Assignment 3: Data Exploration

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OVERVIEW

This exercise accompanies the lessons in Environmental Data Analytics (ENV872L) on data exploration.

Directions

- 1. Change "Student Name" on line 3 (above) with your name.
- 2. Use the lesson as a guide. It contains code that can be modified to complete the assignment.
- 3. Work through the steps, creating code and output that fulfill each instruction.
- 4. Be sure to **answer the questions** in this assignment document. Space for your answers is provided in this document and is indicated by the ">" character. If you need a second paragraph be sure to start the first line with ">". You should notice that the answer is highlighted in green by RStudio.
- 5. When you have completed the assignment, **Knit** the text and code into a single PDF file. You will need to have the correct software installed to do this (see Software Installation Guide) Press the **Knit** button in the RStudio scripting panel. This will save the PDF output in your Assignments folder.
- 6. After Knitting, please submit the completed exercise (PDF file) to the dropbox in Sakai. Please add your last name into the file name (e.g., "Salk_A02_DataExploration.pdf") prior to submission.

The completed exercise is due on Thursday, 31 January, 2019 before class begins.

1) Set up your R session

#Setting the working directory

Check your working directory, load necessary packages (tidyverse), and upload the North Temperate Lakes long term monitoring dataset for the light, temperature, and oxygen data for three lakes (file name: NTL-LTER_Lake_ChemistryPhysics_Raw.csv). Type your code into the R chunk below.

```
## v ggplot2 3.0.0
                      v purrr
                                0.7.6
## v tibble 1.4.2
                      v dplyr
## v tidyr
            0.8.2
                      v stringr 1.3.1
## v readr
            1.1.1
                      v forcats 0.3.0
## -- Conflicts -----
## x dplyr::filter() masks stats::filter()
## x dplyr::lag()
                    masks stats::lag()
#Uploading the North Temperate Lakes long term monitoring dataset
North.Temp.Lakes.data <- read.csv("./Data/Raw/NTL-LTER_Lake_ChemistryPhysics_Raw.csv")
```

2) Learn about your system

Read about your dataset in the NTL-LTER README file. What are three salient pieces of information you gained from reading this file?

ANSWER:

The naming conventions and files format section gives details of the information that can be derived from the data file name. The data file is from the database NTL-LTER, the data described is of lakes, details include chemisty and physics, it is the raw data and it is in csv format.

The data was accessed, 2018-12-06

The data was assembled by Kateri Salk from the North Temperate Lakes Long Term Ecological Research website and Kateri Salk can be contacted at kateri.salk@duke.edu for additional information and support.

3) Obtain basic summaries of your data

Write R commands to display the following information:

- 1. dimensions of the dataset
- 2. class of the dataset

8

11.5

- 3. first 8 rows of the dataset
- 4. class of the variables lakename, sampledate, depth, and temperature
- 5. summary of lakename, depth, and temperature

```
# 1 - Dimensions of the dataset
dim(North.Temp.Lakes.data) #shows the number of rows and columns in the dataset
## [1] 38614
                 11
# 2 - Class of the dataset
class(North.Temp.Lakes.data) #type of dataset - data.frame
## [1] "data.frame"
# 3 - First eight rows of the dataset
head (North. Temp. Lakes. data, 8) #shows first eight rows of the dataset
##
     lakeid lakename year4 daynum sampledate depth temperature_C
## 1
          L Paul Lake
                        1984
                                148
                                        5/27/84 0.00
                                                                14.5
## 2
          L Paul Lake
                        1984
                                148
                                        5/27/84 0.25
                                                                  NA
## 3
          L Paul Lake
                                        5/27/84
                                                 0.50
                        1984
                                148
                                                                  NA
## 4
          L Paul Lake
                        1984
                                148
                                        5/27/84
                                                 0.75
                                                                  NA
## 5
          L Paul Lake
                        1984
                                148
                                        5/27/84
                                                 1.00
                                                                14.5
## 6
          L Paul Lake
                        1984
                                148
                                        5/27/84
                                                 1.50
                                                                  NA
## 7
          L Paul Lake
                       1984
                                148
                                        5/27/84
                                                 2.00
                                                                14.2
## 8
          L Paul Lake
                       1984
                                148
                                        5/27/84
                                                3.00
                                                                11.0
     dissolvedOxygen irradianceWater irradianceDeck comments
##
## 1
                  9.5
                                 1750
                                                 1620
                                                           <NA>
## 2
                  NA
                                 1550
                                                 1620
                                                           <NA>
## 3
                  NA
                                 1150
                                                 1620
                                                           <NA>
                                  975
## 4
                  NA
                                                 1620
                                                           <NA>
## 5
                  8.8
                                  870
                                                 1620
                                                           <NA>
## 6
                  NA
                                   610
                                                 1620
                                                           <NA>
## 7
                  8.6
                                   420
                                                 1620
                                                           <NA>
```

