Easy Guide (dplyr)

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Introduction

In this vignette, we will; 1. Start with basics - what is a dplyr and its general form; 2. Then we will look at data wrangling by using select, mutate, arrange, filter, %>%, group by and summarise

We will use 'USArrests' available in R. It is made up of arrests per one hundred thousand residents, for murder, assault and rape in each of the fifty states in the USA. The data is based on 1973 and the percentage of population living in the Urban areas is also included.

The goal of this documentation is help you to understand the uses of various functions in the Dplyr package.

What is dplyr?

Dplyr package was created by Hadley Wickham as an improvement from the existing package 'plyr'.It is designed to provide an extremely optimized set of routines for dealing with data frames. Dplyr is easy to use and highly useful in manipulating data frames. The package was designed to mitigate problems in R whose solutions is clear and easy to follow.

Some of the key functions provided in the package are: 1. mutate: Adds new variables/columns or transform existing variables. 2. arrange: Helps to reorder rows of a data frame 3. filter: Extracts rows from a data frame based on certain conditions 4. rename: Renames variables in a data frame 5. summarise/summarize: Generates summary of variables in a dataset 6. %>%: (known as the 'pipe' operator) It connects multiple verb actions together into a pipeline. 7. select: Returns a subset of columns from a data set

Installing the dplyr package:

```
install.packages("dplyr")
#>
#> The downloaded binary packages are in
#> /var/folders/wk/yh3_khbx68l5m3vzj8mm6rxm0000gp/T//RtmpSJLwfz/downloaded_packages
```

Load the package

After installing, the package is loaded using the following code:

```
library(dplyr)
```

Load dataset:

```
data("USArrests")
summary(USArrests)
                     Assault
#>
      Murder
                                  {\it UrbanPop}
                                                    Rape
#> Min.
        : 0.800
                  Min. : 45.0 Min. :32.00 Min. : 7.30
#> 1st Qu.: 4.075
                  1st Qu.:109.0 1st Qu.:54.50 1st Qu.:15.07
#> Median : 7.250
                  Median :159.0
                               Median :66.00
                                               Median :20.10
#> Mean : 7.788
                  Mean :170.8 Mean :65.54 Mean :21.23
#> 3rd Qu.:11.250
                  3rd Qu.:249.0
                                 3rd Qu.:77.75
                                               3rd Qu.:26.18
#> Max. :17.400
                  Max. :337.0
                                 Max. :91.00
                                               Max. :46.00
```

You can see some basic characteristics of the dataset with the dim() and str() functions.

```
dim(USArrests)
#> [1] 50 4
str(USArrests)
#> 'data.frame': 50 obs. of 4 variables:
#> $ Murder : num 13.2 10 8.1 8.8 9 7.9 3.3 5.9 15.4 17.4 ...
#> $ Assault : int 236 263 294 190 276 204 110 238 335 211 ...
#> $ UrbanPop: int 58 48 80 50 91 78 77 72 80 60 ...
#> $ Rape : num 21.2 44.5 31 19.5 40.6 38.7 11.1 15.8 31.9 25.8 ...
names(USArrests)
#> [1] "Murder" "Assault" "UrbanPop" "Rape"
```

Using select()

The select() function can be used in several ways;

1. To select a column

```
x<-select(USArrests,c(Murder, Assault))
head(x)
            Murder Assault
#> Alabama
             13.2
                       236
#> Alaska
             10.0
                       263
             8.1
#> Arizona
                       294
              8.8
#> Arkansas
                       190
#> California 9.0
                       276
#> Colorado
                7.9
                       204
```

2. To specify a range of variable names.

```
#> California 276 91 40.6
#> Colorado 204 78 38.7
```

3. To omit variables by using the negative sign.

```
z<-select(USArrests,-c(UrbanPop,Rape))</pre>
head(z)
#>
             Murder Assault
#> Alabama
              13.2
#> Alaska
              10.0
                        263
#> Arizona
                8.1
                        294
#> Arkansas
               8.8
                        190
#> California
                9.0
                        276
                7.9
                        204
#> Colorado
```

4. To specify variable names based on patterns.

```
USArrests_subset1 <- select(USArrests, starts_with('A'))</pre>
head(USArrests subset1)
#>
              Assault
#> Alabama
                  236
#> Alaska
                  263
#> Arizona
                  294
#> Arkansas
                  190
#> California
                  276
#> Colorado
                   204
```

