# Assignment 3: Data Exploration

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## **OVERVIEW**

This exercise accompanies the lessons in Environmental Data Analytics on Data Exploration.

#### **Directions**

- 1. Change "Student Name" on line 3 (above) with your name.
- 2. Work through the steps, **creating code and output** that fulfill each instruction.
- 3. Be sure to **answer the questions** in this assignment document.
- 4. When you have completed the assignment, **Knit** the text and code into a single PDF file.
- 5. After Knitting, submit the completed exercise (PDF file) to the dropbox in Sakai. Add your last name into the file name (e.g., "Salk\_A03\_DataExploration.Rmd") prior to submission.

The completed exercise is due on <>.

## Set up your R session

1. Check your working directory, load necessary packages (tidyverse), and upload two datasets: the ECOTOX neonicotinoid dataset (ECOTOX\_Neonicotinoids\_Insects\_raw.csv) and the Niwot Ridge NEON dataset for litter and woody debris (NEON\_NIWO\_Litter\_massdata\_2018-08\_raw.csv). Name these datasets "Neonics" and "Litter", respectively.

## getwd()

## [1] "Z:/Environmental\_Data\_Analytics\_2021/Assignments"

```
#Note: Every time I try to setwd() it reverts back to Assignment folder so had to use absolute path for
library(tidyverse)
neonics <- read.csv("Z:/Environmental_Data_Analytics_2021/Data/Raw/ECOTOX_Neonicotinoids_Insects_raw.cs</pre>
```

litter <- read.csv("Z:/Environmental\_Data\_Analytics\_2021/Data/Raw/NEON\_NIWO\_Litter\_massdata\_2018-08\_raw

# Learn about your system

- 2. The neonicotinoid dataset was collected from the Environmental Protection Agency's ECOTOX Knowledgebase, a database for ecotoxicology research. Neonicotinoids are a class of insecticides used widely in agriculture. The dataset that has been pulled includes all studies published on insects. Why might we be interested in the ecotoxicologoy of neonicotinoids on insects? Feel free to do a brief internet search if you feel you need more background information.
  - Answer: This insecticide is chemically related to nicotine and are much more toxic to invertebrates than mammals. Additionally, its water solubility facilitates plant absorption and can result in potential harm to bees feeding on nectar.
- 3. The Niwot Ridge litter and woody debris dataset was collected from the National Ecological Observatory Network, which collectively includes 81 aquatic and terrestrial sites across 20 ecoclimatic domains. 32

of these sites sample forest litter and woody debris, and we will focus on the Niwot Ridge long-term ecological research (LTER) station in Colorado. Why might we be interested in studying litter and woody debris that falls to the ground in forests? Feel free to do a brief internet search if you feel you need more background information.

Answer: Forest litter (non-living organic debris) and woody debris can inform researchers about the forest's characteristics, habitat, and ecology. This is important to understanding ecosystem dynamics, including productivity, and predicting nutrient cycling and soil fertility.

4. How is litter and woody debris sampled as part of the NEON network? Read the NEON\_Litterfall\_UserGuide.pdf document to learn more. List three pieces of salient information about the sampling methods here:

Answer: 1) Only sites that had woody vegetation greater than 2 meters tall were sampled. 2) Tower lot locations are selected at random within the 90% flux footprint of the airsheds. 3) Trap placements can be targeted or randomized, depending on vegetation composition.

## Obtain basic summaries of your data (Neonics)

5. What are the dimensions of the dataset?

#### dim(neonics)

```
## [1] 4623 30
```

6. Using the summary function on the "Effects" column, determine the most common effects that are studied. Why might these effects specifically be of interest?

```
neonics$Effect <- as.factor(neonics$Effect)
summary(neonics$Effect)</pre>
```

| ## | Accumulation  | Avoidance    | Behavior     | Biochemistry     |
|----|---------------|--------------|--------------|------------------|
| ## | 12            | 102          | 360          | 11               |
| ## | Cell(s)       | Development  | Enzyme(s)    | Feeding behavior |
| ## | 9             | 136          | 62           | 255              |
| ## | Genetics      | Growth       | Histology    | Hormone(s)       |
| ## | 82            | 38           | 5            | 1                |
| ## | Immunological | Intoxication | Morphology   | Mortality        |
| ## | 16            | 12           | 22           | 1493             |
| ## | Physiology    | Population   | Reproduction |                  |
| ## | 7             | 1803         | 197          |                  |

Answer: The population and mortality are the most common effects studied, which are particularly of interest when analyzing life cycle and strain on forest resources.

