# Assignment 3: Data Exploration

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Spring 2023

### **OVERVIEW**

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

### **Directions**

- 1. Rename this file <FirstLast>\_A03\_DataExploration.Rmd (replacing <FirstLast> with your first and last name).
- 2. Change "Student Name" on line 3 (above) with your name.
- 3. Work through the steps, **creating code and output** that fulfill each instruction.
- 4. Assign a useful name to each code chunk and include ample comments with your code.
- 5. Be sure to **answer the questions** in this assignment document.
- 6. When you have completed the assignment, **Knit** the text and code into a single PDF file.
- 7. After Knitting, submit the completed exercise (PDF file) to the dropbox in Sakai.

TIP: If your code extends past the page when knit, tidy your code by manually inserting line breaks.

TIP: If your code fails to knit, check that no install.packages() or View() commands exist in your code.

# Set up your R session

1. Check your working directory, load necessary packages (tidyverse, lubridate), 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. Be sure to include the subcommand to read strings in as factors.

getwd() #finds the working directory so I can point to the file within the wd

## [1] "C:/Users/Robert Hill/Documents/EDA-Spring2023-RH"

```
library(tidyverse)
Neonics <- read.csv("./Data/Raw/ECOTOX_Neonicotinoids_Insects_raw.csv",stringsAsFactors = T)
Litter <- read.csv("./Data/Raw/NEON_NIWO_Litter_massdata_2018-08_raw.csv",stringsAsFactors = T)
#added stringasfactors so the strings are read as vectors rather than strings
```

### 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 ecotoxicology of neonicotinoids on insects? Feel free to do a brief internet search if you feel you need more background information.

Answer: neonicotinoids are ach receptor antagonist and leads to paralysis (and inevitably death) of insect. It isn't toxic to mammals, however it is very persistent in the environment. As such, we care about its ecotoxicology on insects so that we may make recommendations to minimize the amount used to reduce the amount remaining persistently in the environment.

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: the buildup of litter and woody debris provides an organic and nutrient rich environment for the soil ecosystem. Knowing this information is important in understanding soil nutrient cycling and ecosystem dynamics.

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. materials are collected in elevated 0.5m<sup>2</sup> PVC litter traps places 80cm above ground OR in 3x0.5 m rectangular ground traps (typically in pairs) 2. Total sampling locations are 20 plors with forested tower airsheds and 30 plots with low-statured vegatation over the tower airshed (total of 50) 3. One random or targeted sample pair is taken for every 400 m<sup>2</sup> plot area with miscelaneous restrictions on sampling location within a plot area biweekly for deciduous forests and every 1-2 months for evergreen sites

# Obtain basic summaries of your data (Neonics)

5. What are the dimensions of the dataset?

```
dim(Neonics) #provides number of row columns in data
```

## [1] 4623

summary(Neonics\$Effect)

##

30

Cell(s)

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?

#### ## Accumulation Avoidance Behavior Biochemistry ## 102 360

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: The most common effects are mortality and population. These are of interests because it is linked efficacy of the insecticide for the purpose for which it is used.

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.[TIP: The sort() command can sort the output of the summary command...]

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

##	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
##	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	Beetle Order
##	49	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	30
##	Scarab Beetle	Spring Tiphia
##	29	29
##	Thrip Order	Ground Beetle Family
##	29	27
##	Rove Beetle Family	Tobacco Aphid
	Ţ.	<u> </u>

##	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	22
##	Mosquito	Argentine Ant
##	22	21
##	Beetle	Flatheaded Appletree Borer
##	21	20
##	Horned Oak Gall Wasp	Leaf Beetle Family
##	20	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	18
##	Araneoid Spider Order	Bee Order
##	17	17
##	Egg Parasitoid	Insect Class
##	17	17
##		11
	Moth And Butterfly Order	
##	Moth And Butterfly Order	Oystershell Scale Parasitoid 17
	17	Oystershell Scale Parasitoid 17
	•	Oystershell Scale Parasitoid
##	17 Hemlock Woolly Adelgid Lady Beetle	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16
## ##	17 Hemlock Woolly Adelgid Lady Beetle 16	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid
## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip
## ## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16 Western Flower Thrips	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16
## ## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16 Western Flower Thrips 15	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm
## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16 Western Flower Thrips	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm
## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly
## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16 Western Flower Thrips 15 Green Peach Aphid	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly
## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14
## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle 16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite
## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14	Oystershell Scale Parasitoid 17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13
## ## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp
## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp
## ###################################	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp
## ## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug
## ## ## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13
## ## ## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13 Braconid Parasitoid
## ## ## ## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13 Braconid Parasitoid
## ## ## ## ## ## ## ## ##	Hemlock Woolly Adelgid Lady Beetle  16 Mite 16 Western Flower Thrips 15 Green Peach Aphid 14 Ox Beetle 14 Spined Soldier Bug 14 Diamondback Moth 13 Monarch Butterfly 13 Yellow Fever Mosquito 13 Common Thrip	Oystershell Scale Parasitoid  17 Hemlock Wooly Adelgid 16 Onion Thrip 16 Corn Earworm 14 House Fly 14 Red Scale Parasite 14 Armoured Scale Family 13 Eulophid Wasp 13 Predatory Bug 13 Braconid Parasitoid 12 Eastern Subterranean Termite

##	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
##	Apple Maggot	(Other)
##	9	670

Answer: This is interesting (and intuitive) because neonicotinoids are responsible for colony callapse disorder. Most of the top species are in fact bees.

