INFX 573: Problem Set 1 - Exploring Data

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Due: Monday, October 11, 2016

Collaborators:

Instructions:

Before beginning this assignment, please ensure you have access to R and RStudio.

- 1. Download the problemset1.Rmd file from Canvas. Open problemset1.Rmd in RStudio and supply your solutions to the assignment by editing problemset1.Rmd.
- 2. Replace the "Insert Your Name Here" text in the author: field with your own full name. Any collaborators must be listed on the top of your assignment.
- 3. Be sure to include well-documented (e.g. commented) code chucks, figures and clearly written text chunk explanations as necessary. Any figures should be clearly labeled and appropriately referenced within the text.
- 4. Collaboration on problem sets is acceptable, and even encouraged, but each student must turn in an individual write-up in his or her own words and his or her own work. The names of all collaborators must be listed on each assignment. Do not copy-and-paste from other students' responses or code.
- 5. When you have completed the assignment and have **checked** that your code both runs in the Console and knits correctly when you click Knit PDF, rename the R Markdown file to YourLastName_YourFirstName_ps1.Rmd, knit a PDF and submit both the PDF file on Canvas.

Setup:

In this problem set you will need, at minimum, the following R packages.

```
# Load standard libraries
library(tidyverse)
library(nycflights13)
```

Problem 1: Exploring the NYC Flights Data

In this problem set we will use the data on all flights that departed NYC (i.e. JFK, LGA or EWR) in 2013. You can find this data in the nycflights13 R package.

(a) Importing and Inspecting Data:

Load the data and describe in a short paragraph how the data was collected and what each variable represents. Perform a basic inspection of the data and discuss what you find.

Response Data collection process:

Since the nycflights13 is part of the packages made available by cran-r-project.org, I used the information provided by the reference manualwhich is located at https://cran.r-project.org/web/packages/nycflights13/nycflights13.pdf.

Per this document, this package is a collection of airline data for all flights departing NYC in 2013. It also includes data on airlines, airports, weather, and planes. It provides an explanation of each metada about the main components. I used this information to help direct my thought process on how I will be exploring the data and formulating questions for analysis.

Response basic data inspection:

For an initial inspection of the data, I use the summary function which provides a descriptive statistics of a dataset. Also, I use the str function which provides information about the structure of the objects of a data set. Furthermore, I use the head and tail function to have a sense of the data by retrieving the first and last values of the datasets. Finally, I used a combination of sapply, sum and is na functions to filter out components that have a large set of missing data. Note that even though I have run script to inspect each of the components, my primary area of interests are mainly with the flights data. Thus, my response will solely related to flights specific data.

```
# Summary results
summary(flights)
```

```
##
                         month
                                                            dep_time
         year
                                             day
##
    Min.
            :2013
                    Min.
                            : 1.000
                                       Min.
                                               : 1.00
                                                         Min.
                                                                :
                                                                     1
##
    1st Qu.:2013
                    1st Qu.: 4.000
                                       1st Qu.: 8.00
                                                         1st Qu.: 907
##
    Median:2013
                    Median : 7.000
                                       Median :16.00
                                                         Median:1401
##
    Mean
            :2013
                    Mean
                            : 6.549
                                       Mean
                                               :15.71
                                                         Mean
                                                                 :1349
##
    3rd Qu.:2013
                    3rd Qu.:10.000
                                       3rd Qu.:23.00
                                                         3rd Qu.:1744
            :2013
                            :12.000
                                               :31.00
                                                                 :2400
##
    Max.
                    Max.
                                       Max.
                                                         Max.
##
                                                         NA's
                                                                 :8255
##
    sched_dep_time
                       dep_delay
                                            arr_time
                                                         sched_arr_time
##
    Min.
            : 106
                            : -43.00
                                                :
                                                                 :
                    Min.
                                        Min.
                                                    1
                                                         Min.
                                                                     1
                                        1st Qu.:1104
##
    1st Qu.: 906
                    1st Qu.:
                               -5.00
                                                         1st Qu.:1124
##
    Median:1359
                    Median:
                               -2.00
                                        Median:1535
                                                         Median:1556
##
    Mean
            :1344
                    Mean
                               12.64
                                        Mean
                                                :1502
                                                         Mean
                                                                 :1536
##
    3rd Qu.:1729
                    3rd Qu.:
                               11.00
                                        3rd Qu.:1940
                                                         3rd Qu.:1945
##
    Max.
            :2359
                    Max.
                            :1301.00
                                        Max.
                                                :2400
                                                         Max.
                                                                 :2359
##
                    NA's
                                                :8713
                            :8255
                                        NA's
##
      arr_delay
                                                                tailnum
                           carrier
                                                  flight
##
                                              Min.
                                                              Length: 336776
    Min.
            : -86.000
                         Length: 336776
                                                          1
##
    1st Qu.: -17.000
                         Class : character
                                              1st Qu.: 553
                                                              Class : character
##
    Median :
              -5.000
                               :character
                                              Median:1496
                                                              Mode
                                                                     :character
                         Mode
##
    Mean
                6.895
                                              Mean
                                                      :1972
    3rd Qu.:
##
               14.000
                                              3rd Qu.:3465
                                                      :8500
##
    Max.
            :1272.000
                                              Max.
##
    NA's
            :9430
##
                             dest
                                                 air_time
                                                                   distance
       origin
##
    Length: 336776
                         Length: 336776
                                              Min.
                                                      : 20.0
                                                               Min.
                                                                          17
##
    Class : character
                         Class : character
                                              1st Qu.: 82.0
                                                               1st Qu.: 502
##
    Mode
          :character
                         Mode
                               :character
                                              Median :129.0
                                                               Median: 872
##
                                              Mean
                                                      :150.7
                                                               Mean
                                                                       :1040
```

```
##
                                         3rd Qu.:192.0
                                                         3rd Qu.:1389
##
                                         Max.
                                                :695.0
                                                        Max. :4983
##
                                         NA's
                                                :9430
##
                       minute
                                     time_hour
        hour
##
   Min. : 1.00
                   Min. : 0.00
                                   Min.
                                          :2013-01-01 05:00:00
   1st Qu.: 9.00
                   1st Qu.: 8.00
                                   1st Qu.:2013-04-04 13:00:00
   Median :13.00
                   Median :29.00
                                   Median :2013-07-03 10:00:00
   Mean :13.18
                   Mean :26.23
                                         :2013-07-03 05:02:36
##
                                   Mean
   3rd Qu.:17.00
                   3rd Qu.:44.00
                                   3rd Qu.:2013-10-01 07:00:00
##
   Max. :23.00
                   Max. :59.00
                                   Max.
                                        :2013-12-31 23:00:00
##
```

