_speed_per_unit_pressure <dbl>, average_diameter <dbl>,
       timestamp <dttm>, day_of_week <ord>, week_of_the_year <dbl>
```

In serious_storms, merge the variables lat and long together into lat_long with values lat / long as a string.

```
serious_storms %<>%
  unite(lat_long, lat, long, sep = " / ")
serious_storms
```

```
## # A tibble: 779 x 18
##
     hour
                                                      year month
                                                                   day
##
      <chr>
                         <dbl> <fct> <fct> <ord>
                                                     <dbl> <dbl>
                                                                 <int> <dbl>
##
   1 23.1 / ~
                         5788. Joaq~ hurri~ 4
                                                      2015
                                                              10
                                                                     1
                                                                          12
##
  2 23 / -7~
                                                      2015
                                                              10
                                                                          18
                          {\tt NaN}
                               Joaq~ hurri~ 4
  3 22.9 / ~
                                                                     2
##
                          {\tt NaN}
                               Joaq~ hurri~ 4
                                                      2015
                                                              10
                                                                           0
##
   4 23 / -7~
                                                                     2
                                                                           6
                         4340. Joaq~ hurri~ 4
                                                      2015
                                                              10
## 5 23.4 / ~
                        10732. Joaq~ hurri~ 4
                                                                     2
                                                                          12
                                                      2015
                                                              10
##
  6 24.3 / ~
                          NaN Joaq~ hurri~ 4
                                                      2015
                                                              10
                                                                     3
                                                                           0
## 7 24.8 / ~
                         6425. Joaq~ hurri~ 4
                                                      2015
                                                                     3
                                                                           6
                                                              10
## 8 25.4 / ~
                                                                     3
                                                                          12
                        11564. Joaq~ hurri~ 4
                                                      2015
                                                              10
## 9 26.3 / ~
                                                      2015
                                                              10
                                                                     3
                                                                          18
                         3385. Joaq~ hurri~ 4
## 10 27.4 / ~
                          NaN Joaq~ hurri~ 4
                                                      2015
                                                              10
                                                                     4
                                                                           0
## # ... with 769 more rows, and 9 more variables: wind <int>,
      pressure <int>, ts_diameter <dbl>, hu_diameter <dbl>,
      wind_speed_per_unit_pressure <dbl>, average_diameter <dbl>,
```

```
## # timestamp <dttm>, day_of_week <ord>, week_of_the_year <dbl>
```

Back to the main dataframe storms, create a new feature decile_windspeed by binning wind speed into 10 bins.

```
storms %<>%
  mutate(decile_windspeed = factor(ntile(wind, 10)))
 storms
## Source: local data frame [10,010 x 20]
## Groups: <by row>
##
## # A tibble: 10,010 x 20
##
        lat long distance_to_mia~ name status category year month
                                                                         day
##
      <dbl> <dbl>
                             <dbl> <fct> <fct> <ord>
                                                           <dbl> <dbl>
##
   1 23.1 -73.7
                             5788. Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           1
##
    2
       23
            -74.2
                              \mathtt{NaN}
                                    Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           1
##
   3 22.9 -74.4
                                                                           2
                              NaN Joaq~ hurri~ 4
                                                            2015
                                                                    10
##
   4 23
            -74.7
                             4340. Joaq~ hurri~ 4
                                                                           2
                                                            2015
   5 23.4 -74.8
##
                             10732. Joaq~ hurri~ 4
                                                                           2
                                                            2015
                                                                    10
##
    6
       24.3 -74.3
                              NaN Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           3
##
   7 24.8 -73.6
                             6425. Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           3
##
   8 25.4 -72.6
                             11564. Joaq~ hurri~ 4
                                                                    10
                                                                           3
                                                            2015
##
   9 26.3 -71
                             3385. Joaq~ hurri~ 4
                                                            2015
                                                                    10
                                                                           3
## 10 27.4 -69.5
                                                                           4
                              NaN Joaq~ hurri~ 4
                                                            2015
## # ... with 10,000 more rows, and 11 more variables: hour <dbl>,
       wind <int>, pressure <int>, ts_diameter <dbl>, hu_diameter <dbl>,
       wind_speed_per_unit_pressure <dbl>, average_diameter <dbl>,
## #
## #
       timestamp <dttm>, day_of_week <ord>, week_of_the_year <dbl>,
## #
       decile windspeed <fct>
Let's summarize some data. Find the strongest storm by wind speed per year.
storms %>%
  group_by(year) %>%
  summarize(max_wind_speed = max(wind))
## Warning: Grouping rowwise data frame strips rowwise nature
## # A tibble: 41 x 2
##
       year max_wind_speed
##
      <dbl>
                     <int>
##
    1 1975
                       100
##
   2 1976
                       105
##
   3 1977
                       150
```

For each status, find the average category, wind speed, pressure and diameters (do not allow the average to be NA).

##

##

##

##

##

4 1978

5 1979

6 1980

7 1981

8 1982

... with 31 more rows

9 1983

10 1984

80

150

90

115

115

100

115

