# 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, Section #" on line 3 (above) with your name and section number.
- 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., "FirstLast\_A03\_DataExploration.Rmd") prior to submission.

The completed exercise is due on <>.

## Set up your R session

Check your working directory, load necessary packages (tidyverse), and upload two datasets: the ECO-TOX 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. Be sure to add the stringsAsFactors = TRUE parameter to the function when reading in the CSV files.

```
library(tidyverse)
#getwd()
Neonics <-read.csv("../Data/Raw/ECOTOX_Neonicotinoids_Insects_raw.csv", stringsAsFactors = TRUE)
Litter <-read.csv("../Data/Raw/NEON_NIWO_Litter_massdata_2018-08_raw.csv", stringsAsFactors = TRUE)</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: There have been several studies on neonicotinoids that linked the use of these chemicals to honey-bee collapse disorder. As environmentalists and data scientists, we might be interested in doing some of research of our own on this topic. If neonicotinoids are really that harmful to bees, the entire environmental field should be concerned.

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: Woody debris and litter can mde used as a proxy for the health of a forest. This debris and litter allows for the recyling of nutrients in the forest and therefore improve biodiversity. As a result, the measure of litter and woody debris can be used as information regarding the biodiversity of a forest.

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: Litter is defined as material that is dropped from the forest canopy and has a butt end diameter <2cm and a length <50 cm, this material is collected in elevated  $0.5m^2$  PVC traps Fine wood debris is defined as material that is dropped from the forest canopy and has a but end diameter <2cm and a length >50 cm, this material is collected in ground traps as longer material is not reliably collected by the elevated traps \*Litter and fine woody debris sampling is executed at terrestrial NEON sites that contain woody vegetation >2m tall

## Obtain basic summaries of your data (Neonics)

5. What are the dimensions of the dataset?

#### dim(Neonics)

## [1] 4623 30

Answer: There are 4623 observations of 30 variables

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

#### summary(Neonics\$Effect)

##	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 most common effects studied are population and mortality by a long shot. These effects might specifically be of interest becaues we're interested in the effect the neonicotinoids have on the health of bee colonies. These colonies aren't acting strangely, they are dying at a concerning rate and we need to know if these neonicotinoids are the cause.

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.

