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 Tuesday, January 28 at 1:00 pm.

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] "C:/Users/26059/OneDrive/Desktop/ENV 872 R/Yang_ENV872"

```
library(tidyverse)
Neonics <- read.csv("./Data/Raw/ECOTOX_Neonicotinoids_Insects_raw.csv")
Litter <- read.csv("./Data/Raw/NEON_NIWO_Litter_massdata_2018-08_raw.csv")</pre>
```

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: Neonicotinoid pesticides are widely applied to agriculture land. The residue of neonicotinoid may post risk to non-target beneficial insects. Insects are one of important parts of a healthy ecosystem. Therefore, we might interested in the ecotoxicology of this chemical for ecosystem health and balance.

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: Insects constantly contact with litter and woody debris. Knowing the concentration of chemical in litter and woody debris can help to identify the chemical exposure of insects.

4. How is litter and woody debr is 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: spatial sampling design ramdom for the tower plots, and target for the forest tower airshed *temporal sampling design

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, determine the most common effects that are studied. Why might these effects specifically be of interest?

summary(Neonics\$Effect)

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

Answer: Population and mortality are the most common effects that are studied. Because both of them can reflect the acute effect of the chemical, while other endpoints are reflecting chronic effect.

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.

## Buff Tailed Bumblebee			5
## Buff Tailed Bumblebee ## 183			Parasitic Wasp
## Bumble Bee IItalian Honeybee ## 140 1140 1141			285
## Bumble Bee 140 140 151 ## 151 ## 1			•
## Japanese Beetle ## Japanese Beetle ## 94 ## Euonymus Scale Wireword 75 ## European Dark Bee ## 66 ## 66 ## 66 ## Asian Citrus Psyllid Parastic War 66 ## Colorado Potato Beetle Parasitoid War 75 ## Erythrina Gall Wasp Beetle Ord ## Sevenspotted Lady Beetle Ord ## Sevenspotted Lady Beetle Ord ## Aphid Family Sevenspotted Lady Beetle ## 45 ## Aphid Family Cabbage Loope ## 33 ## Sweetpotato Whitefly Braconid War 37 ## Cotton Aphid Predatory Mi ## 33 ## Ladybird Beetle Family Parasito ## 30 ## Scarab Beetle Spring Tiph ## 29 ## Rove Beetle Family Tobacco Aphid ## 29 ## Rove Beetle Family Tobacco Aphid ## 29 ## Chalcid Wasp Convergent Lady Beet ## 27 ## Chalcid Wasp Convergent Lady Beet ## 25 ## Stingless Bee Spider/Mite Clar ## 24 ## Stingless Bee Spider/Mite Clar ## 24 ## Ladybird Beetle ## 25 ## Tobacco Flea Beetle ## 24 ## Ladybird Beetle Family Argentine Argenti			152
## Japanese Beetle 94			•
## Euonymus Scale			113
## Euonymus Scale			
## European Dark Bee			76
## European Dark Bee ## 66		•	
## Asian Citrus Psyllid Parastic War ## Colorado Potato Beetle Parasitoid War ## Frythrina Gall Wasp Beetle Ord ## Snout Beetle Family, Weevil Sevenspotted Lady Beet. ## True Bug Order Buff-tailed Bumbleb ## Aphid Family Cabbage Loop ## 38 ## Sweetpotato Whitefly Braconid War ## 37 ## Cotton Aphid Predatory Mir ## 33 ## Ladybird Beetle Family Parasito ## 30 ## Scarab Beetle Spring Tiph: ## 29 ## Thrip Order Ground Beetle Family ## 29 ## Rove Beetle Family Tobacco Aph: ## 29 ## Rove Beetle Family Tobacco Aph: ## 29 ## Thrip Order Ground Beetle Family ## 29 ## Tobacco Aph: ## 20 ## Anson Beetle Family Tobacco Aph: ## 25 ## Stingless Bee Spider/Mite Class ## 24 ## Ladybird Beetle ## 25 ## Tobacco Flea Beetle ## 24 ## Ladybird Beetle ## 25 ## Flatheaded Appletree Bor ## Beetle Flatheaded Appletree Bor ## Beetle Flatheaded Appletree Bor ## Beetle Family ## Beetle Flatheaded Appletree Bor ## Beetle Flatheaded Appletree Bor ## Beetle Flatheaded Appletree Bor			69
## Asian Citrus Psyllid 60		-	
## Colorado Potato Beetle			62
## Colorado Potato Beetle		•	-
## Erythrina Gall Wasp Beetle Ord ## Snout Beetle Family, Weevil			58
## Erythrina Gall Wasp 49 ## Snout Beetle Family, Weevil Sevenspotted Lady Beetle ## 47 ## True Bug Order Buff-tailed Bumbleb ## 45 ## Aphid Family Cabbage Loope ## 38 ## Sweetpotato Whitefly Braconid War ## 37 ## Cotton Aphid Predatory Mi ## 33 ## Ladybird Beetle Family Parasitor ## 30 ## Scarab Beetle Spring Tiph: 29 ## Thrip Order Ground Beetle Family ## 29 ## Rove Beetle Family Tobacco Aph: ## 27 ## Chalcid Wasp Convergent Lady Beetle ## 25 ## Stingless Bee Spider/Mite Clast ## 24 ## Ladybird Beetle ## 23 ## Mosquito Argentine Argent			-
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## Scarab Beetle Spring Tiph: ## 29		· ·	
## Thrip Order Ground Beetle Famil ## 29 ## Rove Beetle Family Tobacco Aph ## 27 ## Chalcid Wasp Convergent Lady Beet ## 25 ## Stingless Bee Spider/Mite Clas ## 25 ## Tobacco Flea Beetle Citrus Leafmin ## 24 ## Ladybird Beetle Mason Be ## 23 ## Mosquito Argentine An ## 22 ## Beetle Flatheaded Appletree Bore ## 21 ## Horned Oak Gall Wasp Leaf Beetle Famil ##			30
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## Beetle Flatheaded Appletree Bore ## 21 ## Horned Oak Gall Wasp Leaf Beetle Famil ## 20		-	<u> </u>
## 21 Leaf Beetle Famil ## 20			21
## Horned Oak Gall Wasp Leaf Beetle Famil ## 20			
## 20			20
		_	
			20
## Potato Leafhopper Tooth-necked Fungus Beet:	##	Potato Leafhopper	Tooth-necked Fungus Beetle