Using mutate()

The mutate function can be used in various ways in a data frame. It can be used to create new variables that are derived from existing variables.

```
USArrests_data<- mutate(USArrests, Assault_derived= Assault- mean(Assault, na.rm = TRUE))
head(USArrests_data)
#>
            Murder Assault UrbanPop Rape Assault_derived
#> Alabama
                       236
                                58 21.2
             13.2
                                                 65.24
#> Alaska
             10.0
                       263
                                 48 44.5
                                                  92.24
#> Arizona
               8.1
                       294
                                 80 31.0
                                                 123.24
              8.8
#> Arkansas
                       190
                                 50 19.5
                                                  19.24
#> California 9.0
                       276
                                91 40.6
                                                 105.24
#> Colorado
                7.9
                                 78 38.7
                       204
                                                  33.24
```

Using filter()

The filter() function is used to extract subsets of rows from a data frame.

The function can be used in several ways:

1. To extract a row wth a certain required value

For example, using the data extract the rows of the USArrests data frame where the UrbanPop is greater than 50).

```
new_x<-filter(USArrests, UrbanPop > 50)
head(new_x)
#>
               Murder Assault UrbanPop Rape
#> Alabama
                 13.2
                           236
                                     58 21.2
#> Arizona
                  8.1
                           294
                                     80 31.0
#> California
                  9.0
                           276
                                     91 40.6
                  7.9
                                     78 38.7
#> Colorado
                           204
#> Connecticut
                  3.3
                                     77 11.1
                           110
#> Delaware
                  5.9
                           238
                                     72 15.8
summary(new_x)
#>
                         Assault
                                         UrbanPop
        Murder
                                                            Rape
          : 2.100
                           : 46.0
                                             :51.00
                                                              : 7.80
#> Min.
                     Min.
                                      Min.
                                                      Min.
   1st Qu.: 4.300
                     1st Qu.:110.0
                                      1st Qu.:62.00
                                                      1st Qu.:15.80
#> Median : 7.200
                                      Median :70.00
                     Median :159.0
                                                      Median :21.00
  Mean
           : 7.673
                     Mean
                             :169.5
                                      Mean
                                             :70.29
                                                      Mean
                                                              :21.98
#> 3rd Qu.:11.100
                     3rd Qu.:238.0
                                      3rd Qu.:80.00
                                                       3rd Qu.:26.90
                     Max.
  Max.
           :17.400
                             :335.0
                                      Max.
                                             :91.00
                                                      Max.
                                                              :46.00
```

2. To obtain rows from certain conditions;

```
New_y<-filter(USArrests, UrbanPop > 50 & Murder >7)
summary(New_y$UrbanPop)
#>
      Min. 1st Qu.
                    Median
                              Mean 3rd Qu.
                                               Max.
#>
     52.00
            65.00
                      74.00
                              72.71
                                      80.00
                                              91.00
summary(New_y$Murder)
      Min. 1st Qu. Median
#>
                              Mean 3rd Qu.
                                               Max.
#>
      7.20
              8.50
                    11.10
                              10.95
                                      12.70
                                              17.40
head(New_y)
#>
              Murder Assault UrbanPop Rape
#> Alabama
                13.2
                         236
                                    58 21.2
#> Arizona
                 8.1
                          294
                                    80 31.0
#> California
                 9.0
                          276
                                    91 40.6
#> Colorado
                 7.9
                          204
                                    78 38.7
#> Florida
                15.4
                          335
                                    80 31.9
                17.4
                                    60 25.8
#> Georgia
                          211
summary(y$UrbanPop)
#>
      Min. 1st Qu. Median
                              Mean 3rd Qu.
                                               Max.
           54.50
                     66.00
                              65.54 77.75
                                              91.00
```

Using arrange()

The arrange() function is used to reorder rows of a data frame according to one of the variables. Reordering rows of a data frame (while preserving corresponding order of other columns) is normally a pain to do in R. The arrange() function simplifies the process quite a bit.