summary(airports)

```
##
        faa
                           name
                                               lat
                                                               lon
                                          Min. :19.72
                                                                 :-176.65
##
  Length: 1396
                       Length: 1396
                                                          Min.
   Class : character
                       Class : character
                                          1st Qu.:34.27
                                                          1st Qu.:-119.34
##
   Mode :character
                      Mode :character
                                          Median :40.15
                                                          Median : -94.92
##
                                          Mean :41.76
                                                          Mean :-103.71
##
                                          3rd Qu.:45.26
                                                          3rd Qu.: -82.55
##
                                          Max.
                                                :72.27
                                                          Max. : 174.11
##
        alt
                                           dst
                           tz
   Min. : -54.0
                           :-11.000
                                       Length: 1396
                     Min.
   1st Qu.: 70.0
##
                     1st Qu.: -8.000
                                       Class : character
   Median : 481.5
                     Median : -6.000
                                       Mode :character
   Mean
         :1006.3
                           : -6.422
                     Mean
   3rd Qu.:1076.2
                     3rd Qu.: -5.000
                     Max. : 8.000
## Max.
          :9078.0
```

summary(airlines)

```
## carrier name
## Length:16 Length:16
## Class :character Class :character
## Mode :character Mode :character
```

summary(planes)

```
##
      tailnum
                            year
                                          type
                                                          manufacturer
   Length:3322
                       Min.
                              :1956
                                      Length:3322
                                                          Length: 3322
##
   Class : character
                       1st Qu.:1997
                                      Class :character
                                                          Class : character
##
   Mode :character
                       Median:2001
                                      Mode :character
                                                          Mode :character
##
                              :2000
                       Mean
##
                       3rd Qu.:2005
##
                       Max.
                              :2013
##
                       NA's
                              :70
##
       model
                          engines
                                           seats
                                                            speed
##
   Length: 3322
                       Min.
                              :1.000
                                       Min. : 2.0
                                                        Min. : 90.0
##
   Class : character
                       1st Qu.:2.000
                                       1st Qu.:140.0
                                                        1st Qu.:107.5
##
   Mode :character
                       Median :2.000
                                       Median :149.0
                                                        Median :162.0
##
                       Mean :1.995
                                       Mean :154.3
                                                        Mean :236.8
##
                       3rd Qu.:2.000
                                       3rd Qu.:182.0
                                                        3rd Qu.:432.0
```

```
##
                          Max.
                                  :4.000
                                            Max.
                                                    :450.0
                                                                       :432.0
                                                              Max.
##
                                                              NA's
                                                                       :3299
##
        engine
    Length: 3322
##
##
    Class : character
    Mode
##
          :character
##
##
##
##
```