##	20	20
##	Codling Moth	Black-spotted Lady Beetle
##	19	18
##	Calico Scale	Fairyfly Parasitoid
##	18	18
##	Lady Beetle	Minute Parasitic Wasps
##	18	18
##		Mulberry Pyralid
	Mirid Bug 18	18
##		
##	Silkworm	Vedalia Beetle
##	18	18
##	Araneoid Spider Order	Bee Order
##	17	17
##	Egg Parasitoid	Insect Class
##	17	17
##	Moth And Butterfly Order	Oystershell Scale Parasitoid
##	17	17
##	Hemlock Woolly Adelgid Lady Beetle	Hemlock Wooly Adelgid
##	16	16
##	Mite	Onion Thrip
##	16	16
##	Western Flower Thrips	Corn Earworm
##	western riower inrips	14
##		
	Green Peach Aphid	House Fly
##	14 0 R+1	Park Garda Parasita
##	Ox Beetle	Red Scale Parasite
##	14	
##	Spined Soldier Bug	Armoured Scale Family
##	14	13
##	Diamondback Moth	Eulophid Wasp
##	13	13
##	Monarch Butterfly	Predatory Bug
##	13	13
##	Yellow Fever Mosquito	Braconid Parasitoid
##	13	12
##	Common Thrip	Eastern Subterranean Termite
##	12	12
##	Jassid	Mite Order
##	12	12
##	Pea Aphid	Pond Wolf Spider
##	12	12
##	Spotless Ladybird Beetle	Glasshouse Potato Wasp
##	11	10
##	Lacewing	Southern House Mosquito
##	10	10
##	Two Spotted Lady Beetle	Ant Family
##	10	9
##	10	9

Answer: The most common is honey bee, parasitic wasp, buff tailed bumblebee, carniolan honey bee, bumble bee and Italian honeybee. The six most commonly species are all pollinators. They got more attention than other species because they are important pollinators for agriculture crops.