The following examples shows how the arrange() function can be used:

1. Example 1

It can be used to arrange a column. Please note, its arranged in ascending order if not specified.

```
X<-arrange(USArrests, Murder)
head(select(X, Assault, Murder), 10)
                Assault Murder
#> North Dakota
                    45
                           0.8
#> Maine
                     83
                           2.1
                    57
#> New Hampshire
                           2.1
#> Iowa
                    56
                           2.2
#> Vermont
                    48
                           2.2
#> Idaho
                   120
                           2.6
#> Wisconsin
                    53
                           2.6
#> Minnesota
                    72
                           2.7
#> Utah
                    120
                           3.2
#> Connecticut
                    110
                           3.3
tail(select(X, Assault, Murder), 10)
                Assault Murder
#> Nevada
                     252
#> Texas
                     201
                           12.7
#> North Carolina
                    337
                          13.0
#> Alabama
                    236
                          13.2
                   188
#> Tennessee
                           13.2
#> South Carolina 279
                           14.4
#> Florida
                    335
                           15.4
#> Louisiana
                     249
                           15.4
#> Mississippi
                     259
                           16.1
#> Georgia
                     211
                           17.4
```

2. Example 2

In descending order;

```
Y<-arrange(USArrests, desc(Murder))
head(select(Y, Assault , Murder), 10)
#>
                 Assault Murder
#> Georgia
                     211
                            17.4
#> Mississippi
                     259
                            16.1
#> Florida
                     335
                            15.4
#> Louisiana
                     249
                           15.4
#> South Carolina
                    279
                           14.4
#> Alabama
                           13.2
                     236
#> Tennessee
                     188
                            13.2
#> North Carolina
                     337
                           13.0
#> Texas
                     201
                            12.7
#> Nevada
                     252
                           12.2
tail(select(Y, Assault , Murder), 10)
                Assault Murder
#> Connecticut
                    110
                            3.3
#> Utah
                     120
                            3.2
                     72
#> Minnesota
                            2.7
#> Idaho
                     120
                            2.6
```

```
#> Wisconsin
                       53
                             2.6
#> Iowa
                       56
                              2.2
#> Vermont
                       48
                              2.2
#> Maine
                       83
                             2.1
#> New Hampshire
                       57
                              2.1
#> North Dakota
                       45
                              0.8
```

Using rename()

The rename() function is designed to make this process easier.

```
mydata <- rename(USArrests, "Assault Arrests"=Assault, "Urban population"=UrbanPop, "Rape Arrests"=Rape
head(mydata)
              Murder Arrests Assault Arrests Urban population Rape Arrests
#> Alabama
                         13.2
                                          236
                                                             58
                                                                        21.2
#> Alaska
                         10.0
                                          263
                                                             48
                                                                        44.5
#> Arizona
                         8.1
                                          294
                                                             80
                                                                        31.0
#> Arkansas
                         8.8
                                          190
                                                             50
                                                                        19.5
                         9.0
                                                             91
#> California
                                          276
                                                                        40.6
#> Colorado
                          7.9
                                          204
                                                             78
                                                                        38.7
```

Using group_by()

The group_by() function is used to generate summary statistics from the data frame within strata defined by a variable. The group_by() function first sets up how you want to group your data. The general operation here is a combination of splitting a data frame into separate pieces defined by a variable or group of variables (group_by()), and then applying a summary function across those subsets (summarize()).

1. Grouping with one column

```
Murder <- group_by(USArrests, Murder)</pre>
summarise(Murder, mean(Assault), mean(Rape))
#> # A tibble: 43 x 3
#>
      Murder `mean(Assault)` `mean(Rape)`
#>
       <dbl>
                        <dbl>
                                      <db1>
                         45
#>
   1
         0.8
                                       7.3
   2
         2.1
                         70
                                       8.65
#>
#>
    3
         2.2
                         52
                                      11.2
#>
         2.6
                         86.5
                                      12.5
#>
   5
         2.7
                         72
                                      14.9
         3.2
#>
   6
                        120
                                      22.9
   7
#>
         3.3
                        110
                                      11.1
   8
                                      8.3
#>
         3.4
                        174
#>
  9
         3.8
                         86
                                      12.8
#> 10
         4
                        145
                                      26.2
#> # ... with 33 more rows
```

2. Grouping with mutliple columns

```
groupby_Murder_Assault <- group_by(USArrests, Murder, Assault)</pre>
summarise(groupby\_Murder\_Assault, n = n())
#> # A tibble: 50 x 3
#> # Groups:
                  Murder [43]
#>
       Murder Assault
                              n
#>
        <dbl>
                  \langle int \rangle \langle int \rangle
#>
    1
           0.8
                      45
                              1
#>
    2
           2.1
                      57
                              1
    3
           2.1
#>
                      83
                              1
#>
                      48
    4
           2.2
                              1
#>
    5
           2.2
                      56
                              1
#>
    6
           2.6
                      53
                              1
    7
           2.6
                     120
                              1
#>
    8
           2.7
                      72
                              1
#>
    9
           3.2
                     120
                              1
#> 10
           3.3
                     110
                              1
#> # ... with 40 more rows
```