```
storms %>%
  group by(status) %>%
  summarise(avg_category = mean(as.numeric(as.character(category))), avg_wind_speed = mean(wind), avg_p
## Warning: Grouping rowwise data frame strips rowwise nature
## # A tibble: 3 x 6
     status avg_category avg_wind_speed avg_pressure avg_ts_diameter
     \langle fct. \rangle
                    <dbl>
                                    <dbl>
                                                 <dbl>
                                                                   288.
## 1 hurri~
                                     86.0
                                                  969.
                1.86
                                                 1008.
## 2 tropi~
               -1
                                     27.3
                                                                      0
## 3 tropi~
                0.000229
                                    45.8
                                                  999.
                                                                   160.
## # ... with 1 more variable: avg_hu_diameter <dbl>
For each named storm, find its maximum category, wind speed, pressure and diameters (do not allow the
max to be NA) and the number of readings (i.e. observations).
storms %>%
  group_by(name) %>%
  summarize(max_category = max(category), max_wind_speed = max(wind),
    max_pressure = max(pressure), max_hu_diameter = max(hu_diameter, na.rm = TRUE),
    max_ts_diameter = max(ts_diameter, na.rm = TRUE), readings = n() )
## Warning: Grouping rowwise data frame strips rowwise nature
## # A tibble: 198 x 7
##
      name max_category max_wind_speed max_pressure max_hu_diameter
      <fct> <ord>
                                    <int>
                                                 <int>
  1 ALO1~ -1
                                                   1003
                                                                   -Inf
##
                                       30
## 2 ALO1~ -1
                                       25
                                                   1010
                                                                   -Inf
## 3 ALO2~ -1
                                       30
                                                   1009
                                                                   -Inf
## 4 ALO2~ -1
                                       30
                                                   1017
                                                                   -Inf
## 5 ALO2~ -1
                                       30
                                                   1006
                                                                   -Inf
## 6 ALO2~ -1
                                       30
                                                   1010
                                                                   -Inf
                                       25
## 7 ALO2~ -1
                                                   1012
                                                                   -Inf
## 8 ALO2~ -1
                                       30
                                                   1010
                                                                    -Inf
## 9 ALO2~ 0
                                       45
                                                   1008
                                                                       0
## 10 ALO3~ 0
                                       40
                                                   1015
                                                                    -Inf
## # ... with 188 more rows, and 2 more variables: max_ts_diameter <dbl>,
      readings <int>
For each category, find its average wind speed, pressure and diameters (do not allow the max to be NA).
storms %>%
  group_by(category) %>%
  summarize(ave_wind_speed = mean(wind), ave_pressure = mean(pressure), mean(c(hu_diameter, ts_diameter
## Warning: Grouping rowwise data frame strips rowwise nature
## # A tibble: 7 x 4
     category ave_wind_speed ave_pressure `mean(c(hu_diameter, ts_diameter), ~
##
                        <dbl>
                                      <dbl>
                                                                             <dbl>
## 1 -1
                         27.3
                                      1008.
                                                                               0
## 2 0
                         45.8
                                       999.
                                                                              79.8
## 3 1
                         70.9
                                       982.
                                                                             168.
## 4 2
                         89.4
                                       967.
                                                                             180.
## 5 3
                        105.
                                       954.
                                                                             199.
## 6 4
                        122.
                                       940.
                                                                             209.
```

```
## 7 5 145. 916. 219.
```

At home: for each named storm, find its duration in hours.