### summary(Neonics\$Species.Common.Name)

##	Honey Bee	Parasitic Wasp
##	667	285
##	Buff Tailed Bumblebee	Carniolan Honey Bee
## ##	183 Bumble Bee	152 Italian Honeybee
##	140	113
##	Japanese Beetle	Asian Lady Beetle
##	94	76
##	Euonymus Scale	Wireworm
##	75	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 49	Beetle Order 47
## ##	Snout Beetle Family, Weevil	Sevenspotted Lady Beetle
##	47	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
##	Ladybird Beetle Family	Parasitoid
## ##	30 Scarab Beetle	Spring Tiphia
##	29	Spring Tiphia 29
##	Thrip Order	Ground Beetle Family
##	29	27
##	Rove Beetle Family	Tobacco Aphid
##	27	27
##	Chalcid Wasp	Convergent Lady Beetle
##	25	25
##	Stingless Bee	Spider/Mite Class
##	25	24
##	Tobacco Flea Beetle	Citrus Leafminer
##	24	23
##	Ladybird Beetle	Mason Bee
## ##	23 Mosquita	22
##	Mosquito 22	Argentine Ant 21
##	Beetle	Flatheaded Appletree Borer
##	21	20
		20

##	Horned Oak Gall Wasp 20	Leaf Beetle Family 20
##	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
##	Mirid Bug	Mulberry Pyralid
##	18	18
##	Silkworm	Vedalia Beetle
##	18	vedaria becute
##	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
##	15	14
##	Green Peach Aphid	House Fly
##	14	14
## ##		
	14	14
##	14 Ox Beetle	14 Red Scale Parasite
## ##	14 Ox Beetle 14	14 Red Scale Parasite 14
## ## ##	14 Ox Beetle 14 Spined Soldier Bug	Red Scale Parasite 14 Armoured Scale Family 13
## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth	14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp
## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13	Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp
## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly	Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug
## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13	Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13
## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito	Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13 Braconid Parasitoid
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## ## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip	Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13 Braconid Parasitoid 12 Eastern Subterranean Termite
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## ## ## ## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip 12 Jassid 12 Pea Aphid 12 Spotless Ladybird Beetle	Red Scale Parasite  14  Armoured Scale Family 13  Eulophid Wasp 13  Predatory Bug 13  Braconid Parasitoid 12  Eastern Subterranean Termite 12  Mite Order 12  Pond Wolf Spider 12  Glasshouse Potato Wasp
## ## ## ## ## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip 12 Jassid 12 Pea Aphid 12 Spotless Ladybird Beetle	Red Scale Parasite  14  Armoured Scale Family 13  Eulophid Wasp 13  Predatory Bug 13  Braconid Parasitoid 12  Eastern Subterranean Termite 12  Mite Order 12  Pond Wolf Spider 12  Glasshouse Potato Wasp 10
## ## ## ## ## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip 12 Jassid 12 Pea Aphid 12 Spotless Ladybird Beetle 11 Lacewing	Red Scale Parasite  14  