summary(weather)

```
##
       origin
                                             month
                                                                 day
                              year
##
    Length: 26130
                                :2013
                                                 : 1.000
                                                                   : 1.00
                        Min.
                                         Min.
                                                           Min.
                                                           1st Qu.: 8.00
##
    Class : character
                        1st Qu.:2013
                                         1st Qu.: 4.000
##
    Mode :character
                        Median:2013
                                         Median : 7.000
                                                           Median :16.00
##
                        Mean
                                :2013
                                         Mean
                                                 : 6.506
                                                           Mean
                                                                   :15.68
##
                         3rd Qu.:2013
                                                           3rd Qu.:23.00
                                         3rd Qu.: 9.000
##
                         Max.
                                :2013
                                                 :12.000
                                                                   :31.00
                                         Max.
                                                           Max.
##
##
         hour
                           temp
                                             dewp
                                                             humid
##
    Min.
           : 0.00
                     Min.
                             : 10.94
                                        Min.
                                               :-9.94
                                                         Min.
                                                                 : 12.74
    1st Qu.: 6.00
                     1st Qu.: 39.92
                                        1st Qu.:26.06
                                                         1st Qu.: 46.99
##
##
    Median :12.00
                     Median : 55.04
                                        Median :42.08
                                                         Median: 61.66
            :11.52
##
    Mean
                     Mean
                             : 55.20
                                        Mean
                                               :41.39
                                                         Mean
                                                                 : 62.35
                                                         3rd Qu.: 78.62
##
    3rd Qu.:18.00
                     3rd Qu.: 69.98
                                        3rd Qu.:57.92
##
            :23.00
                     Max.
                             :100.04
                                        Max.
                                               :78.08
                                                         Max.
                                                                 :100.00
##
                     NA's
                             :1
                                        NA's
                                               :1
                                                         NA's
                                                                 :1
                       wind_speed
                                            wind_gust
##
       wind_dir
                                                                   precip
                                                      0.000
##
                                                                      :0.000000
    Min.
           : 0.0
                                 0.000
                                                              Min.
                     Min.
                             :
                                          Min.
                                                 :
##
    1st Qu.:120.0
                     1st Qu.:
                                 6.905
                                          1st Qu.:
                                                      7.946
                                                               1st Qu.:0.000000
    Median :220.0
                                                              Median :0.000000
##
                     Median:
                                 9.206
                                          Median :
                                                    10.594
##
    Mean
           :198.1
                     Mean
                                10.396
                                          Mean
                                                    11.963
                                                               Mean
                                                                      :0.002726
    3rd Qu.:290.0
                               13.809
##
                     3rd Qu.:
                                          3rd Qu.: 15.892
                                                               3rd Qu.:0.000000
            :360.0
                             :1048.361
                                                  :1206.432
##
    Max.
                     Max.
                                          Max.
                                                               Max.
                                                                      :1.180000
    NA's
                     NA's
                             :3
                                          NA's
##
            :418
                                                 :3
       pressure
##
                           visib
                                           time hour
##
    Min.
           : 983.8
                      Min.
                              : 0.000
                                         Min.
                                                 :2012-12-31 16:00:00
##
    1st Qu.:1012.9
                      1st Qu.:10.000
                                         1st Qu.:2013-04-01 14:00:00
##
    Median :1017.6
                      Median :10.000
                                         Median :2013-07-01 07:30:00
    Mean
           :1017.9
                              : 9.205
                                         Mean
                                                 :2013-07-01 12:07:20
                      Mean
##
    3rd Qu.:1023.0
                      3rd Qu.:10.000
                                         3rd Qu.:2013-09-30 07:45:00
##
    Max.
            :1042.1
                      Max.
                              :10.000
                                         Max.
                                                 :2013-12-30 15:00:00
##
    NA's
            :2730
```