1620

<NA>

220

```
# 4
class (North. Temp. Lakes.data$lakename) #class of the variable lakename - factor
## [1] "factor"
class(North.Temp.Lakes.data$sampledate) #class of the variable sampledate - factor
## [1] "factor"
class(North.Temp.Lakes.data$depth) #class of the variable depth - numeric
## [1] "numeric"
class(North.Temp.Lakes.data$temperature_C) #class of the variable temperature_C - numeric
## [1] "numeric"
summary (North. Temp. Lakes. data$lakename) #summary of the variable lakename
## Central Long Lake
                          Crampton Lake
                                            East Long Lake
                                                            Hummingbird Lake
##
                 539
                                   1234
                                                      3905
                                                                          430
##
           Paul Lake
                             Peter Lake
                                              Tuesday Lake
                                                                    Ward Lake
##
               10325
                                  11288
                                                      6107
                                                                          598
##
      West Long Lake
##
                4188
summary (North. Temp. Lakes. data$depth) #summary of the variable depth
##
      Min. 1st Qu.
                    Median
                               Mean 3rd Qu.
                                                Max.
##
      0.00
                               4.39
                                               20.00
              1.50
                       4.00
                                        6.50
summary (North.Temp.Lakes.data$temperature_C) #summary of the variable temerature_C
##
      Min. 1st Qu. Median
                               Mean 3rd Qu.
                                                Max.
                                                        NA's
##
      0.30
              5.30
                       9.30
                              11.81
                                      18.70
                                               34.10
                                                        3858
Change sampledate to class = date. After doing this, write an R command to display that the class of
sammpledate is indeed date. Write another R command to show the first 10 rows of the date column.
#Checked the North. Temp. Lakes. data dataset to confirm the format of the factor variable sample date
#is mm/dd/yy
#Changing the sampledate factor variable to a date variable with the format mm/dd/yy
North.Temp.Lakes.data$sampledate <- as.Date(North.Temp.Lakes.data$sampledate, format = "%m/%d/%y")
#Confirming that the sampledate variable is a date
class(North.Temp.Lakes.data$sampledate) #new class - Date
## [1] "Date"
Question: Do you want to remove NAs from this dataset? Why or why not?
#summary of all the variables in the dataset to see how many NAs are in each variable has
summary(North.Temp.Lakes.data)
        lakeid
                                                 year4
##
                               lakename
                                                                 daynum
##
   R.
           :11288
                    Peter Lake
                                   :11288
                                             Min.
                                                    :1984
                                                             Min.
                                                                    : 55.0
##
   T.
           :10325
                    Paul Lake
                                   :10325
                                             1st Qu.:1991
                                                             1st Qu.:166.0
   Т
           : 6107
                    Tuesday Lake : 6107
                                             Median:1997
                                                             Median :194.0
##
                                                            Mean
                                                                    :194.3
```