7. Using the summary function, determine the six most commonly studied species in the dataset (common name). What do these species have in common, and why might they be of interest over other insects? Feel free to do a brief internet search for more information if needed.

neonics\$Species.Common.Name <- as.factor(neonics\$Species.Common.Name)
summary(neonics\$Species.Common.Name)</pre>

| ## | Honey Bee             | Parasitic Wasp      |
|----|-----------------------|---------------------|
| ## | 667                   | 285                 |
| ## | Buff Tailed Bumblebee | Carniolan Honey Bee |
| ## | 183                   | 152                 |
| ## | Bumble Bee            | Italian Honeybee    |
| ## | 140                   | 113                 |

| ##       | Japanese Beetle             | Asian Lady Beetle              |
|----------|-----------------------------|--------------------------------|
| ##       | 94                          | 76                             |
| ##<br>## | Euonymus Scale<br>75        | Wireworm<br>69                 |
| ##       | European Dark Bee           | Minute Pirate Bug              |
| ##       | 66                          | 62                             |
| ##       | Asian Citrus Psyllid        | Parastic Wasp                  |
| ##       | 60                          | 58                             |
| ##       | Colorado Potato Beetle      | Parasitoid Wasp                |
| ##       | 57                          | 51                             |
| ##       | Erythrina Gall Wasp         | Beetle Order                   |
| ##       | 49                          | 47                             |
| ##<br>## | Snout Beetle Family, Weevil | Sevenspotted Lady Beetle<br>46 |
| ##       | True Bug Order              | Buff-tailed Bumblebee          |
| ##       | 45                          | 39                             |
| ##       | Aphid Family                | Cabbage Looper                 |
| ##       | 38                          | 38                             |
| ##       | Sweetpotato Whitefly        | Braconid Wasp                  |
| ##       | 37                          | 33                             |
| ##       | Cotton Aphid                | Predatory Mite                 |
| ##       | 33                          | 33                             |
| ##<br>## | Ladybird Beetle Family 30   | Parasitoid<br>30               |
| ##       | Scarab Beetle               | Spring Tiphia                  |
| ##       | 29                          | 29                             |
| ##       | Thrip Order                 | Ground Beetle Family           |
| ##       | 29                          | 27                             |
| ##       | Rove Beetle Family          | Tobacco Aphid                  |
| ##       | 27                          | 27                             |
| ##       | Chalcid Wasp                | Convergent Lady Beetle         |
| ##<br>## | 25<br>Stingless Bee         | 25<br>Spider/Mite Class        |
| ##       | 25                          | Spider/Mite Class              |
| ##       | Tobacco Flea Beetle         | Citrus Leafminer               |
| ##       | 24                          | 23                             |
| ##       | Ladybird Beetle             | Mason Bee                      |
| ##       | 23                          | 22                             |
| ##       | Mosquito                    | Argentine Ant                  |
| ##       | 22                          | 21                             |
| ##<br>## | Beetle<br>21                | Flatheaded Appletree Borer 20  |
| ##       | Horned Oak Gall Wasp        | Leaf Beetle Family             |
| ##       | normed ban dari wasp        | 20                             |
| ##       | Potato Leafhopper           | Tooth-necked Fungus Beetle     |
| ##       | 20                          | 20                             |
| ##       | Codling Moth                | Black-spotted Lady Beetle      |
| ##       | 19                          | 18                             |
| ##       | Calico Scale                | Fairyfly Parasitoid            |
| ##       | 18                          | Minute Demogitic Magne         |
| ##<br>## | Lady Beetle<br>18           | Minute Parasitic Wasps<br>18   |
| ##       | Mirid Bug                   | Mulberry Pyralid               |
| ##       | 18                          | 18                             |
|          |                             |                                |