```
storms %>%
  group by (name) %>%
 mutate (duration = 6*n()) %>%
 arrange(desc(duration))
## Warning: Grouping rowwise data frame strips rowwise nature
## # A tibble: 10,010 x 21
## # Groups:
              name [198]
##
        lat long distance_to_mia~ name status category year month
##
      <dbl> <dbl>
                             <dbl> <fct> <fct> <ord>
                                                         <dbl> <dbl> <int>
##
   1 14.9 -61.4
                             NaN Emily tropi~ 0
                                                          2011
                                                                   8
                                                          2011
                                                                         2
##
   2 15.1 -62.5
                                                                   8
                             NaN Emily tropi~ 0
                             6188. Emily tropi~ 0
##
  3 15.4 -63.6
                                                          2011
                                                                         2
##
  4 15.7 -64.8
                             NaN Emily tropi~ 0
                                                          2011
                                                                   8
                                                                         2
                                                                         3
##
   5 16
          -66.2
                             NaN Emily tropi~ 0
                                                          2011
                                                                   8
                                                                         3
##
  6 16.3 -67.7
                                                          2011
                                                                   8
                             6570. Emily tropi~ 0
## 7 16.6 -69.1
                             9661. Emily tropi~ 0
                                                                         3
                                                          2011
## 8 16.8 -70.3
                             5898. Emily tropi~ 0
                                                          2011
                                                                   8
                                                                         3
## 9 16.9 -70.7
                             1345. Emily tropi~ 0
                                                          2011
                                                                   8
                                                                         4
## 10 16.9 -71.3
                             4578. Emily tropi~ 0
                                                          2011
                                                                   8
                                                                         4
## # ... with 10,000 more rows, and 12 more variables: hour dbl>,
      wind <int>, pressure <int>, ts_diameter <dbl>, hu_diameter <dbl>,
## #
      wind_speed_per_unit_pressure <dbl>, average_diameter <dbl>,
## #
      timestamp <dttm>, day_of_week <ord>, week_of_the_year <dbl>,
## #
      decile_windspeed <fct>, duration <dbl>
#they are taken every 6 hours so its 6 times the number of readings
```

For each named storm, find the distance from its starting position to ending position in kilometers.

```
storms %>%
  group_by(name) %>%
  arrange(desc(timestamp)) %>%
  summarize(distance_from_start =
    1.61*compute_globe_distance( c(last(lat), last(long)) , c(first(lat), first(long)) ))
## Warning: Grouping rowwise data frame strips rowwise nature
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
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## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
```

```
## Warning in sqrt(a): NaNs produced
```

- ## Warning in sqrt(a): NaNs produced
- ## Warning in sqrt(1 a): NaNs produced
- ## Warning in sqrt(a): NaNs produced
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- ## Warning in sqrt(a): NaNs produced
- ## Warning in sqrt(1 a): NaNs produced
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- ## Warning in sqrt(a): NaNs produced
- ## Warning in sqrt(a): NaNs produced
- ## Warning in sqrt(a): NaNs produced

```
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## # A tibble: 198 x 2
##
      name
               distance_from_start
##
      <fct>
                              <dbl>
##
    1 AL011993
                               NaN
##
    2 AL012000
                              9660.
   3 AL021992
                             10030.
##
   4 AL021994
                             12555.
##
    5 AL021999
                              7057.
##
   6 AL022000
                             11862.
    7 AL022001
##
                               NaN
##
    8 AL022003
##
   9 AL022006
                              5681.
## 10 AL031987
                              6271.
## # ... with 188 more rows
```

Now we want to transition to building real design matrices for prediction. We want to predict the following: given the first three readings of a storm, can you predict its maximum wind speed? Identify the y and identify which features you need $x_1, ... x_p$ and build that matrix with dplyr functions. This is not easy, but it is what it's all about. Feel free to "featurize" (as Dana Chandler spoke about) as creatively as you would like. You aren't going to overfit if you only build a few features relative to the total 198 storms.

```
y = storms %>%
group_by(name) %>%
summarize(max_wind_speed = max(wind))
```

Warning: Grouping rowwise data frame strips rowwise nature

```
y = y \% > \%
  arrange(desc(name))
X = storms %>%
  group_by(name) %>%
  arrange(desc(timestamp)) %>%
  filter(timestamp <= nth(timestamp, n()-2)) %>%
  summarize(ave_pressure = mean(pressure), ave_category = mean(as.numeric(as.character(category))),
   distance_from_start = compute_globe_distance( c(last(lat),last(long)) , c(first(lat),first(long)) ),
    ave_ts_diameter = mean(ts_diameter, na.rm = TRUE), ave_hu_diameter = mean(hu_diameter, na.rm = TRUE)
   pressure by ts diameter = ave pressure * ave ts diameter, pressure by hu diameter = ave pressure *
    category_by_ts_diameter = ave_category * ave_ts_diameter, category_by_hu_diameter = ave_category *
## Warning: Grouping rowwise data frame strips rowwise nature
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
```