Mean

:1999

West Long Lake: 4188

W : 4188

```
: 3905
##
                     East Long Lake: 3905
                                              3rd Qu.:2006
                                                              3rd Qu.:222.0
    Μ
##
            : 1234
                     Crampton Lake: 1234
                                              Max.
                                                      :2016
                                                              Max.
                                                                      :307.0
##
    (Other): 1567
                     (Other)
                                    : 1567
##
      sampledate
                               depth
                                            temperature_C
                                                             dissolved0xygen
##
    Min.
            :1984-05-27
                          Min.
                                  : 0.00
                                            Min.
                                                   : 0.30
                                                             Min.
                                                                        0.00
                                            1st Qu.: 5.30
##
    1st Qu.:1991-08-08
                           1st Qu.: 1.50
                                                             1st Qu.:
                                                                        0.30
                                            Median: 9.30
##
    Median: 1997-07-28
                          Median: 4.00
                                                             Median:
                                                                        5.60
##
    Mean
            :1999-02-05
                          Mean
                                  : 4.39
                                            Mean
                                                    :11.81
                                                             Mean
                                                                        4.97
##
    3rd Qu.:2006-06-06
                          3rd Qu.: 6.50
                                            3rd Qu.:18.70
                                                             3rd Qu.:
                                                                        8.40
##
    Max.
            :2016-08-17
                          Max.
                                  :20.00
                                            Max.
                                                    :34.10
                                                             Max.
                                                                     :802.00
##
                                            NA's
                                                    :3858
                                                             NA's
                                                                     :4039
##
    irradianceWater
                          irradianceDeck
##
                -0.337
                                 :
    Min.
                         Min.
                                     1.5
##
    1st Qu.:
                14.000
                          1st Qu.: 353.0
##
    Median :
                65.000
                         Median: 747.0
##
    Mean
               210.242
                         Mean
                                 : 720.5
            :
##
               265.000
                         3rd Qu.:1042.0
    3rd Qu.:
            :24108.000
                                 :8532.0
##
    Max.
                         Max.
                                 :15419
##
    NA's
            :14287
                         NA's
##
                                   comments
##
    DO Probe bad - Doesn't go to zero:
    DO taken with Jones Lab Meter
##
                                           162
    NA's
##
                                        :38246
##
##
##
##
#Removing rows in the dataset with an NA in the temperature_C variable
North.Temp.Lakes.data.no.temp.NAs <- North.Temp.Lakes.data[!is.na(North.Temp.Lakes.data$temperature_C),
#confirming all the rows with an NA in the temperature_C variable have been removed
```

```
## Min. 1st Qu. Median Mean 3rd Qu. Max.
## 0.30 5.30 9.30 11.81 18.70 34.10
```

summary(North.Temp.Lakes.data.no.temp.NAs\$temperature_C)

ANSWER:

I do not want to remove all the NAs in the dataset. This is because variables such as comments, irradianceWater and irradianceDeck have a large proporation of NAs compared to the total number of observations. If they are to be removed, the dataset rows would significantly reduce probably impacting data analysis outcomes.

I do however want to remove the rows with NAs in the temperature_C variable. These rows are just about 10% of the total observations and since temperature_C is used in all the subsequent plots of question 4, it may be beneficial for the temperature_C variable not to have any missing values.

4) Explore your data graphically

Write R commands to display graphs depicting:

- 1. Bar chart of temperature counts for each lake
- 2. Histogram of count distributions of temperature (all temp measurements together)
- 3. Change histogram from 2 to have a different number or width of bins
- 4. Frequency polygon of temperature for each lake. Choose different colors for each lake.

- 5. Boxplot of temperature for each lake
- 6. Boxplot of temperature based on depth, with depth divided into 0.25 m increments
- 7. Scatterplot of temperature by depth

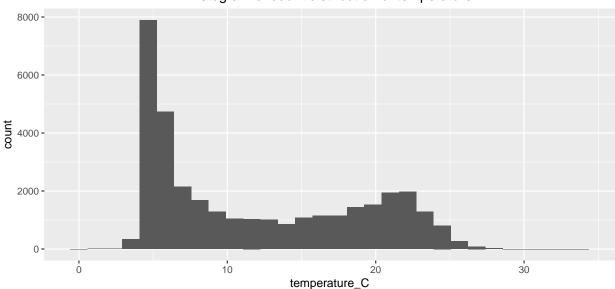
```
# 1. Bar chart of temperature counts for each lake
#The North.Temp.Lakes.data.no.temp.NAs is going to be used because it has only the observations(rows)
#with a temperature value. It can therefore be used to plot the number of temperature readings,
#temperature count, for each lake
ggplot(North.Temp.Lakes.data.no.temp.NAs, aes(x=lakename)) + geom_bar() +
    ggtitle("Bar chart of temperature counts for each lake") +
    theme(plot.title = element_text(hjust = 0.5)) +
    xlab("Lakes") + ylab("Temperature Count") #Bar chart with title and labeled x and y axis
```