| Vedalia Beetle               | Silkworm                           | ## |
|------------------------------|------------------------------------|----|
| 18                           | 18                                 | ## |
| Bee Order                    | Araneoid Spider Order              | ## |
| 17                           | 17                                 | ## |
| Insect Class                 | Egg Parasitoid                     | ## |
| 17                           | 17                                 | ## |
| Oystershell Scale Parasitoid | Moth And Butterfly Order           | ## |
| 17                           | 17                                 | ## |
| Hemlock Wooly Adelgid        | Hemlock Woolly Adelgid Lady Beetle | ## |
| 16                           | 16                                 | ## |
| Onion Thrip                  | Mite                               | ## |
| 16                           | 16                                 | ## |
| Corn Earworm                 | Western Flower Thrips              | ## |
| 14                           | 15                                 | ## |
| House Fly                    | Green Peach Aphid                  | ## |
| 14                           | 14                                 | ## |
| Red Scale Parasite           | Ox Beetle                          | ## |
| 14                           | 14                                 | ## |
| Armoured Scale Family        | Spined Soldier Bug                 | ## |
| 13                           | 14                                 | ## |
| Eulophid Wasp                | Diamondback Moth                   | ## |
| 13                           | 13                                 | ## |
| Predatory Bug                | Monarch Butterfly                  | ## |
| 13                           | 13                                 | ## |
| Braconid Parasitoid          | Yellow Fever Mosquito              | ## |
| 12                           | 13                                 | ## |
| Eastern Subterranean Termite | Common Thrip                       | ## |
| 12                           | 12                                 | ## |
| Mite Order                   | Jassid                             | ## |
| 12                           | 12                                 | ## |
| Pond Wolf Spider             | Pea Aphid                          | ## |
| 12                           | 12                                 | ## |
| Glasshouse Potato Wasp       | Spotless Ladybird Beetle           | ## |
| 10                           | 11                                 | ## |
| Southern House Mosquito      | Lacewing                           | ## |
| 10                           | 10                                 | ## |
| Ant Family                   | Two Spotted Lady Beetle            | ## |
| 9                            | 10                                 | ## |
| (Other)                      | Apple Maggot                       | ## |
| 670                          | 9                                  | ## |
|                              |                                    |    |

Answer: The six most commonly studied insects in this dataset are the honey bee, parasitic wasp, buff tailed bumblebee, carniloan honey bee, bumble bee, and Italian honeybee. All six are members of the Hymenoptera order of insects, five of which are bees. As noted about the concern of toxic ingestion via nectar, that is why these six are likely a research interest over other species.

8. Concentrations are always a numeric value. What is the class of Conc.1..Author. in the dataset, and why is it not numeric?

## class(neonics\$Conc.1..Author.)

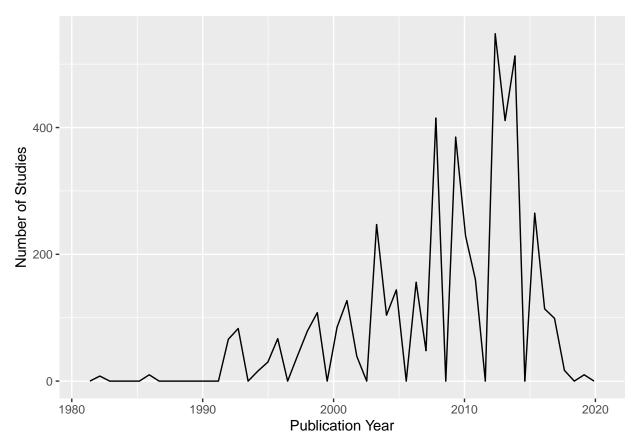
## ## [1] "character"

Answer: The class of Conc.1..Author. is a character rather than numeric because not all entries are numeric. For example, there are approximations (ex: ~10) and no readings (NR).

