Assignment 4: Data Wrangling

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OVERVIEW

This exercise accompanies the lessons in Environmental Data Analytics on Data Wrangling

Set up your session

- 1a. Load the tidyverse, lubridate, and here packages into your session.
- 1b. Check your working directory.
- 1c. Read in all four raw data files associated with the EPA Air dataset, being sure to set string columns to be read in a factors. See the README file for the EPA air datasets for more information (especially if you have not worked with air quality data previously).
 - 2. Apply the glimpse() function to reveal the dimensions, column names, and structure of each dataset.

```
#1a
library(tidyverse)
library(lubridate)
library(here)
library(tidyr)
#1b
getwd()
```

[1] "/home/guest/ENV 872/EDA_Spring2024"

```
#1c
EPA.air.data.03.NC2018 <- read.csv(
    file=here("~/ENV 872/EDA_Spring2024/Data/Raw/EPAair_03_NC2018_raw.csv"),
    stringsAsFactors = TRUE
)
EPA.air.data.03.NC2019 <- read.csv(
    file=here("~/ENV 872/EDA_Spring2024/Data/Raw/EPAair_03_NC2019_raw.csv"),
    stringsAsFactors = TRUE
)
EPA.air.data.PM25.NC2018 <- read.csv(
    file=here("~/ENV 872/EDA_Spring2024/Data/Raw/EPAair_PM25_NC2018_raw.csv"),
    stringsAsFactors = TRUE
)
EPA.air.data.PM25.NC2019 <- read.csv(
    file=here("~/ENV 872/EDA_Spring2024/Data/Raw/EPAair_PM25_NC2019_raw.csv"),
    stringsAsFactors = TRUE</pre>
```

```
#2
glimpse(EPA.air.data.03.NC2018)
## Rows: 9,737
## Columns: 20
## $ Date
                                           <fct> 03/01/2018, 03/02/2018, 03/03/201~
## $ Source
                                           <fct> AQS, AQS, AQS, AQS, AQS, AQS, AQS~
                                           <int> 370030005, 370030005, 370030005, ~
## $ Site.ID
## $ POC
                                           <int> 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, ~
## $ Daily.Max.8.hour.Ozone.Concentration <dbl> 0.043, 0.046, 0.047, 0.049, 0.047~
## $ UNITS
                                           <fct> ppm, ppm, ppm, ppm, ppm, ppm, ppm~
## $ DAILY_AQI_VALUE
                                           <int> 40, 43, 44, 45, 44, 28, 33, 41, 4~
                                           <fct> Taylorsville Liledoun, Taylorsvil~
## $ Site.Name
## $ DAILY OBS COUNT
                                           <int> 17, 17, 17, 17, 17, 17, 17, 17, 1~
## $ PERCENT_COMPLETE
                                           <dbl> 100, 100, 100, 100, 100, 100, 100~
## $ AQS_PARAMETER_CODE
                                           <int> 44201, 44201, 44201, 44201, 44201~
## $ AQS_PARAMETER_DESC
                                           <fct> Ozone, Ozone, Ozone, Ozone, Ozone~
## $ CBSA_CODE
                                           <int> 25860, 25860, 25860, 25860, 25860~
## $ CBSA_NAME
                                           <fct> "Hickory-Lenoir-Morganton, NC", "~
## $ STATE CODE
                                           <int> 37, 37, 37, 37, 37, 37, 37, 37, 3~
## $ STATE
                                           <fct> North Carolina, North Carolina, N~
                                           <int> 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, ~
## $ COUNTY_CODE
## $ COUNTY
                                           <fct> Alexander, Alexander, Alexander, ~
## $ SITE LATITUDE
                                           <dbl> 35.9138, 35.9138, 35.9138, 35.913~
## $ SITE LONGITUDE
                                           <dbl> -81.191, -81.191, -81.191, -81.19~
glimpse(EPA.air.data.03.NC2019)
## Rows: 10,592
## Columns: 20
## $ Date
                                           <fct> 01/01/2019, 01/02/2019, 01/03/201~
## $ Source
                                           <fct> AirNow, AirNow, AirNow, AirNow, A~
## $ Site.ID
                                           <int> 370030005, 370030005, 370030005, ~
## $ POC
                                           <int> 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
## $ Daily.Max.8.hour.Ozone.Concentration <dbl> 0.029, 0.018, 0.016, 0.022, 0.037~
## $ UNITS
                                           <fct> ppm, ppm, ppm, ppm, ppm, ppm, ppm~
## $ DAILY AQI VALUE
                                           <int> 27, 17, 15, 20, 34, 34, 27, 35, 3~
## $ Site.Name
                                           <fct> Taylorsville Liledoun, Taylorsvil~
                                           <int> 24, 24, 24, 24, 24, 24, 24, 24, 2~
## $ DAILY OBS COUNT
```