```
## Warning in sqrt(1 - a): NaNs produced
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## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
```

Warning in sqrt(1 - a): NaNs produced

Warning in sqrt(1 - a): NaNs produced

```
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
## Warning in sqrt(a): NaNs produced
## Warning in sqrt(1 - a): NaNs produced
#Arrange by descending time to get the three earliest observations.
#Take average pressure, average category, how far the storms traveled in 18 hours.
\#I included interactions with the diameters because sometimes they were zero.
edge_case = storms %>%
  group_by(name) %>%
  mutate (observations = n()) %>%
 filter(observations < 3) %>%
  summarize(ave_pressure = mean(pressure), ave_category = mean(as.numeric(as.character(category))),
   distance_from_start = compute_globe_distance( c(last(lat),last(long)) , c(first(lat),first(long)) )
   ave_ts_diameter = mean(ts_diameter, na.rm = TRUE), ave_hu_diameter = mean(hu_diameter, na.rm = TRUE)
   pressure_by_ts_diameter = ave_pressure * ave_ts_diameter, pressure_by_hu_diameter = ave_pressure *
   category_by_ts_diameter = ave_category * ave_ts_diameter, category_by_hu_diameter = ave_category *
## Warning: Grouping rowwise data frame strips rowwise nature
X = rbind.data.frame(X, edge case)
X = X \%
  arrange(desc(name))
#We check for an edge case, where a storm does not have three observations.
#Then append it to our design matrix then also reorder the names.
y = y \% > \%
 select(-name)
X = X \%
```

```
select(-name)
mod = lm(as.matrix(y) ~ as.matrix(X))
summary(mod)$r.squared
## [1] 0.08750061
summary(mod)$sigma
## [1] 35.36272
```

Interactions in linear models

Load the Boston Housing Data from package MASS and use str and summary to remind yourself of the features and their types and then use ?MASS::Boston to read an English description of the features.

```
data(Boston, package = "MASS")
str(Boston)
                    506 obs. of 14 variables:
   'data.frame':
                    0.00632 0.02731 0.02729 0.03237 0.06905 ...
##
   $ crim
                    18 0 0 0 0 0 12.5 12.5 12.5 12.5 ...
             : num
                    2.31 7.07 7.07 2.18 2.18 2.18 7.87 7.87 7.87 7.87 ...
##
   $ indus : num
##
   $ chas
             : int
                    0 0 0 0 0 0 0 0 0 0 ...
##
                    0.538 0.469 0.469 0.458 0.458 0.458 0.524 0.524 0.524 0.524 ...
   $ nox
             : num
##
   $ rm
                    6.58 6.42 7.18 7 7.15 ...
             : num
                    65.2 78.9 61.1 45.8 54.2 58.7 66.6 96.1 100 85.9 ...
##
    $
     age
##
   $ dis
                    4.09 4.97 4.97 6.06 6.06 ...
             : num
##
   $ rad
                    1 2 2 3 3 3 5 5 5 5 ...
             : int
                    296 242 242 222 222 222 311 311 311 311 ...
##
   $ tax
             : niim
##
   $ ptratio: num
                    15.3 17.8 17.8 18.7 18.7 18.7 15.2 15.2 15.2 15.2 ...
                    397 397 393 395 397 ...
##
   $ black : num
##
   $ lstat
                    4.98 9.14 4.03 2.94 5.33 ...
            : num
                    24 21.6 34.7 33.4 36.2 28.7 22.9 27.1 16.5 18.9 ...
##
   $ medv
             : num
summary(Boston)
```

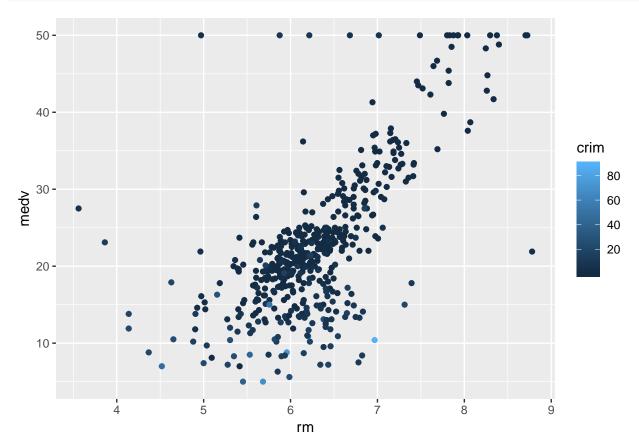
```
##
                                               indus
                                                                 chas
         crim
                               zn
##
    Min.
           : 0.00632
                        Min.
                                   0.00
                                          Min.
                                                  : 0.46
                                                            Min.
                                                                   :0.00000
                                                            1st Qu.:0.00000
    1st Qu.: 0.08204
                        1st Qu.:
                                   0.00
                                           1st Qu.: 5.19
##
    Median: 0.25651
                        Median :
                                   0.00
                                           Median: 9.69
                                                            Median :0.00000
    Mean
           : 3.61352
##
                        Mean
                                : 11.36
                                          Mean
                                                  :11.14
                                                            Mean
                                                                   :0.06917
##
    3rd Qu.: 3.67708
                        3rd Qu.: 12.50
                                           3rd Qu.:18.10
                                                            3rd Qu.:0.00000
            :88.97620
                                :100.00
                                                  :27.74
                                                                   :1.00000
##
    Max.
                        Max.
                                          Max.
                                                            Max.
##
         nox
                            rm
                                             age
                                                               dis
##
    Min.
           :0.3850
                              :3.561
                                               : 2.90
                      Min.
                                       Min.
                                                         Min.
                                                                 : 1.130
    1st Qu.:0.4490
                      1st Qu.:5.886
                                       1st Qu.: 45.02
                                                         1st Qu.: 2.100
    Median :0.5380
                      Median :6.208
                                       Median : 77.50
                                                         Median : 3.207
##
##
    Mean
            :0.5547
                      Mean
                              :6.285
                                       Mean
                                               : 68.57
                                                         Mean
                                                                 : 3.795
##
    3rd Qu.:0.6240
                      3rd Qu.:6.623
                                       3rd Qu.: 94.08
                                                          3rd Qu.: 5.188
##
    Max.
            :0.8710
                      Max.
                              :8.780
                                       Max.
                                               :100.00
                                                         Max.
                                                                 :12.127
##
         rad
                            tax
                                           ptratio
                                                             black
##
    Min.
           : 1.000
                      Min.
                              :187.0
                                       Min.
                                               :12.60
                                                        Min.
                                                                : 0.32
    1st Qu.: 4.000
                      1st Qu.:279.0
                                                         1st Qu.:375.38
                                       1st Qu.:17.40
    Median : 5.000
                      Median :330.0
                                       Median :19.05
                                                        Median: 391.44
                              :408.2
##
    Mean
          : 9.549
                      Mean
                                       Mean
                                               :18.46
                                                         Mean
                                                                :356.67
```