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] "factor"

str(Neonics$Conc.1..Author.)
```

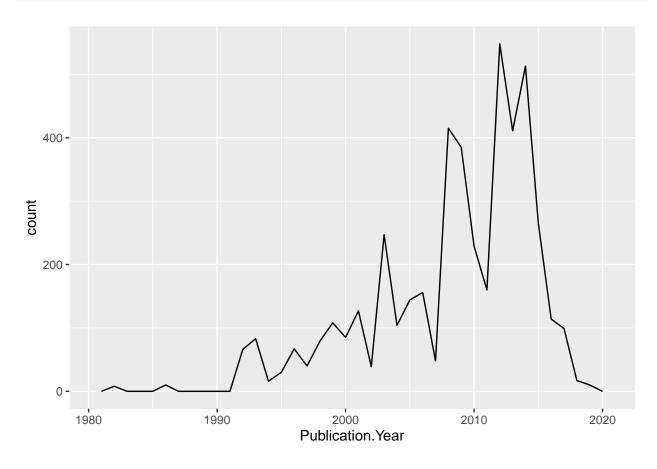
Factor w/ 1006 levels "~10","~30/","~40/",...: 639 510 813 622 442 637 500 642 814 784 ...

Answer: It is factor. Because it has non-numeric subjects and symbol like slash..

Explore your data graphically (Neonics)

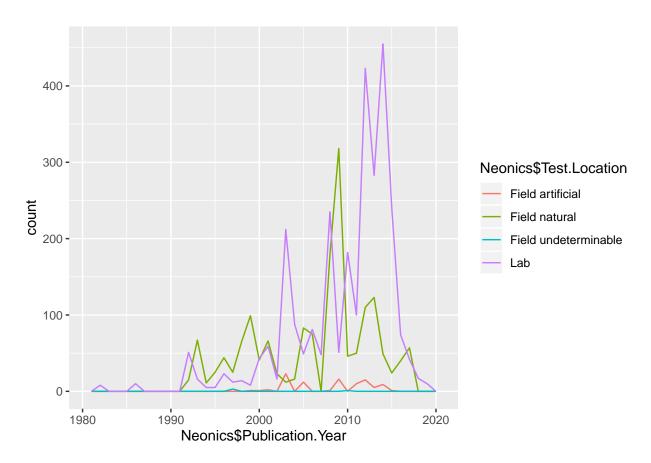
9. Using geom_freqpoly, generate a plot of the number of studies conducted by publication year.

```
ggplot(Neonics) +
geom_freqpoly(aes(x = Publication.Year), binwidth = 1)
```



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 = Neonics$Publication.Year, color = Neonics$Test.Location ),binwidth = 1)
```

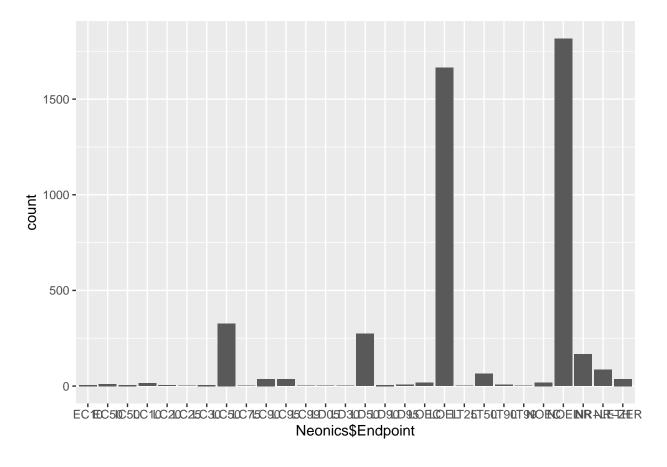


Interpret this graph. What are the most common test locations, and do they differ over time?

Answer:

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 = Neonics$Endpoint)) +
geom_bar()
```



Answer: The most common end points are LOEL and NOEL.LOEL is the lowest observed adverse effect level. NOEL is the highest no observable effect level.

Explore your data (Litter)

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.