<dbl> 100, 100, 100, 100, 100, 100, 100~

<int> 44201, 44201, 44201, 44201, 44201~ <fct> Ozone, Ozone, Ozone, Ozone, Ozone~

<int> 25860, 25860, 25860, 25860, 25860~

<fct> "Hickory-Lenoir-Morganton, NC", "~

<int> 37, 37, 37, 37, 37, 37, 37, 37, 3~

<fct> North Carolina, North Carolina, N~

<int> 3, 3, 3, 3, 3, 3, 3, 3, 3, 3, ~

<fct> Alexander, Alexander, Alexander, ~

<dbl> 35.9138, 35.9138, 35.9138, 35.913~

<dbl> -81.191, -81.191, -81.191, -81.19~

\$ PERCENT_COMPLETE

\$ CBSA CODE

\$ CBSA NAME

\$ STATE_CODE

\$ COUNTY_CODE

\$ SITE_LATITUDE

\$ SITE_LONGITUDE

\$ STATE

\$ COUNTY

\$ AQS_PARAMETER_CODE

\$ AQS PARAMETER DESC

glimpse(EPA.air.data.PM25.NC2018)

```
## Rows: 8,983
## Columns: 20
## $ Date
                          <fct> 01/02/2018, 01/05/2018, 01/08/2018, 01/~
## $ Source
                          ## $ Site.ID
                          <int> 370110002, 370110002, 370110002, 370110~
## $ POC
                          ## $ Daily.Mean.PM2.5.Concentration <dbl> 2.9, 3.7, 5.3, 0.8, 2.5, 4.5, 1.8, 2.5,~
## $ UNITS
                          <fct> ug/m3 LC, ug/m3 LC, ug/m3 LC, ug/m3 LC,~
                          <int> 12, 15, 22, 3, 10, 19, 8, 10, 18, 7, 24~
## $ DAILY_AQI_VALUE
## $ Site.Name
                          <fct> Linville Falls, Linville Falls, Linvill~
## $ DAILY_OBS_COUNT
                          ## $ PERCENT_COMPLETE
                          <int> 88502, 88502, 88502, 88502, 88502, 8850~
## $ AQS_PARAMETER_CODE
## $ AQS_PARAMETER_DESC
                          <fct> Acceptable PM2.5 AQI & Speciation Mass,~
## $ CBSA_CODE
                          ## $ CBSA_NAME
## $ STATE_CODE
                          ## $ STATE
                          <fct> North Carolina, North Carolina, North C~
## $ COUNTY_CODE
                          ## $ COUNTY
                          <fct> Avery, Avery, Avery, Avery, Avery, Avery
## $ SITE_LATITUDE
                          <dbl> 35.97235, 35.97235, 35.97235, 35.97235,~
## $ SITE LONGITUDE
                          <dbl> -81.93307, -81.93307, -81.93307, -81.93~
```