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

```
class(Neonics$Conc.1..Author.) #this determines the data class of this column
```

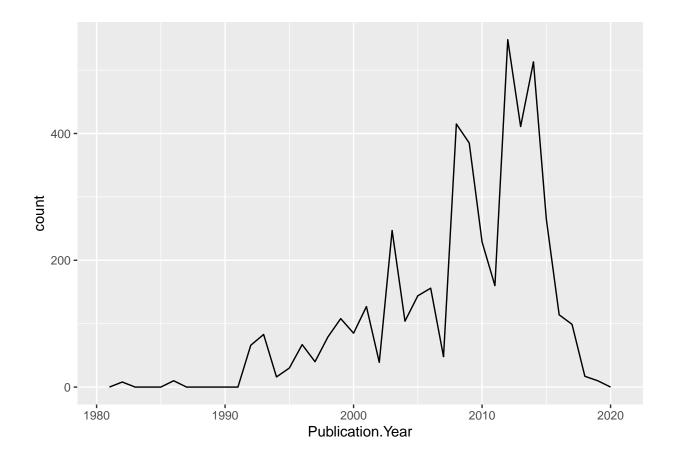
### ## [1] "factor"

Answer: the class is not numeric because there are non-numeric symbols in the cells; such as <, /, and  $\sim$ .

# Explore your data graphically (Neonics)

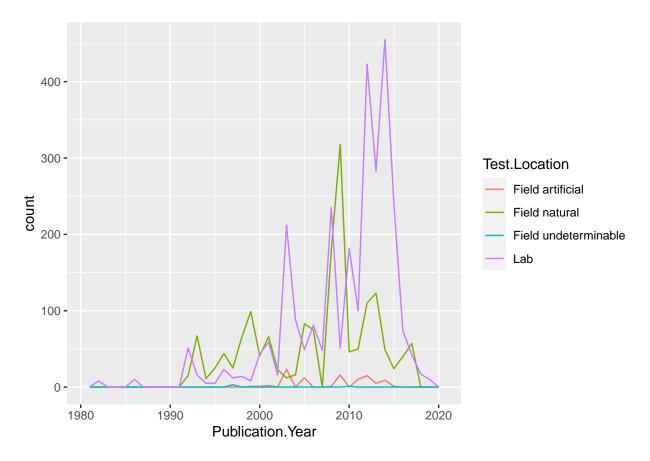
9. Using geom\_freqpoly, generate a plot of the number of studies conducted by publication year.

```
#create a frequency line graph of studies over time
ggplot(Neonics) +
  geom_freqpoly(aes(x = Publication.Year), bins=38)
```



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

```
#create a frequency line graph of studies over time, separated based on testing environment
ggplot(Neonics) +
  geom_freqpoly(aes(x = Publication.Year, color = Test.Location), bins=38)
```



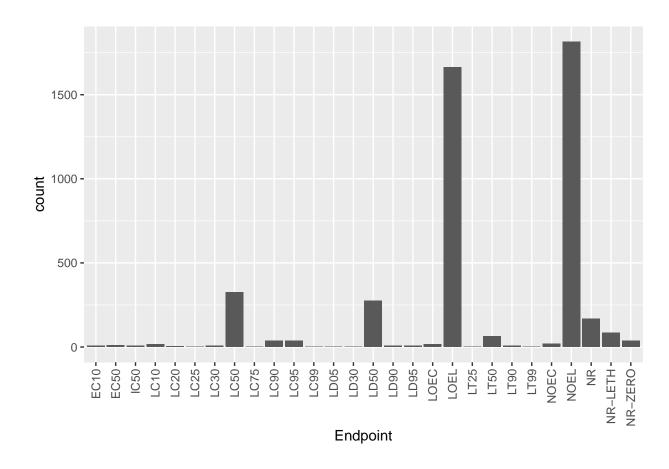
Interpret this graph. What are the most common test locations, and do they differ over time?

Answer: This graph portrays the frequency of studies conducted on neonicotinoids categorized by where the study occured (in different types of field settings or in the lab). In the 90s, the most prominent study location was in the natural field environment; however as we move into the 21st century, studies became for frequent in laboratory settings. The frequency of natural field studies didn't change too drastically, but a large addition of lab studies began to emerge into the 21st century.

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.