The summary reports for flights show that on average 12.6 flights had a departure delay, 1556 flights arrived at their destinations at the scheduled time, and 6.9 flights had a delayed arrival. It also shows that all the flights that left New York did arrive at their destinations at some point.

```
# str results
str(flights)
```

```
## Classes 'tbl_df', 'tbl' and 'data.frame': 336776 obs. of 19 variables:
## $ month
                 : int 1 1 1 1 1 1 1 1 1 1 ...
                  : int 111111111...
## $ day
                  : int 517 533 542 544 554 554 555 557 557 558 ...
## $ dep time
## $ sched dep time: int 515 529 540 545 600 558 600 600 600 600 ...
                : num 2 4 2 -1 -6 -4 -5 -3 -3 -2 ...
## $ dep delay
## $ arr time
                  : int 830 850 923 1004 812 740 913 709 838 753 ...
## $ sched_arr_time: int 819 830 850 1022 837 728 854 723 846 745 ...
## $ arr_delay : num 11 20 33 -18 -25 12 19 -14 -8 8 ...
## $ carrier
                 : chr "UA" "UA" "AA" "B6" ...
## $ flight
                  : int 1545 1714 1141 725 461 1696 507 5708 79 301 ...
## $ tailnum
                 : chr "N14228" "N24211" "N619AA" "N804JB" ...
## $ origin
                 : chr "EWR" "LGA" "JFK" "JFK" ...
## $ dest
                  : chr
                        "IAH" "IAH" "MIA" "BQN" ...
## $ air_time
                  : num 227 227 160 183 116 150 158 53 140 138 ...
## $ distance
                 : num 1400 1416 1089 1576 762 ...
                 : num 5555656666 ...
## $ hour
## $ minute : num 15 29 40 45 0 58 0 0 0 0 ...
## $ time_hour : POSIXct, format: "2013-01-01 05:00:00" "2013-01-01 05:00:00" ...
str(airports)
## Classes 'tbl_df', 'tbl' and 'data.frame': 1396 obs. of 7 variables:
## $ faa : chr "04G" "06A" "06C" "06N" ...
## $ name: chr "Lansdowne Airport" "Moton Field Municipal Airport" "Schaumburg Regional" "Randall Air
## $ lat : num 41.1 32.5 42 41.4 31.1 ...
## $ lon : num -80.6 -85.7 -88.1 -74.4 -81.4 ...
## $ alt : int 1044 264 801 523 11 1593 730 492 1000 108 ...
## $ tz : num -5 -5 -6 -5 -4 -4 -5 -5 -5 -8 ...
## $ dst : chr "A" "A" "A" "A" ...
str(airlines)
## Classes 'tbl_df', 'tbl' and 'data.frame': 16 obs. of 2 variables:
## $ carrier: chr "9E" "AA" "AS" "B6" ...
## $ name : chr "Endeavor Air Inc." "American Airlines Inc." "Alaska Airlines Inc." "JetBlue Airway
str(planes)
## Classes 'tbl_df', 'tbl' and 'data.frame': 3322 obs. of 9 variables:
## $ tailnum : chr "N10156" "N102UW" "N103US" "N104UW" ...
                : int 2004 1998 1999 1999 2002 1999 1999 1999 1999 ...
## $ year
## $ type
               : chr "Fixed wing multi engine" "Fixed wing multi engine" "Fixed wing multi engine"
## $ manufacturer: chr "EMBRAER" "AIRBUS INDUSTRIE" "AIRBUS INDUSTRIE" "AIRBUS INDUSTRIE" ...
## $ model
               : chr "EMB-145XR" "A320-214" "A320-214" "A320-214" ...
                : int 2 2 2 2 2 2 2 2 2 2 ...
## $ engines
               : int 55 182 182 182 55 182 182 182 182 182 ...
## $ seats
               : int NA NA NA NA NA NA NA NA NA ...
## $ speed
## $ engine
               : chr "Turbo-fan" "Turbo-fan" "Turbo-fan" "Turbo-fan" ...
```

str(weather)

```
Classes 'tbl df', 'tbl' and 'data.frame':
                                                26130 obs. of 15 variables:
   $ origin
                : chr
                       "EWR" "EWR" "EWR" ...
##
   $ year
                       2013 2013 2013 2013 ...
                : num
##
   $ month
                : num
                       1 1 1 1 1 1 1 1 1 1 ...
                       1 1 1 1 1 1 1 1 1 1 ...
   $ day
                : int
                       0 1 2 3 4 6 7 8 9 10 ...
##
   $ hour
                : int
                : num
##
   $ temp
                       37 37 37.9 37.9 37.9 ...
##
   $ dewp
                       21.9 21.9 21.9 23 24.1 ...
                : num
   $ humid
                : num
                       54 54 52.1 54.5 57 ...
##
   $ wind_dir : num
                       230 230 230 230 240 270 250 240 250 260 ...
##
   $ wind_speed: num 10.4 13.8 12.7 13.8 15 ...
##
   $ wind_gust : num
                       11.9 15.9 14.6 15.9 17.2 ...
##
   $ precip
                : num
                       0 0 0 0 0 0 0 0 0 0 ...
##
   $ pressure
               : num
                       1014 1013 1013 1013 1013 ...
##
   $ visib
                : num 10 10 10 10 10 10 10 10 10 10
   $ time_hour : POSIXct, format: "2012-12-31 16:00:00" "2012-12-31 17:00:00" ...
```