glimpse(EPA.air.data.PM25.NC2019)

```
## Rows: 8,581
## Columns: 20
## $ Date
                          <fct> 01/03/2019, 01/06/2019, 01/09/2019, 01/~
## $ Source
                          <int> 370110002, 370110002, 370110002, 370110~
## $ Site.ID
## $ POC
                          ## $ Daily.Mean.PM2.5.Concentration <dbl> 1.6, 1.0, 1.3, 6.3, 2.6, 1.2, 1.5, 1.5, ~
## $ UNITS
                          <fct> ug/m3 LC, ug/m3 LC, ug/m3 LC, ug/m3 LC,~
## $ DAILY_AQI_VALUE
                          <int> 7, 4, 5, 26, 11, 5, 6, 6, 15, 7, 14, 20~
## $ Site.Name
                          <fct> Linville Falls, Linville Falls, Linvill~
## $ DAILY_OBS_COUNT
                          ## $ PERCENT_COMPLETE
                          ## $ AQS_PARAMETER_CODE
                          <int> 88502, 88502, 88502, 88502, 88502, 8850~
## $ AQS_PARAMETER_DESC
                          <fct> Acceptable PM2.5 AQI & Speciation Mass,~
## $ CBSA_CODE
                          ## $ CBSA_NAME
                          ## $ STATE CODE
## $ STATE
                          <fct> North Carolina, North Carolina, North C~
## $ COUNTY CODE
                          ## $ COUNTY
                          <fct> Avery, Avery, Avery, Avery, Avery, Aver~
## $ SITE LATITUDE
                          <dbl> 35.97235, 35.97235, 35.97235, 35.97235,~
                          <dbl> -81.93307, -81.93307, -81.93307, -81.93~
## $ SITE LONGITUDE
```

Wrangle individual datasets to create processed files.

3. Change the Date columns to be date objects.

- 4. Select the following columns: Date, DAILY_AQI_VALUE, Site.Name, AQS_PARAMETER_DESC, COUNTY, SITE_LATITUDE, SITE_LONGITUDE
- 5. For the PM2.5 datasets, fill all cells in AQS_PARAMETER_DESC with "PM2.5" (all cells in this column should be identical).
- 6. Save all four processed datasets in the Processed folder. Use the same file names as the raw files but replace "raw" with "processed".

```
#3
EPA.air.data.O3.NC2018$Date<- as.Date(EPA.air.data.O3.NC2018$Date, format="%m/%d/%Y")
EPA.air.data.O3.NC2019$Date<- as.Date(EPA.air.data.O3.NC2019$Date, format="%m/%d/%Y")
EPA.air.data.PM25.NC2018$Date<- as.Date(EPA.air.data.PM25.NC2018$Date, format ="%m/%d/%Y")
EPA.air.data.PM25.NC2019$Date<- as.Date(EPA.air.data.PM25.NC2019$Date, format ="%m/%d/%Y")
head(EPA.air.data.03.NC2018$Date)
## [1] "2018-03-01" "2018-03-02" "2018-03-03" "2018-03-04" "2018-03-05"
## [6] "2018-03-06"
head(EPA.air.data.03.NC2019$Date)
## [1] "2019-01-01" "2019-01-02" "2019-01-03" "2019-01-04" "2019-01-05"
## [6] "2019-01-06"
head(EPA.air.data.PM25.NC2018$Date)
## [1] "2018-01-02" "2018-01-05" "2018-01-08" "2018-01-11" "2018-01-14"
## [6] "2018-01-17"
head(EPA.air.data.PM25.NC2019$Date)
## [1] "2019-01-03" "2019-01-06" "2019-01-09" "2019-01-12" "2019-01-15"
## [6] "2019-01-18"
#4
EPA.air.data.03.NC2018.selection<-select(EPA.air.data.03.NC2018, Date, DAILY_AQI_VALUE, Site.Name, AQS_
EPA.air.data.03.NC2019.selection<-select(EPA.air.data.03.NC2019, Date, DAILY_AQI_VALUE, Site.Name, AQS_
EPA.air.data.PM25.NC2018.selection<-select(EPA.air.data.PM25.NC2018, Date, DAILY_AQI_VALUE, Site.Name,
EPA.air.data.PM25.NC2019.selection<-select(EPA.air.data.PM25.NC2019, Date, DAILY_AQI_VALUE, Site.Name,
head(EPA.air.data.03.NC2018.selection)
           Date DAILY_AQI_VALUE
                                            Site.Name AQS_PARAMETER_DESC
                                                                            COUNTY
## 1 2018-03-01
                             40 Taylorsville Liledoun
                                                                   Ozone Alexander
```