[TIP: Add theme(axis.text.x = element\_text(angle = 90, vjust = 0.5, hjust=1)) to the end of your plot command to rotate and align the X-axis labels...]

```
#create a bar frequency plot of common measurable endpoints with default aesthetics [aes()]
#and adjusted the text with theme() so that is is legible and not overlapping
ggplot(Neonics) +
  geom_bar(aes(x = Endpoint)) +
  theme(axis.text.x = element_text(angle = 90, vjust = 0.5, hjust=1))
```



Answer: the most common endpoints are the LOEL (lowest observable effect level) which is the lowest concentration for which there was a statistically significant response and NOEL (no observable effect level) which is the highest concentration for which there is no statistically significant response.

# 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) #this determines the class of the collectDate column

## [1] "factor"

library(lubridate)

## ## Attaching package: 'lubridate'

## The following objects are masked from 'package:base':
## date, intersect, setdiff, union
```

```
CollectDate <-ymd(Litter$collectDate) #identify collectDate as a Date class class(CollectDate) #confirms CollectDate is a date class

## [1] "Date"

unique(CollectDate) #this returns a list of unique values during which litter was sampled

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

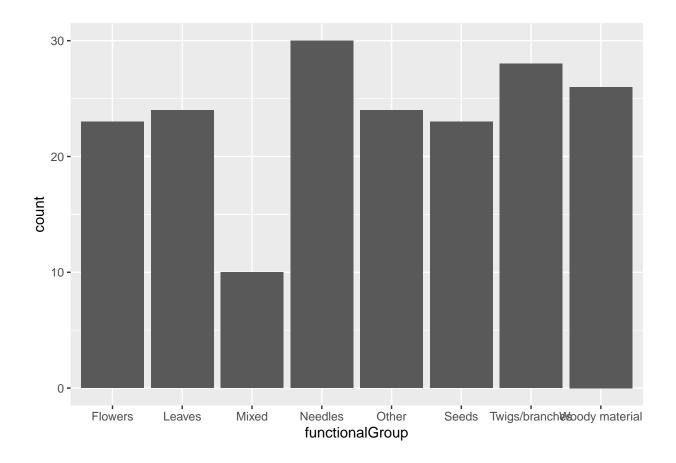
13. Using the unique function, determine how many plots were sampled at Niwot Ridge. How is the information obtained from unique different from that obtained from summary?

```
unique(Litter$plotID) #number of unique plot IDs (aka # of plots sampled)
   [1] NIWO_061 NIWO_064 NIWO_067 NIWO_040 NIWO_041 NIWO_063 NIWO_047 NIWO_051
   [9] NIWO_058 NIWO_046 NIWO_062 NIWO_057
## 12 Levels: NIWO_040 NIWO_041 NIWO_046 NIWO_047 NIWO_051 NIWO_057 ... NIWO_067
summary(Litter$plotID) #ran summary function to compare output
## NIWO_040 NIWO_041 NIWO_046 NIWO_047 NIWO_051 NIWO_057 NIWO_058 NIWO_061
                                             14
                                                                         17
         20
                  19
                           18
                                    15
                                                                16
## NIWO_062 NIWO_063 NIWO_064 NIWO_067
##
         14
                  14
                           16
```

Answer: 'unique' provides information regarding the number of unique values (12) while 'summary' only lists the unique values, requiring us to count how many unique values ourselves.

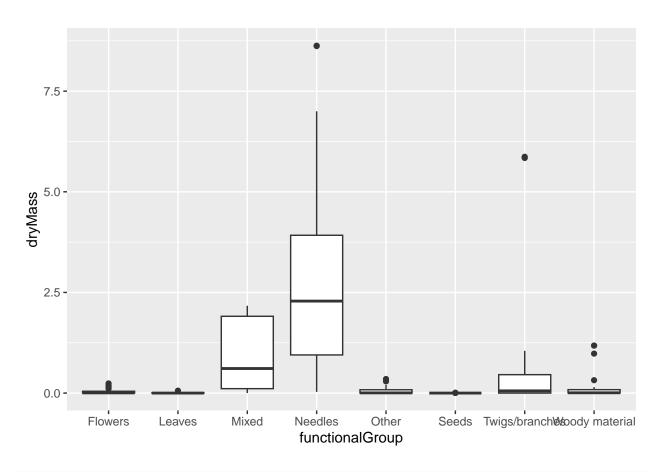
14. Create a bar graph of functional Group counts. This shows you what type of litter is collected at the Niwot Ridge sites. Notice that litter types are fairly equally distributed across the Niwot Ridge sites.

```
ggplot(Litter) +
  geom_bar(aes(functionalGroup))
```



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

```
ggplot(Litter) +
geom_boxplot(aes(functionalGroup,dryMass))
```



```
ggplot(Litter) +
  geom_violin(aes(functionalGroup,dryMass))
```



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

Answer: The boxplot provides more visual statistical information like as median and outliers. Although a violin plot can show this information and more, there is not high enough density of discrete values for the plot to be effective.

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.