The internal structure of flights shows that Month and day are collected as integer values. Thus, they will need to be converted to the actual name values for any analysis that has months or days to make any sense. Also, the arr_delay which identifies the arrival delay is stored as a numeric object, which means that the data contains a precision value of the reporting of this variable.

```
# head and tail results
head(flights, 5)
```

```
## # A tibble: 5 × 19
##
      year month
                    day dep_time sched_dep_time dep_delay arr_time
##
     <int> <int> <int>
                           <int>
                                           <int>
                                                      <dbl>
                                                                <int>
                                                          2
## 1
      2013
                                             515
                                                                  830
                1
                      1
                             517
## 2
      2013
                1
                             533
                                              529
                                                          4
                                                                  850
                      1
                                                          2
## 3 2013
                1
                      1
                             542
                                              540
                                                                  923
## 4 2013
                1
                      1
                             544
                                             545
                                                         -1
                                                                 1004
## 5
     2013
                1
                      1
                             554
                                             600
                                                         -6
                                                                  812
## # ... with 12 more variables: sched_arr_time <int>, arr_delay <dbl>,
       carrier <chr>, flight <int>, tailnum <chr>, origin <chr>, dest <chr>,
## #
       air_time <dbl>, distance <dbl>, hour <dbl>, minute <dbl>,
## #
       time hour <dttm>
```

```
tail(flights, 5)
```

```
## # A tibble: 5 × 19
##
      year month
                    day dep_time sched_dep_time dep_delay arr_time
##
     <int> <int> <int>
                            <int>
                                            <int>
                                                       <dbl>
                                                                <int>
## 1 2013
                9
                     30
                                             1455
                               NA
                                                          NA
                                                                    NA
## 2
      2013
                9
                     30
                               NΑ
                                             2200
                                                          NA
                                                                   NA
## 3
      2013
                9
                     30
                               NA
                                             1210
                                                          NA
                                                                   NA
## 4
      2013
                9
                     30
                               NA
                                             1159
                                                          NA
                                                                   NA
## 5 2013
                     30
                                              840
                               NA
                                                          NA
## # ... with 12 more variables: sched_arr_time <int>, arr_delay <dbl>,
```

```
carrier <chr>, flight <int>, tailnum <chr>, origin <chr>, dest <chr>,
## #
       air_time <dbl>, distance <dbl>, hour <dbl>, minute <dbl>,
## #
       time_hour <dttm>
head(airports, 5)
## # A tibble: 5 × 7
##
       faa
                                      name
                                                lat
                                                           lon
                                                                 alt
                                                                         tz
                                                                              dst
##
     <chr>
                                     <chr>
                                              dbl>
                                                         <dbl> <int> <dbl> <chr>
       04G
## 1
                        Lansdowne Airport 41.13047 -80.61958
                                                                1044
## 2
       06A Moton Field Municipal Airport 32.46057 -85.68003
                                                                 264
                                                                         -5
                                                                                Α
## 3
                      Schaumburg Regional 41.98934 -88.10124
                                                                 801
                                                                         -6
                                                                                Α
                          Randall Airport 41.43191 -74.39156
## 4
       06N
                                                                 523
                                                                         -5
                                                                                Α
## 5
       09J
                    Jekyll Island Airport 31.07447 -81.42778
                                                                  11
tail(airports, 5)
## # A tibble: 5 × 7
##
       faa
                                 name
                                            lat
                                                        lon
                                                              alt
                                                                           dst
##
     <chr>>
                                 <chr>
                                          <dbl>
                                                      <dbl> <int> <dbl> <chr>
## 1
       ZUN
                           Black Rock 35.08323 -108.79178
                                                             6454
## 2
       ZVE
              New Haven Rail Station 41.29867
                                                 -72.92599
                                                                7
                                                                     -5
                                                                             Α
## 3
       ZWI Wilmington Amtrak Station 39.73667
                                                 -75.55167
                                                                0
                                                                     -5
                                                                             Α
## 4
           Washington Union Station 38.89746
                                                                     -5
                                                 -77.00643
                                                               76
                                                                             Α
       ZWU
## 5
       ZYP
                         Penn Station 40.75050
                                                                     -5
                                                                             Α
head(airlines, 5)
## # A tibble: 5 × 2
##
     carrier
                                name
##
       <chr>
                                <chr>
## 1
          9E
                  Endeavor Air Inc.
## 2
          AA American Airlines Inc.
## 3
          AS
               Alaska Airlines Inc.
## 4
                     JetBlue Airways
          B6
## 5
          DL
               Delta Air Lines Inc.
tail(airlines, 5)
## # A tibble: 5 \times 2
##
     carrier
                                name
##
       <chr>>
                               <chr>>
## 1
          UA United Air Lines Inc.
## 2
          US
                    US Airways Inc.
## 3
          VX
                      Virgin America
## 4
          WN Southwest Airlines Co.
## 5
          ΥV
                 Mesa Airlines Inc.
```