Ozone Alexander

Ozone Alexander

Ozone Alexander

Ozone Alexander

Ozone Alexander

43 Taylorsville Liledoun

44 Taylorsville Liledoun

45 Taylorsville Liledoun

44 Taylorsville Liledoun

28 Taylorsville Liledoun

2 2018-03-02

3 2018-03-03 ## 4 2018-03-04

5 2018-03-05

6 2018-03-06

```
SITE_LATITUDE SITE_LONGITUDE
## 1
           35.9138
                          -81.191
## 2
           35.9138
                           -81.191
## 3
           35.9138
                           -81.191
## 4
           35.9138
                           -81.191
## 5
           35.9138
                           -81.191
## 6
           35.9138
                           -81.191
```

head(EPA.air.data.03.NC2019.selection)

```
Site.Name AQS_PARAMETER_DESC
           Date DAILY_AQI_VALUE
                                                                               COUNTY
## 1 2019-01-01
                             27 Taylorsville Liledoun
                                                                     Ozone Alexander
## 2 2019-01-02
                             17 Taylorsville Liledoun
                                                                     Ozone Alexander
## 3 2019-01-03
                             15 Taylorsville Liledoun
                                                                     Ozone Alexander
                                                                  Ozone Alexander
Ozone Alexander
                             20 Taylorsville Liledoun
## 4 2019-01-04
## 5 2019-01-05
                             34 Taylorsville Liledoun
                                                                  Ozone Alexander
## 6 2019-01-06
                             34 Taylorsville Liledoun
    SITE_LATITUDE SITE_LONGITUDE
##
## 1
           35.9138
                         -81.191
## 2
           35.9138
                          -81.191
## 3
           35.9138
                           -81.191
## 4
           35.9138
                          -81.191
## 5
           35.9138
                           -81.191
## 6
           35.9138
                           -81.191
```

head(EPA.air.data.PM25.NC2018.selection)

```
Date DAILY_AQI_VALUE
##
                                              Site.Name
## 1 2018-01-02
                                   12 Linville Falls
## 2 2018-01-05
                                   15 Linville Falls
## 3 2018-01-08
                                    22 Linville Falls
## 4 2018-01-11
                                    3 Linville Falls
## 5 2018-01-14
                                    10 Linville Falls
## 6 2018-01-17
                                    19 Linville Falls
                               AQS_PARAMETER_DESC COUNTY SITE_LATITUDE SITE_LONGITUDE
## 1 Acceptable PM2.5 AQI & Speciation Mass Avery
                                                                      35.97235
                                                                                       -81.93307
## 2 Acceptable PM2.5 AQI & Speciation Mass Avery
## 2 Acceptable PM2.5 AQI & Speciation Mass Avery 35.97235
## 3 Acceptable PM2.5 AQI & Speciation Mass Avery 35.97235
## 4 Acceptable PM2.5 AQI & Speciation Mass Avery 35.97235
## 5 Acceptable PM2.5 AQI & Speciation Mass Avery 35.97235
                                                                      35.97235
                                                                                       -81.93307
                                                                                       -81.93307
                                                                                       -81.93307
## 5 Acceptable PM2.5 AQI & Speciation Mass Avery
                                                                   35.97235
                                                                                       -81.93307
## 6 Acceptable PM2.5 AQI & Speciation Mass
                                                        Avery
                                                                      35.97235
                                                                                       -81.93307
```

head(EPA.air.data.PM25.NC2019.selection)

```
Date DAILY_AQI_VALUE
                                     Site.Name
## 1 2019-01-03
                              7 Linville Falls
## 2 2019-01-06
                              4 Linville Falls
## 3 2019-01-09
                             5 Linville Falls
## 4 2019-01-12
                             26 Linville Falls
## 5 2019-01-15
                             11 Linville Falls
## 6 2019-01-18
                             5 Linville Falls
##
                        AQS_PARAMETER_DESC COUNTY SITE_LATITUDE SITE_LONGITUDE
```

```
## 1 Acceptable PM2.5 AQI & Speciation Mass Avery
                                                        35.97235
                                                                      -81.93307
## 2 Acceptable PM2.5 AQI & Speciation Mass Avery
                                                        35.97235
                                                                      -81.93307
## 3 Acceptable PM2.5 AQI & Speciation Mass
                                             Avery
                                                        35.97235
                                                                      -81.93307
## 4 Acceptable PM2.5 AQI & Speciation Mass
                                             Avery
                                                        35.97235
                                                                      -81.93307
## 5 Acceptable PM2.5 AQI & Speciation Mass
                                             Avery
                                                        35.97235
                                                                      -81.93307
## 6 Acceptable PM2.5 AQI & Speciation Mass Avery
                                                        35.97235
                                                                      -81.93307
```