Bar chart of temperature counts for each lake 10000 7500 2500 Central Long Lake Crampton Lake East Long Lake Hummingbird Lake Paul Lake Peter Lake Tuesday Lake Ward Lake West Long Lake

```
# 2. Histogram of count distributions of temperature
ggplot(North.Temp.Lakes.data.no.temp.NAs) +
  geom_histogram(aes(x = temperature_C)) +
  ggtitle("Histogram of count distribution of temperature") +
  theme(plot.title = element_text(hjust = 0.5)) #histogram with a title
```

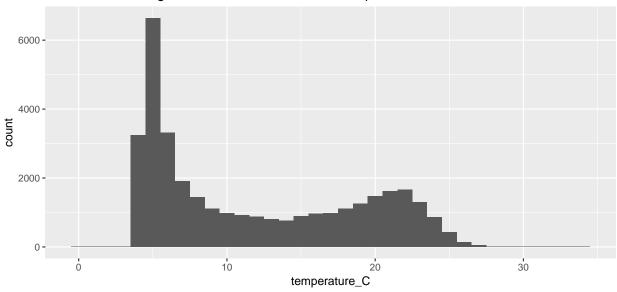
`stat_bin()` using `bins = 30`. Pick better value with `binwidth`.

Histogram of count distribution of temperature

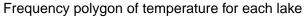


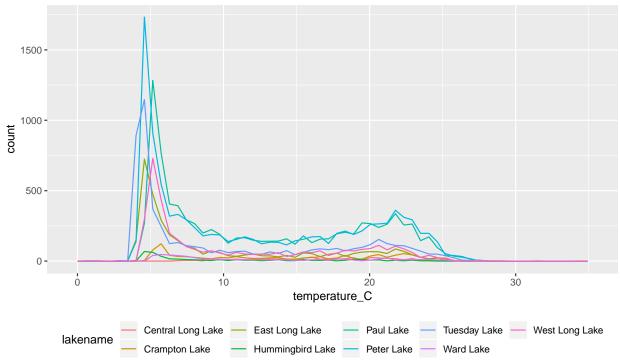
```
# 3. Histogram from 2 with a different number of bins
ggplot(North.Temp.Lakes.data.no.temp.NAs, aes(x = temperature_C)) +
   geom_histogram(binwidth = 1) +
   ggtitle("Histogram of count distributions of temperature with binwidths of 1") +
   theme(plot.title = element_text(hjust = 0.5)) #histogram with a binwidth of 1 and a title
```

Histogram of count distributions of temperature with binwidths of 1



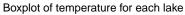
```
# 4. Frequency polygon of temperature for each lake with different colours
ggplot(North.Temp.Lakes.data.no.temp.NAs) +
  geom_freqpoly(aes(x = temperature_C, color = lakename), bins = 60) +
  theme(legend.position = "bottom") + ggtitle("Frequency polygon of temperature for each lake") +
  theme(plot.title = element_text(hjust = 0.5)) #colour of each line is based on the lakename
```