head(planes, 5)

```
## # A tibble: 5 × 9
    tailnum year
##
                                      type
                                               manufacturer
                                                                model engines
##
       <chr> <int>
                                     <chr>>
                                                      <chr>>
## 1 N10156 2004 Fixed wing multi engine
                                                    EMBRAER EMB-145XR
                                                                            2
## 2 N102UW 1998 Fixed wing multi engine AIRBUS INDUSTRIE A320-214
                                                                            2
## 3 N103US 1999 Fixed wing multi engine AIRBUS INDUSTRIE A320-214
                                                                            2
## 4 N104UW 1999 Fixed wing multi engine AIRBUS INDUSTRIE A320-214
                                                                            2
## 5 N10575 2002 Fixed wing multi engine
                                                                            2
                                                    EMBRAER EMB-145LR
## # ... with 3 more variables: seats <int>, speed <int>, engine <chr>
tail(planes, 5)
## # A tibble: 5 × 9
     tailnum vear
                                      type
                                                            manufacturer
                                     <chr>
##
       <chr> <int>
                                                                   <chr>
## 1
     N997AT 2002 Fixed wing multi engine
                                                                  BOEING
## 2 N997DL 1992 Fixed wing multi engine MCDONNELL DOUGLAS AIRCRAFT CO
## 3 N998AT 2002 Fixed wing multi engine
## 4 N998DL 1992 Fixed wing multi engine MCDONNELL DOUGLAS CORPORATION
## 5 N999DN 1992 Fixed wing multi engine MCDONNELL DOUGLAS CORPORATION
## # ... with 5 more variables: model <chr>, engines <int>, seats <int>,
     speed <int>, engine <chr>
head(weather, 5)
## # A tibble: 5 × 15
     origin year month
                          day hour temp dewp humid wind_dir wind_speed
      <chr> <dbl> <dbl> <int> <int> <dbl> <dbl> <dbl> <dbl>
                                                         <dbl>
                                                                     <dbl>
                                                           230
## 1
       EWR 2013
                      1
                            1
                                  0 37.04 21.92 53.97
                                                                 10.35702
## 2
       EWR 2013
                            1
                                  1 37.04 21.92 53.97
                                                           230
                                                                 13.80936
                      1
## 3
       EWR 2013
                      1
                            1
                                  2 37.94 21.92 52.09
                                                           230
                                                                 12.65858
       EWR 2013
## 4
                                  3 37.94 23.00 54.51
                      1
                            1
                                                           230
                                                                 13.80936
       EWR 2013
                      1
                            1
                                  4 37.94 24.08 57.04
                                                           240
                                                                 14.96014
## # ... with 5 more variables: wind_gust <dbl>, precip <dbl>,
      pressure <dbl>, visib <dbl>, time hour <dttm>
tail(weather, 5)
## # A tibble: 5 × 15
     origin year month
                          day hour temp dewp humid wind_dir wind_speed
      <chr> <dbl> <dbl> <int> <int> <dbl> <dbl> <dbl> <dbl>
                                                         <dbl>
                                                                     <dbl>
## 1
       LGA 2013
                                 19 35.96 19.94 51.78
                                                           340
                                                                 13.80936
                     12
                           30
       LGA 2013
                                 20 33.98 17.06 49.51
## 2
                     12
                           30
                                                           330
                                                                 17.26170
## 3
       LGA 2013
                     12
                           30
                                 21 32.00 15.08 49.19
                                                           340
                                                                 14.96014
## 4
       LGA 2013
                     12
                           30
                                 22 30.92 12.92 46.74
                                                           320
                                                                 17.26170
## 5
       LGA 2013
                     12
                                 23 28.94 10.94 46.41
                                                                 18.41248
                           30
                                                           330
## # ... with 5 more variables: wind_gust <dbl>, precip <dbl>,
      pressure <dbl>, visib <dbl>, time hour <dttm>
```

Retrieving the first and last records of flights data show how the data is reported out in addition to the related data type. Interestingly, the tail shows data for the month of September. I was expecting to see data

all the way to December instead. Also, most of the tail results for departure and arrival time were all NA. This tells me as part of data cleaning and analysis, It may be important to eliminate data for the month of September if the analysis requires departure and arrival times.

```
# missing Data results
sapply(flights, function(x) sum(is.na(x)))
##
                                                           dep_time sched_dep_time
              year
                             month
                                                day
##
                 0
                                  0
                                                  0
                                                                8255
##
        dep_delay
                          arr_time sched_arr_time
                                                          arr_delay
                                                                             carrier
##
              8255
                              8713
                                                                9430
##
                           tailnum
            flight
                                                                dest
                                                                            air_time
                                             origin
                               2512
                                                                   0
                                                                                9430
##
                                                  0
##
         distance
                              hour
                                             minute
                                                          time hour
##
                                  0
                                                  0
sapply(planes, function(x) sum(is.na(x)))
##
        tailnum
                                        type manufacturer
                                                                    model
                          year
##
                            70
                                           0
                                                                        0
##
                         seats
                                       speed
        engines
                                                     engine
##
                                        3299
sapply(airports, function(x) sum(is.na(x)))
    faa name
               lat
                    lon
                          alt
                                     dst.
                                 tz
##
      0
            0
                 0
                       0
                            0
                                  0
                                       0
sapply(airlines, function(x) sum(is.na(x)))
## carrier
               name
##
                  \cap
sapply(weather, function(x) sum(is.na(x)))
##
                      year
                                 month
                                                          hour
       origin
                                               day
                                                                      temp
##
                                     0
                                                 0
                                                              0
             0
                         0
                                                                          1
##
         dewp
                     humid
                             wind_dir wind_speed
                                                    wind_gust
                                                                    precip
                                                 3
##
                                   418
                                                              3
                                                                          0
                         1
                     visib
##
     pressure
                            time_hour
         2730
                         0
##
```

For flights, it shows that 8255 departure flights have an NA value and 9430 arrival delay flights also have an NA value. Considering that there were 336776 flights out of NY during that year, the difference between the missing values is then very negligible. Thus, the missing data will not impact any analysis done on either the departure or arrival delay time.

(b) Formulating Questions:

Consider the NYC flights data. Formulate two motivating questions you want to explore using this data. Describe why these questions are interesting and how you might go about answering them.