EPA.air.data.PM25.NC2018.selection.mutated <- mutate(EPA.air.data.PM25.NC2018.selection, AQS_PARAMETER_ EPA.air.data.PM25.NC2019.selection.mutated <- mutate(EPA.air.data.PM25.NC2019.selection, AQS_PARAMETER_ glimpse(EPA.air.data.PM25.NC2019.selection.mutated)

write.csv(EPA.air.data.03.NC2018.selection, row.names = FALSE, file = "~/ENV 872/EDA_Spring2024/Data/Pr write.csv(EPA.air.data.03.NC2019.selection, row.names = FALSE, file = "~/ENV 872/EDA_Spring2024/Data/Pr write.csv(EPA.air.data.PM25.NC2018.selection.mutated, row.names = FALSE, file = "~/ENV 872/EDA_Spring20 write.csv(EPA.air.data.PM25.NC2019.selection.mutated, row.names = FALSE, file = "~/ENV 872/EDA_Spring20

Combine datasets

- 7. Combine the four datasets with rbind. Make sure your column names are identical prior to running this code.
- 8. Wrangle your new dataset with a pipe function (%>%) so that it fills the following conditions:
- Include only sites that the four data frames have in common: "Linville Falls", "Durham Armory", "Leggett", "Hattie Avenue", "Clemmons Middle", "Mendenhall School", "Frying Pan Mountain", "West Johnston Co.", "Garinger High School", "Castle Hayne", "Pitt Agri. Center", "Bryson City", "Millbrook School" (the function intersect can figure out common factor levels but it will include sites with missing site information, which you don't want...)
- Some sites have multiple measurements per day. Use the split-apply-combine strategy to generate daily means: group by date, site name, AQS parameter, and county. Take the mean of the AQI value, latitude, and longitude.
- Add columns for "Month" and "Year" by parsing your "Date" column (hint: lubridate package)
- Hint: the dimensions of this dataset should be $14,752 \times 9$.
- 9. Spread your datasets such that AQI values for ozone and PM2.5 are in separate columns. Each location on a specific date should now occupy only one row.
- 10. Call up the dimensions of your new tidy dataset.

11. Save your processed dataset with the following file name: "EPAair O3 PM25 NC1819 Processed.csv"

```
colnames(EPA.air.data.03.NC2018.selection)
## [1] "Date"
                            "DAILY_AQI_VALUE"
                                                  "Site.Name"
## [4] "AQS_PARAMETER_DESC" "COUNTY"
                                                  "SITE_LATITUDE"
## [7] "SITE_LONGITUDE"
colnames(EPA.air.data.03.NC2019.selection)
## [1] "Date"
                            "DAILY_AQI_VALUE"
                                                  "Site.Name"
## [4] "AQS_PARAMETER_DESC" "COUNTY"
                                                  "SITE_LATITUDE"
## [7] "SITE_LONGITUDE"
colnames(EPA.air.data.PM25.NC2018.selection.mutated)
## [1] "Date"
                            "DAILY_AQI_VALUE"
                                                  "Site.Name"
## [4] "AQS PARAMETER DESC" "COUNTY"
                                                  "SITE LATITUDE"
## [7] "SITE_LONGITUDE"
colnames (EPA.air.data.PM25.NC2019.selection.mutated)
## [1] "Date"
                            "DAILY_AQI_VALUE"
                                                  "Site.Name"
## [4] "AQS PARAMETER DESC" "COUNTY"
                                                  "SITE LATITUDE"
## [7] "SITE_LONGITUDE"
EPA.air.data.03andPM25.NC.2018and2019<-rbind(EPA.air.data.03.NC2018.selection, EPA.air.data.03.NC2019.s
colnames (EPA.air.data.03andPM25.NC.2018and2019)
## [1] "Date"
                            "DAILY_AQI_VALUE"
                                                 "Site.Name"
## [4] "AQS PARAMETER DESC" "COUNTY"
                                                  "SITE LATITUDE"
## [7] "SITE_LONGITUDE"
EPA.air.data.O3andPM25.NC.2018and2019.selection <- EPA.air.data.O3andPM25.NC.2018and2019 %>%
 filter(Site.Name %in% c("Linville Falls", "Durham Armory", "Leggett", "Hattie Avenue", "Clemmons Middle
  group_by(Date, Site.Name, AQS_PARAMETER_DESC, COUNTY)%>%
  summarise(meanAQI=mean(DAILY_AQI_VALUE),
            meanlatitude=mean(SITE_LATITUDE),
            meanlongitude=mean(SITE LONGITUDE))%>%
  mutate(Month=month(Date))%>%
 mutate(Year=year(Date))
## 'summarise()' has grouped output by 'Date', 'Site.Name', 'AQS_PARAMETER_DESC'.
## You can override using the '.groups' argument.
```