```
class(Litter$collectDate)

## [1] "factor"

Litter$collectDate <- as.Date(Litter$collectDate,format="%Y-%m-%d")
class(Litter$collectDate)

## [1] "Date"

unique(Litter$collectDate)</pre>
```

- ## [1] "2018-08-02" "2018-08-30"
 - 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\$plotID)

```
## [1] NIWO_061 NIWO_064 NIWO_067 NIWO_040 NIWO_041 NIWO_063 NIWO_047 ## [8] NIWO_051 NIWO_058 NIWO_046 NIWO_062 NIWO_057 ## 12 Levels: NIWO_040 NIWO_041 NIWO_046 NIWO_047 NIWO_051 ... NIWO_067
```

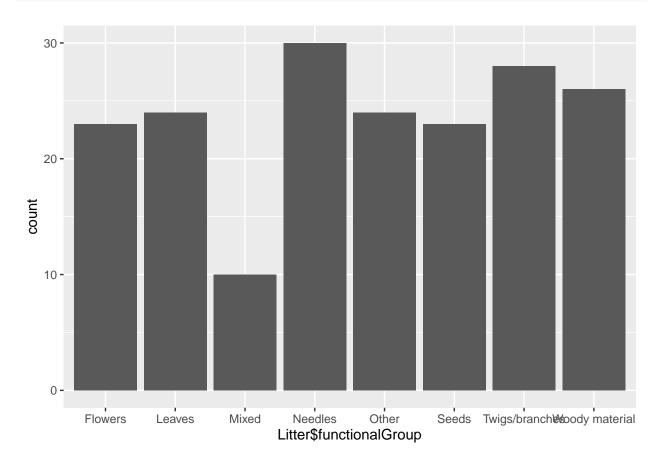
summary(Litter\$plotID)

```
## NIWO_040 NIWO_041 NIWO_046 NIWO_047 NIWO_051 NIWO_057 NIWO_058 NIWO_061
##
         20
                                                14
                                                           8
                                                                   16
                   19
                             18
                                      15
                                                                             17
## NIWO_062 NIWO_063 NIWO_064 NIWO_067
##
         14
                   14
                             16
                                      17
```

Answer: 12 plots. The information obtained from unique function does not include the count of the same plot. However, It gives the number of the unique plots and has a rank of the plot code.

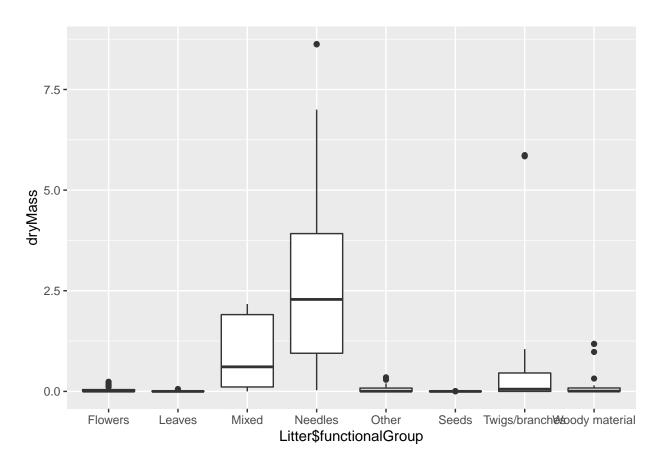
14. Create a bar graph of functionalGroup counts. This shows you what type of litter is collected at the Niwot Ridge sites. Notice that litter types are fairly equally distributed across the Niwot Ridge sites.

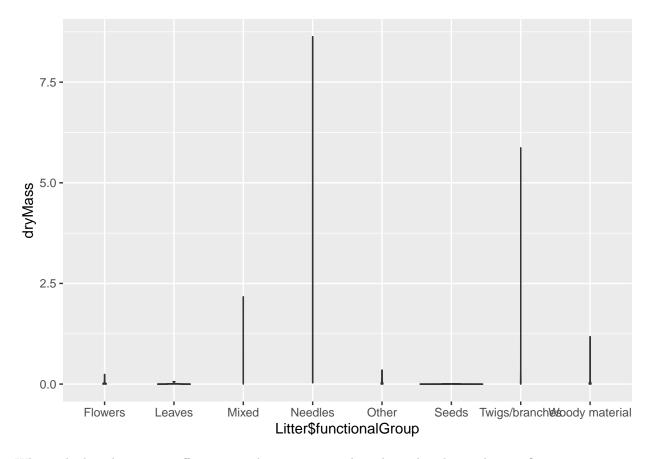
```
ggplot(Litter, aes(x = Litter$functionalGroup)) +
geom_bar()
```



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 = Litter$functionalGroup, y = dryMass))
```





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

Answer: The dry mass between different functional groups vary too much.

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

Answer: Needles