Response to Formulating Questions:

Arrival delays of flights can be a nightmare for love ones excited to see their friends or family members arriving safely. And we saw in the past couple years multiple issues with flights delays that cause significant anxiety. To that end, my interest is to analyze the data reported when it comes to arrival delays. My questions are as follow: Question 1: How do flights towards East and West coast differ in arrival delays? Question 2: How does each of the three origin airports in New York fair when it comes to arrival delays?

In question 1, I attempt to understand if there are any significant differences between arrival delays of flights flying to either a city on the West coast or the East coast. To run this analysis, I decided to analyze MIA (Miami) for East Coast data and SEA (Seattle) for West Coast data.

In question 2, I attempt to examine how each of the origin airports compares as far as the arrival delays. To do this, I will generate a density report for total flights out each origin airports and as well a density arrival delays from the same originated airports. I will then use the data to find out which airport or airports have the least amount of arrival delays.

(c) Exploring Data:

For each of the questions you proposed in Problem 1b, perform an exploratory data analysis designed to address the question. At a minimum, you should produce two visualizations related to each question. Be sure to describe what the visuals show and how they speak to your question of interest.

Response to Exploring Data for question 1:

First, I explore the flights arrival delays between SEA and MIA in hours

Second, I explore the flights arrival delays between SEA and MIA on a monthly basis

```
ggplot(subset(flights, dest %in% c("SEA", "MIA")),
    aes(x=month.abb[month],
        y=arr_delay,
        color=dest))+

geom_point(size=2, alpha=0.5) +
    ggtitle("Arrival delays comparison between SEA and MIA by month") +
    labs(x="Month",y="Arrival delays")
```

It shows that the East Coast city has more delays and has the highest peak of the arrival of delays as well. When looking at the hourly data, it shows that the flights bound for Miami tend to have a lot more arrival delays than flights that are bound to Seattle. However, when looking at the monthly data, it appears that the arrival delays are very much in sync for both coasts. But in both cases, whether it's for the hourly or monthly data, there were numerous outliers of arrival delays for flights going toward Miami than Seattle. Also, the hourly data shows that between the 10th and 15th hours of the day, the East part of the country is primarily heavy with arrival delays.

This simple comparison between Miami and Seattle require additional information to understand why there are such a discrepancies in the hourly delays. Is it possible that time zone differential may have caused that flights bound for the east coast are affected by other? Or is this a matter of volume of flights that are

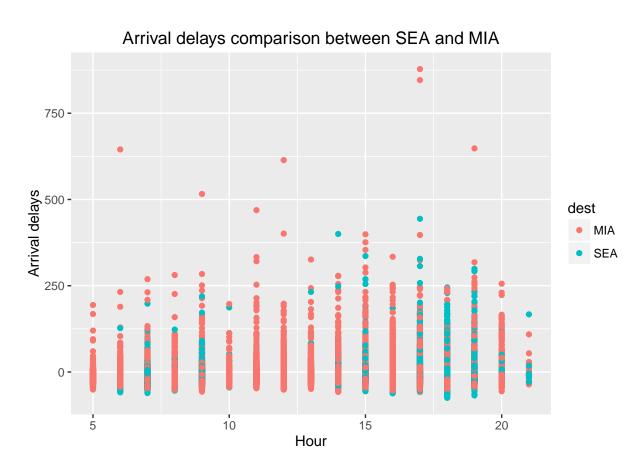


Figure 1: Hours Arrival delays comparison between SEA and MIA $\,$

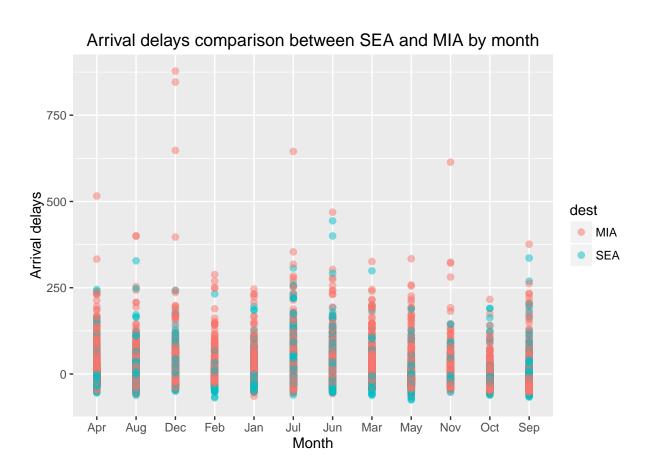


Figure 2: Monthly Arrival delays comparison between SEA and MIA

consistently flying toward the East Coast as opposed to the West Coast. But either the reason for delays, it appears that at the end both coasts are pretty close as far as the number of delays when comparing the data monthly

Response to Exploring Data for question 2:

First, I explore the densify of flights departure from the three originated airports in NY

```
ggplot(flights) +
    geom_bar(aes(origin)) +
    ggtitle("Density of flights originated from NY") +
    labs(x="flight origin",y="total flights")
```