```
##
    3rd Qu.:24.000
                      3rd Qu.:666.0
                                       3rd Qu.:20.20
                                                        3rd Qu.:396.23
##
    Max.
           :24.000
                      Max.
                             :711.0
                                       Max.
                                               :22.00
                                                        Max.
                                                                :396.90
##
        lstat
                          medv
                            : 5.00
##
           : 1.73
                     Min.
   Min.
##
    1st Qu.: 6.95
                     1st Qu.:17.02
   Median :11.36
                     Median :21.20
##
##
           :12.65
                            :22.53
    Mean
                     Mean
    3rd Qu.:16.95
                     3rd Qu.:25.00
##
##
    Max.
           :37.97
                     Max.
                            :50.00
?MASS::Boston
```

starting httpd help server ... done

Using your knowledge of the modeling problem, try to guess which features are interacting. Confirm using plots in ggplot that illustrate three (or more) features.

```
pacman::p_load(ggplot2)
base = ggplot(Boston, aes(x = rm, y = medv))
base + geom_point(aes(col = crim))
```



Once an interaction has been located, confirm the "non-linear linear" model with the interaction term does better than just the vanilla linear model.

```
mod_vanilla = lm(medv ~ rm + crim, Boston)
summary(mod_vanilla)$r.squared

## [1] 0.5419592
summary(mod_vanilla)$sigma

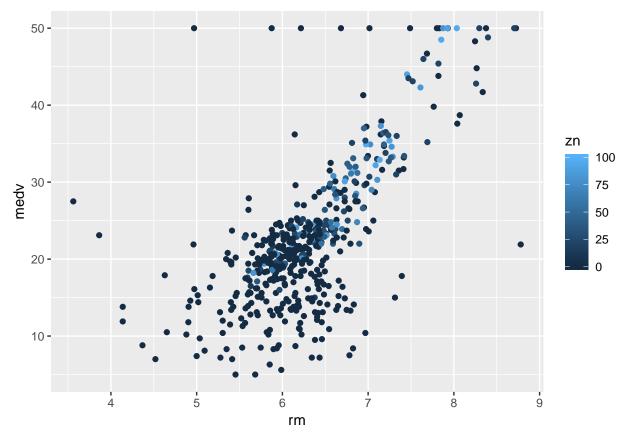
## [1] 6.236844
summary(mod)$r.squared
```

[1] 0.5814763
summary(mod)\$sigma

[1] 5.967672

Repeat this procedure for another interaction with two different features (not used in the previous interaction you found) and verify.

base + geom_point(aes(col = zn))