Armoured Scale Family 13  Eulophid Wasp 13  Predatory Bug 13  Braconid Parasitoid 12  Eastern Subterranean Termite 12  Mite Order 12  Pond Wolf Spider 12  Glasshouse Potato Wasp 10  Southern House Mosquito
## ## ## ## ## ## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip 12 Jassid 12 Pea Aphid 12 Spotless Ladybird Beetle 11 Lacewing 10	Red Scale Parasite  14  Armoured Scale Family 13  Eulophid Wasp 13  Predatory Bug 13  Braconid Parasitoid 12  Eastern Subterranean Termite 12  Mite Order 12  Pond Wolf Spider 12  Glasshouse Potato Wasp 10  Southern House Mosquito
## ## ## ## ## ## ## ## ## ## ## ## ##	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip 12 Jassid 12 Pea Aphid 12 Spotless Ladybird Beetle 11 Lacewing 10 Two Spotted Lady Beetle	Red Scale Parasite  14  Armoured Scale Family 13  Eulophid Wasp 13  Predatory Bug 13  Braconid Parasitoid 12  Eastern Subterranean Termite 12  Mite Order 12  Pond Wolf Spider 12  Glasshouse Potato Wasp 10  Southern House Mosquito 10  Ant Family
######################################	14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip 12 Jassid 12 Pea Aphid 12 Spotless Ladybird Beetle 11 Lacewing 10 Two Spotted Lady Beetle	Red Scale Parasite  14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13 Braconid Parasitoid 12 Eastern Subterranean Termite 12 Mite Order 12 Pond Wolf Spider 12 Glasshouse Potato Wasp 10 Southern House Mosquito 10 Ant Family
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Answer: It appears that the Honey Bee, the Parasitic Wasp, the Buff Tailed Bumblebee, the

Carniolan Honey Bee, the Bumble Bee, and the Italian Honeybee are the most commonly studied species in the dataset. All these species pollinate most of our agricultural crops and therefore are of most economic value to humanity. The loss of the mosquito might be exciting. The loss of all of the world's bees could mean disaster.

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

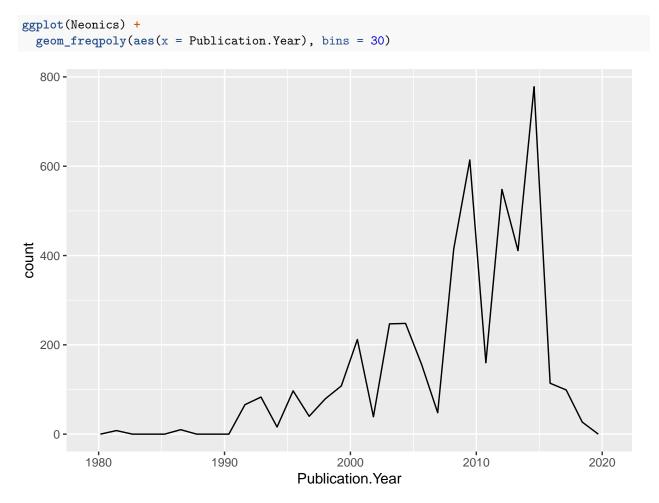
```
class(Neonics$Conc.1..Author.)
```

### ## [1] "factor"

Answer: The class of Conc.1..Author is "factor" and not numeric becaue when we read the data into R, there were some non-numeric values in the column. As a result, R saw that the column was not entirely numeric so it treated it as a factor.

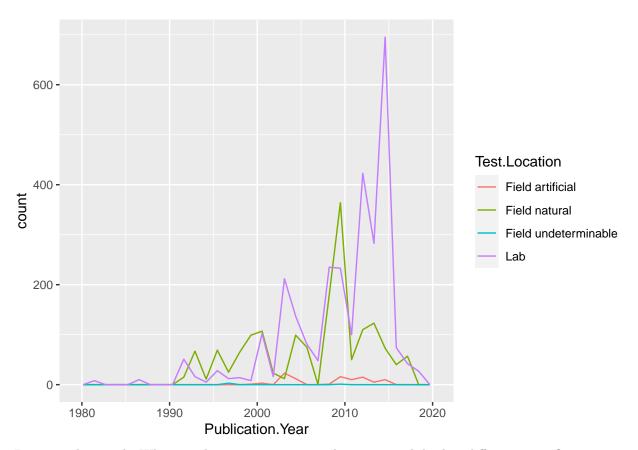
## Explore your data graphically (Neonics)

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



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



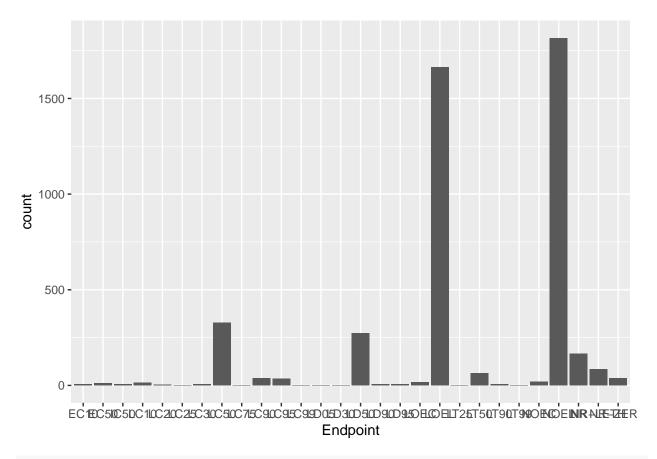


Interpret this graph. What are the most common test locations, and do they differ over time?

Answer: It appears that the most common test locations were "Field natural" and "Lab". They also do appear to differ over time. "Field natural" was the most common test location in 2008-2010, but a laboratory setting was always rather popular and become very popular from 2011-2015.

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()
```