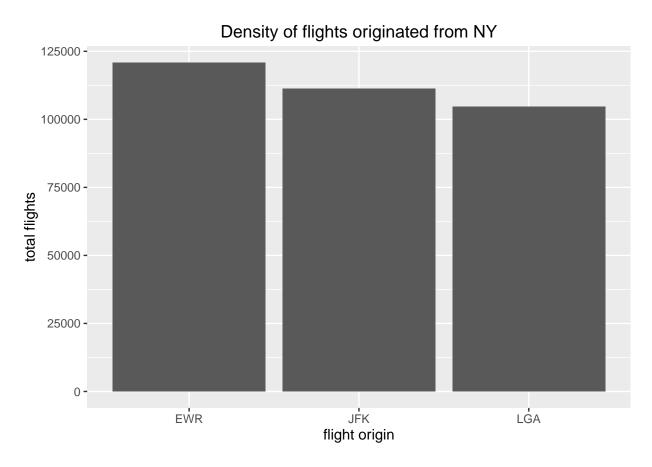


Figure 3: density of flights coming out of NY

Second, I explore the density of arrival delays from the three originated airports in NY

```
ggplot(flights, aes(origin, arr_delay) ) +
    geom_line() +
    ggtitle("Density of delayed flights from NY - line graph") +
    labs(x="Flights Origin",y="Arrival Delays")
```

Figure 3, shows that EWR (Newark) airport has the highest number of flights out of New York followed by JFK and LGA(La Guardia). That said, figure 4 shows that JFK had the largest number of arrival

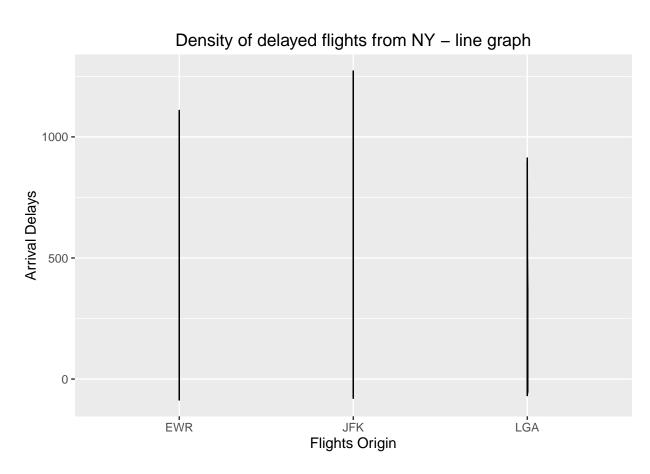


Figure 4: density of delayed flights coming out of NY line chart

delays among all three airports. It's interesting though that even though EWR handled more traffic to other destinations, it came second as far as the arrival delay to a target location. Does EWR have the infrastructure to handle heavy traffic as far as on time departure? To that end, it is important to note that additional logistical data will need to be investigated to understand the site(infrastructure, support workforce, flights' maintenance crew skills, etc) of each airport to formulate a concrete explanation on why some of these airports have more arrival delays than other.

One interesting note that came about from the visualization report is that flying out from La Guardia will be the best option to avoid arrival delay. Since I live on the West Coast, I would need to perform additional analysis on whether this is true for flights which are targeted to land in the West Coast.

(d) Challenge Your Results:

After completing the exploratory analysis from Problem 1c, do you have any concerns about your findings? Comment on any ethical and/or privacy concerns you have with your analysis.

Response to challenge results

Data Concerns

Although La Guardia seems to be best airport to depart from, it will be important to analyze the number of flights that are scheduled to leave each airports during peak seasonal period. For instance, we will need to know the volume of flights that were affected during snow storm. We would also need to analyze data for the same destination for each of the origin airports for the same period of time to have a clear picture on how well each airport performs. Furthermore, it would be important to perform a deeper analysis on the data and correlate whether the flights delay is due to security concerns, technical system, availability of gates to park the planes, average pilot's experience when comparing each airport, number of flights bound for either the East or West Coast from each of these airports.

Privacy and ethical concerns

Origin's airport like La Guardia could use the fact that it has the least number of delays to lure advertisers to post ads at this airport. It can also use this data to discredit the other originated airports and as well as forcing an unfair competition with the other airports. It could potentially lure Commercial airplanes to have their home-based in that airport as opposed the other two.

Airlines companies can even use the arrival delay data as a bargaining chip to grant or deny pilots a promotion, and use it as a leverage to force the pilot union to accept a deal that otherwise they would not have accepted.

Further analysis

We have seen in the last couple years' major flights delay that are caused by technical issues such as computer system being down, flights data are retrieved through ancient technology have limited tech support. Unfortunately, the data did not have any such information. It would have been a good exercise to go beyond the typical weather issue, or flight's maintenance issues to also analyze from an end-to-end where the bottleneck happened that caused arrival delays. I would have liked to get data regarding turn around time to onboard a traveler, to security check delay, flight departure delay, weather situations, gates availability to park the airplane on arrival.