Using %>%

The pipeline operator (%>%) is used to string together multiple dplyr functions in a sequence of operations. It takes the output from one function and feed it to the first argument of the next function. Its optimized in such a way to allow you to string operations in a left-to-right fashion, i.e. first(x) %>% second %>% third

We can see the full use of the %>% operator using the following examples:

1. Example 1

We can pipe the USArrests data frame to the function that will select two columns (Murder and Assault) and then pipe the new data frame to the function head() which will return the head of the new data frame.

```
USArrests %>%
select(Murder, Assault) %>%
head
#>
               Murder Assault
#> Alabama
                 13.2
                           236
                 10.0
                           263
#> Alaska
#> Arizona
                  8.1
                           294
#> Arkansas
                  8.8
                           190
#> California
                  9.0
                           276
                  7.9
#> Colorado
                           204
```

2. Example 2

To see how it works with other functions such as arrange, select, filter we will select three columns from USArrests data, arrange the rows by the Murder and then arrange the rows by Assault And filter the rows where Murder is greater equals 8 and Assault is greater than 200.

```
USArrests %>%
select(Murder, Assault, UrbanPop) %>%
arrange(Murder, Assault) %>%
filter(Murder >= 8 & Assault>200)
#>
                  Murder Assault UrbanPop
#> Arizona
                      8.1
                              294
                     9.0
                              276
                                        91
#> California
                    10.0
                              263
#> Alaska
                                        48
#> Illinois
                    10.4
                              249
                                        83
#> New York
                    11.1
                              254
                                        86
#> Maryland
                    11.3
                              300
                                         67
#> New Mexico
                    11.4
                              285
                                         70
                              255
#> Michigan
                     12.1
                                         74
#> Nevada
                    12.2
                              252
                                        81
#> Texas
                    12.7
                              201
                                        80
#> North Carolina
                   13.0
                              337
                                        45
#> Alabama
                    13.2
                              236
                                        58
                              279
#> South Carolina
                                         48
                    14.4
#> Louisiana
                              249
                                        66
                    15.4
#> Florida
                    15.4
                              335
                                        80
#> Mississippi
                    16.1
                              259
                                         44
#> Georgia
                    17.4
                              211
                                         60
```

3. Example 3

To Create a new columns using mutate(), we can add new columns to the data frame. Create a new column called Murder Assault which is multiplication of Murder and Assault

```
USArrests<-USArrests %>%
mutate(Murder_Assault = Murder*Assault)
head(USArrests)[,c("Murder","Assault","Murder_Assault")]
              Murder Assault Murder Assault
#> Alabama
                13.2
                         236
                                      3115.2
#> Alaska
                10.0
                         263
                                      2630.0
#> Arizona
                 8.1
                         294
                                      2381.4
#> Arkansas
                 8.8
                         190
                                      1672.0
#> California
                 9.0
                         276
                                      2484.0
#> Colorado
                 7.9
                         204
                                      1611.6
```

4. Example 4

To create summaries of the data frame using summarise() function for a given column in the data frame such as finding the mean. For example, to compute the average number of Murder, apply the mean() function to the column Murder and call the summary value Mean_Murder. There are many other summary statistics you could consider such sd(), min(), max(), median(), sum(), n() (returns the length of vector), first() (returns first value in vector), last() (returns last value in vector) and n_distinct() (number of distinct values in vector).

```
USArrests %>%
summarise(Mean_Murder=mean(Murder), Max_Assault=max(Assault), Min_Rape=min(Rape))
#> Mean_Murder Max_Assault Min_Rape
#> 1 7.788 337 7.3
```

Conclusion

The dplyr package is extremely useful in data wrangling. Much of the data analysis lies in manipulating data to obtain what you are looking for. Its not a surprise that data scientists will find themselves using the dplyr package in their analysis.

References

McNeil, D. R. (1977) Interactive Data Analysis. New York: Wiley. Wickham, H. and Grolemund, G. (2017) R for Data Science. New York: O'reilly https://r4ds.had.co.nz/transform.html