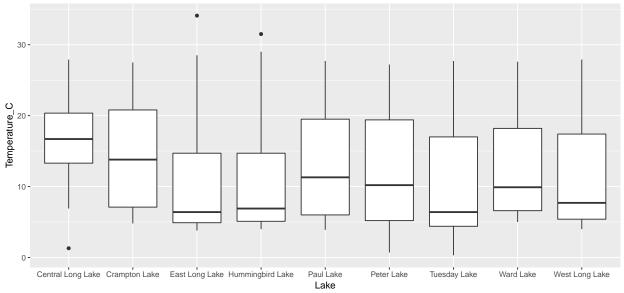




#including a legend of the lake colours and a plot title

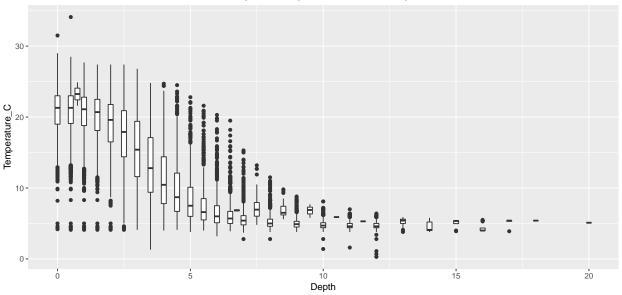
```
# 5. Boxplot of temperature for each lake
ggplot(North.Temp.Lakes.data.no.temp.NAs) +
  geom_boxplot(aes(x = lakename, y = temperature_C))+
  ggtitle("Boxplot of temperature for each lake") + theme(plot.title = element_text(hjust = 0.5)) +
  xlab("Lake") + ylab("Temperature_C") #including a title and axis labels
```





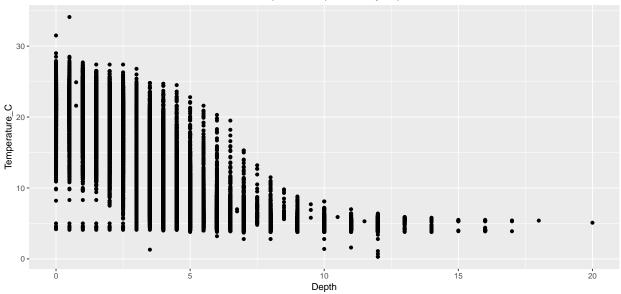
```
# 6. Boxplot of temperature based on depth, with depth divided into 0.25 m increments
ggplot(North.Temp.Lakes.data.no.temp.NAs) +
geom_boxplot(aes(x = depth, y = temperature_C, group = cut_width(depth, 0.25))) +
ggtitle("Boxplot of temperature based on depth") +
theme(plot.title = element_text(hjust = 0.5)) + xlab("Depth") +
ylab("Temperature_C") #uncluding a plot title and axis labels
```

Boxplot of temperature based on depth



```
# 7. Scatterplot of temperature by depth
ggplot(North.Temp.Lakes.data.no.temp.NAs) +
  geom_point(aes(x = depth, y = temperature_C)) + ggtitle("Scatterplot of temperature by depth") +
  theme(plot.title = element_text(hjust = 0.5)) + xlab("Depth") + ylab("Temperature_C")
```

Scatterplot of temperature by depth



5) Form questions for further data analysis

What did you find out about your data from the basic summaries and graphs you made? Describe in 4-6

sentences.

ANSWER:

From the summary of the main dataset I found that only the last 5 variables - temperature_C,dissolvedOxygen irradianceWater,irradianceDeck and comments - have missing values and temperature_C was missing the least number of variables (3858). I therfore decided to carry out by subsequent analysis of temperature with a subset of the dataframe that only had observations with temperature_c values.

The histogram and frequency polygons revealed that the temerature data has a positively skewed distribution. This is consitent with the temperature's summary statistics because its median is less than its mean.

The Bar chart and frequency polygon of temperature counts disaggregate the temperature count data by lakes clearly showing that Peter Lake has the highest number of temperature observations followed by Paul lake and that the most common temperature reading is approximately 5.

The box plot provides a visual break down of the summary statistics of temperature by lake. It shows for example that the max temperature reading of 34 was taken at the East Long Lake. It also shows that the median value of the temperature readings is mainly determinded by readings from Peter and Paul lakes

The scatterplot and boxplot of temperature based on depth reveal that the range and number of temperature readings reduces with increasing depth.

What are 3 further questions you might ask as you move forward with analysis of this dataset?

ANSWER 1: The number of temperature readings taken every year from 1984 to 2016 and the histortical trend of this temperature data collection by year.

ANSWER 2: The change in depth observations as years progressed from 1984 to 2016

ANSWER 3: The relationship between obseration depth and the lake the observation is taken from.