Generate summary tables

head (EPA.air.data.03andPM25.NC.2018and2019.selection)

A tibble: 6 x 9

12. Use the split-apply-combine strategy to generate a summary data frame. Data should be grouped by site, month, and year. Generate the mean AQI values for ozone and PM2.5 for each group. Then, add a pipe to remove instances where mean **ozone** values are not available (use the function drop_na in your pipe). It's ok to have missing mean PM2.5 values in this result.

13. Call up the dimensions of the summary dataset.

```
#12
EPAair data 03 PM25 NC1819 <- read.csv(
  file=here("~/ENV 872/EDA_Spring2024/Data/Processed/EPAair_03_PM25_NC1819_Processed.csv"),
  stringsAsFactors = TRUE)
colnames (EPAair data 03 PM25 NC1819)
## [1] "Date"
                       "Site.Name"
                                       "COUNTY"
                                                       "meanlatitude"
## [5] "meanlongitude" "Month"
                                       "Year"
                                                       "Ozone"
## [9] "PM2.5"
EPAair_df_03_PM25_NC_summary<- EPAair_data_03_PM25_NC1819 %>%
  group_by(Site.Name, Month, Year)%>%
  summarise(mean03=mean(Ozone),
            meanPM2.5=mean(PM2.5))%>%
  drop_na(mean03)
## 'summarise()' has grouped output by 'Site.Name', 'Month'. You can override
## using the '.groups' argument.
head(EPAair_df_03_PM25_NC_summary)
## # A tibble: 6 x 5
## # Groups: Site.Name, Month [4]
##
     Site.Name Month Year meanO3 meanPM2.5
##
     <fct>
                <int> <int> <dbl>
                                        <dbl>
## 1 Bryson City
                    3 2018
                                         34.7
                              41.6
## 2 Bryson City
                    3 2019
                               42.5
                                         NA
## 3 Bryson City
                    4 2018
                                         28.2
                               44.5
## 4 Bryson City
                    4 2019
                                         26.7
                               45.4
## 5 Bryson City
                     5 2019
                               39.6
                                         NA
## 6 Bryson City
                     6 2018
                               37.8
                                         NA
#13
dim(EPAair_df_03_PM25_NC_summary)
## [1] 182
#The dimensions are 205 by 5.
```

14. Why did we use the function drop_na rather than na.omit? Hint: replace drop_na with na.omit in part 12 and observe what happens with the dimensions of the summary date frame.

```
## 'summarise()' has grouped output by 'Site.Name', 'Month'. You can override
## using the '.groups' argument.
```

```
head(EPAair_df_03_PM25_NC_summary)
```

```
## # A tibble: 6 x 5
## # Groups:
               Site.Name, Month [5]
##
     Site.Name
                 Month Year mean03 meanPM2.5
                 <int> <int>
##
     <fct>
                              <dbl>
                                        <dbl>
## 1 Bryson City
                     3 2018
                                         34.7
                               41.6
## 2 Bryson City
                     4
                        2018
                               44.5
                                         28.2
## 3 Bryson City
                     4
                        2019
                               45.4
                                         26.7
## 4 Bryson City
                     7
                        2019
                                         33.6
                               30.4
## 5 Bryson City
                     9 2018
                               25.4
                                         25.1
## 6 Bryson City
                    10 2018
                                         31.3
                               31
```

```
dim(EPAair_df_03_PM25_NC_summary)
```

```
## [1] 101 5
```

```
#The dimensions are 45 by 5.
```

Answer: The row dimensions decrease dramatically from 205 to 45. na.omit() removes rows with NA values. Many observations have NA mean PM2.5 values so many rows were removed.