<pre>summary(Neonics\$Endpoin</pre>	t)
-------------------------------------	----

##	EC10	EC50	IC50	LC10	LC20	LC25	LC30	LC50	LC75	LC90
##	6	11	6	15	5	1	6	327	1	37
##	LC95	LC99	LD05	LD30	LD50	LD90	LD95	LOEC	LOEL	LT25
##	36	2	1	1	274	6	7	17	1664	1
##	LT50	LT90	LT99	NOEC	NOEL	NR	$\mathtt{NR-LETH}$	NR-ZERO		
##	65	7	2	19	1816	167	86	37		

Answer: The two most common end points are NOEL and LOEL. They are defined as NOEL: noobservable-effect-level: Highest dose (concentration) producing effects not significantly different fomr response of constrol according to author's reported statistical test; and LOEL: Lowestobserved-effect-level: lowest dose (concentration) producing effects that were significantly different (as resported by authors) from resoponses of controls.

# 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$collectDate)
Litter$collectDate <- as.Date(Litter$collectDate, format = "%Y-%m-%d")
class(Litter$collectDate)</pre>
```

```
## [1] "Date"
```

### unique(Litter\$collectDate)

##

188

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

Answer: Litter was sampled on the 2nd and 30th day of August 2018.

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
## Levels: NIWO

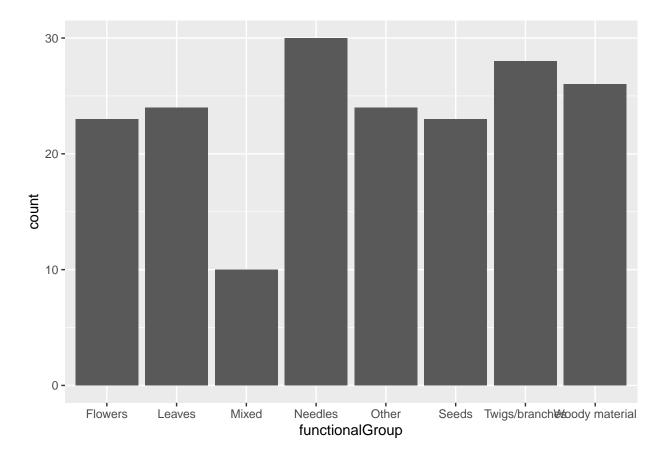
summary(Litter$siteID)

## NIWO
```

Answer: There were 188 plots sampled at Niwot Ridge. The information obtained from 'unique' is different from that obtained from 'summary' because 'unique' simply removes any duplicates from the data frame it's iteratinng over. 'summary' provides a count of the data points at each site. 'unique' is sufficient to determine how many plots were sampled at Niwot ridge however, because if 'unique' only returns one value and there are 188 observations in this data frame, then there must be 188 plots at Niwot ridge.

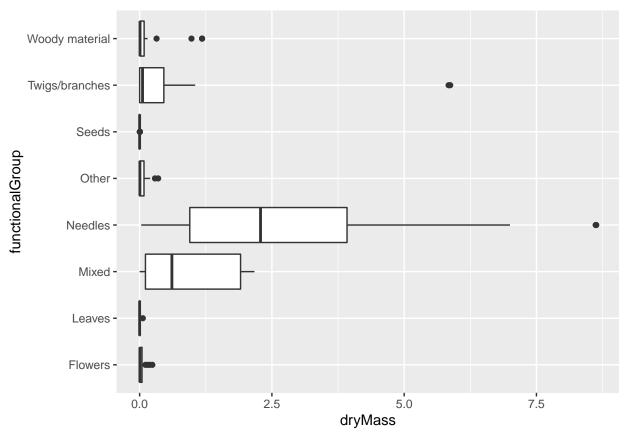
14. Create a bar graph of functionalGroup counts. This shows you what type of litter is collected at the Niwot Ridge sites. Notice that litter types are fairly equally distributed across the Niwot Ridge sites.

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

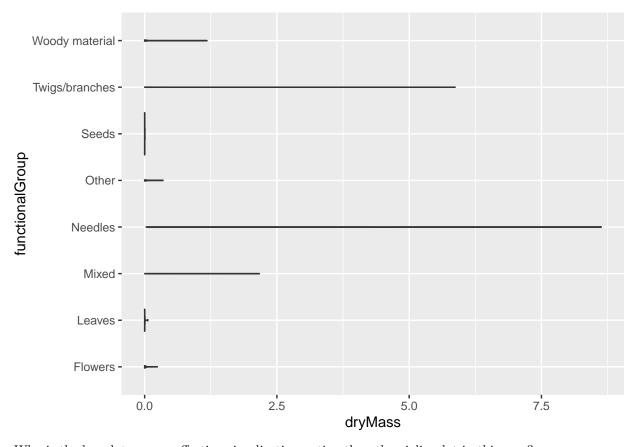


15. Using geom\_boxplot and geom\_violin, create a boxplot and a violin plot of dryMass by functional-Group.

```
ggplot(Litter) +
geom_boxplot(aes(x = dryMass, y = functionalGroup))
```



## collapsing to unique 'x' values



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

Answer: A box plot is more effective at vizualization than a violin plot in this case because there are too few dryMass values. There is no need or possibility to demonstrate the conenctration of data point at various dryMass values because there simply aren't enough data points at that value within each functionalGroup for the violin plot to function.

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

Answer: At these sites, it seems that "Needles" have the most biomass at these sites. However it should be said that "Mixed" and "Twigs/Branches" have more mass than the remaining other types of litter.