```
## [1] 0.5063381
```

summary(mod_vanilla)\$sigma

[1] 6.474818

summary(mod)\$r.squared

[1] 0.5223732

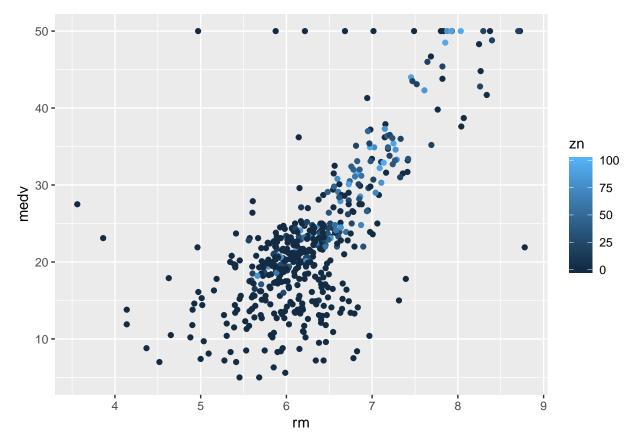
summary(mod)\$sigma

[1] 6.375133

Fit a model using all possible first-order interactions. Verify it is "better" than the linear model. Do you think you overfit? Why or why not?

No we didnt overfit n = 509 and we used 91 features

```
base + geom_point(aes(col = zn))
```



```
mod = lm(medv ~ (.)^2 , Boston)
mod_vanilla = lm(medv ~ rm + zn, Boston)
summary(mod_vanilla)$r.squared
```

[1] 0.5063381

summary(mod_vanilla)\$sigma

[1] 6.474818

```
summary(mod)$r.squared
## [1] 0.9211876
summary(mod)$sigma
## [1] 2.851634
\mathbf{CV}
Use 5-fold CV to estimate the generalization error of the model with all interactions.
pacman::p_load(mlr)
## Installing package into 'C:/Users/burha/Documents/R/win-library/3.6'
## (as 'lib' is unspecified)
## also installing the dependencies 'fastmatch', 'ParamHelpers', 'BBmisc', 'checkmate', 'data.table', '
## Warning: unable to access index for repository http://www.stats.ox.ac.uk/pub/RWin/bin/windows/contri
     cannot open URL 'http://www.stats.ox.ac.uk/pub/RWin/bin/windows/contrib/3.6/PACKAGES'
## package 'fastmatch' successfully unpacked and MD5 sums checked
## package 'ParamHelpers' successfully unpacked and MD5 sums checked
## package 'BBmisc' successfully unpacked and MD5 sums checked
## package 'checkmate' successfully unpacked and MD5 sums checked
## package 'data.table' successfully unpacked and MD5 sums checked
## package 'parallelMap' successfully unpacked and MD5 sums checked
## package 'XML' successfully unpacked and MD5 sums checked
## package 'mlr' successfully unpacked and MD5 sums checked
## The downloaded binary packages are in
   C:\Users\burha\AppData\Local\Temp\Rtmpmw9d97\downloaded_packages
## mlr installed
modeling_task = makeRegrTask(data = Boston, target = "medv") #instantiate the task
algorithm = makeLearner("regr.lm") #instantiate the OLS learner algorithm on the diamonds dataset and s
validation = makeResampleDesc("CV", iters = 5) #instantiate the 5-fold CV
resample(algorithm, modeling_task, validation)
## Resampling: cross-validation
## Measures:
## [Resample] iter 1:
                         31.6988982
## [Resample] iter 2:
                         18.5708417
  [Resample] iter 3:
                         27.2670259
   [Resample] iter 4:
                         20.0313403
  [Resample] iter 5:
                         20.4185830
##
```

Aggregated Result: mse.test.mean=23.5973378

##

Resample Result
Task: Boston
Learner: regr.lm

Aggr perf: mse.test.mean=23.5973378

Runtime: 0.0431411

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