## Explore your data graphically (Neonics)

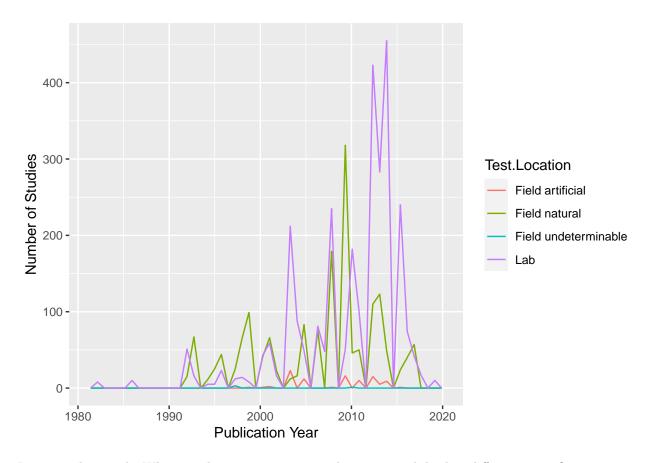
9. Using geom\_freqpoly, generate a plot of the number of studies conducted by publication year.

```
ggplot(neonics) +
  geom_freqpoly(aes(x = Publication.Year), bins = 50) +
  scale_x_continuous() +
  labs(x = "Publication Year", y = "Number of Studies")
```



10. Reproduce the same graph but now add a color aesthetic so that different Test.Location are displayed as different colors.

```
ggplot(neonics) +
geom_freqpoly(aes(x = Publication.Year, color = Test.Location), bins = 50) +
labs(x = "Publication Year", y = "Number of Studies")
```

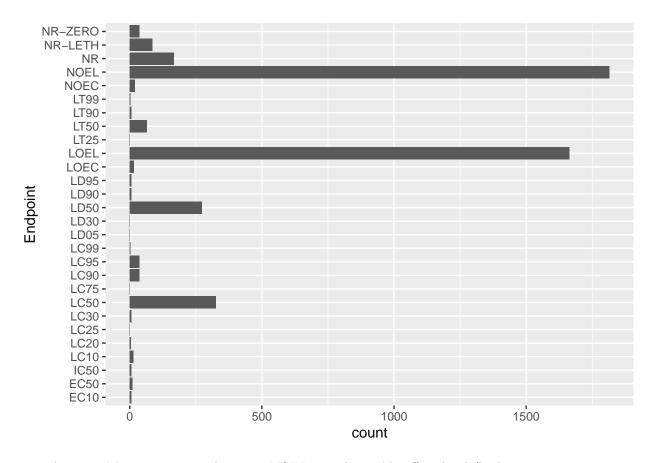


Interpret this graph. What are the most common test locations, and do they differ over time?

Answer: The two most common test locations are lab and field natural. Generally, lab test locations are more common, but there are points in time (particularly before 2000 and around 2008) where there are more field natural than lab. Additionally, both test locations vary in number of studies over time, with cyclical peaks and troughs.

11. Create a bar graph of Endpoint counts. What are the two most common end points, and how are they defined? Consult the ECOTOX\_CodeAppendix for more information.

```
ggplot(neonics, aes(x = Endpoint)) +
geom_bar() +
coord_flip() # for label viability
```



Answer: Most common endpoint is NOEL, no observable effect level (highest concentration producing effects not significantly different from control responses) and second most common is LOEL, lowest observable effect level (lowest concentration producing significantly different effects from control responses).

## Explore your data (Litter)

## [1] "2018-08-02" "2018-08-30"

12. Determine the class of collectDate. Is it a date? If not, change to a date and confirm the new class of the variable. Using the unique function, determine which dates litter was sampled in August 2018.

```
# is it date class?

class(litter$collectDate)

## [1] "character"

# convert to date
litter$collectDate <- as.Date(litter$collectDate, format = "%Y-%m-%d")

# confirm new class
class(litter$collectDate)

## [1] "Date"

# determine which dates litter was sampled in August 2018
unique(litter$collectDate)
```

13. Using the unique function, determine how many plots were sampled at Niwot Ridge. How is the

information obtained from unique different from that obtained from summary?

## unique(litter\$siteID)

```
## [1] "NIWO"
```

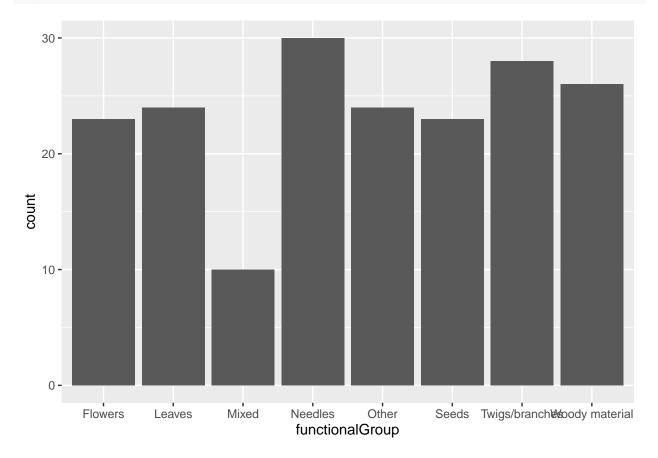
summary(litter\$siteID)

```
## Length Class Mode
## 188 character character
```

Answer: All plots were sampled at Niwot Ridge because there is only one unique result (NIWO). This is different from summary because summary tells how many samples (188) were at a siteID but unique will only output how many different siteIDs there are.

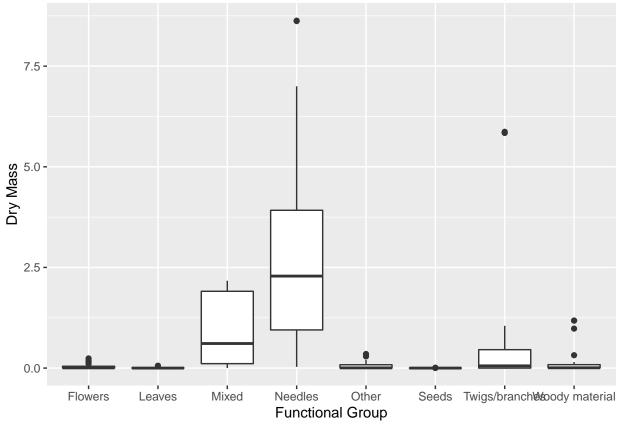
14. Create a bar graph of functionalGroup counts. This shows you what type of litter is collected at the Niwot Ridge sites. Notice that litter types are fairly equally distributed across the Niwot Ridge sites.

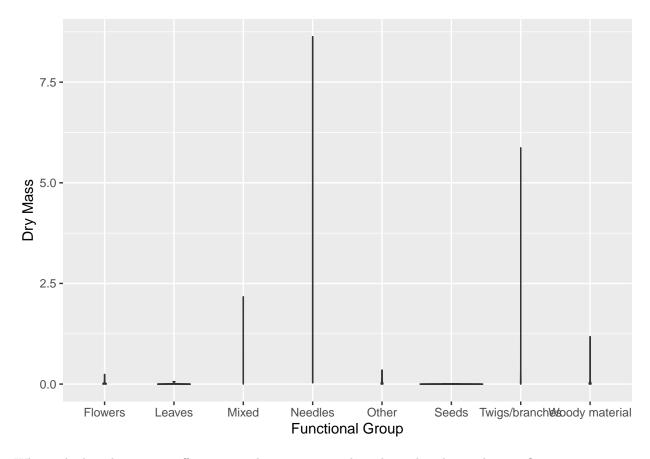
```
ggplot(litter, aes(x = functionalGroup)) +
  geom_bar()
```



15. Using geom\_boxplot and geom\_violin, create a boxplot and a violin plot of dryMass by functional-Group.

```
ggplot(litter) +
  geom_boxplot(aes(x = functionalGroup, y = dryMass)) +
  labs(x = "Functional Group", y = "Dry Mass")
```





Why is the boxplot a more effective visualization option than the violin plot in this case?

Answer: The boxplot is a more effective visualization option because it is able to more clearly display the variance and percentiles of data whereas the violin plot collapses the figures to an illegible size/shape.

What type(s) of litter tend to have the highest biomass at these sites?

Answer: Needles tend to have the highest biomass at these sites.