

# Project

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```
knitr::opts_chunk$set(echo = F, message = F, warning = F,  
                      fig.width = 6, fig.height = 6)
```

```
library(rethinking)
```

```
## Loading required package: rstan
```

```
## Warning: package 'rstan' was built under R version 3.5.3
```

```
## Loading required package: StanHeaders
```

```
## Warning: package 'StanHeaders' was built under R version 3.5.3
```

```
## Loading required package: ggplot2
```

```
## Warning: package 'ggplot2' was built under R version 3.5.3
```

```
## rstan (Version 2.19.2, GitRev: 2e1f913d3ca3)
```

```
## For execution on a local, multicore CPU with excess RAM we recommend calling  
## options(mc.cores = parallel::detectCores()).  
## To avoid recompilation of unchanged Stan programs, we recommend calling  
## rstan_options(auto_write = TRUE)
```

```
## For improved execution time, we recommend calling  
## Sys.setenv(LOCAL_CPPFLAGS = '-march=native')  
## although this causes Stan to throw an error on a few processors.
```

```
## Loading required package: parallel
```

```
## Loading required package: dagitty
```

```
## Warning: package 'dagitty' was built under R version 3.5.3
```

```
## rethinking (Version 1.93)
```

```
##
## Attaching package: 'rethinking'
```

```
## The following object is masked from 'package:stats':
##
##      rstudent
```

```
library(dplyr)
```

```
## Warning: package 'dplyr' was built under R version 3.5.3
```

```
##
## Attaching package: 'dplyr'
```

```
## The following objects are masked from 'package:stats':
##
##      filter, lag
```

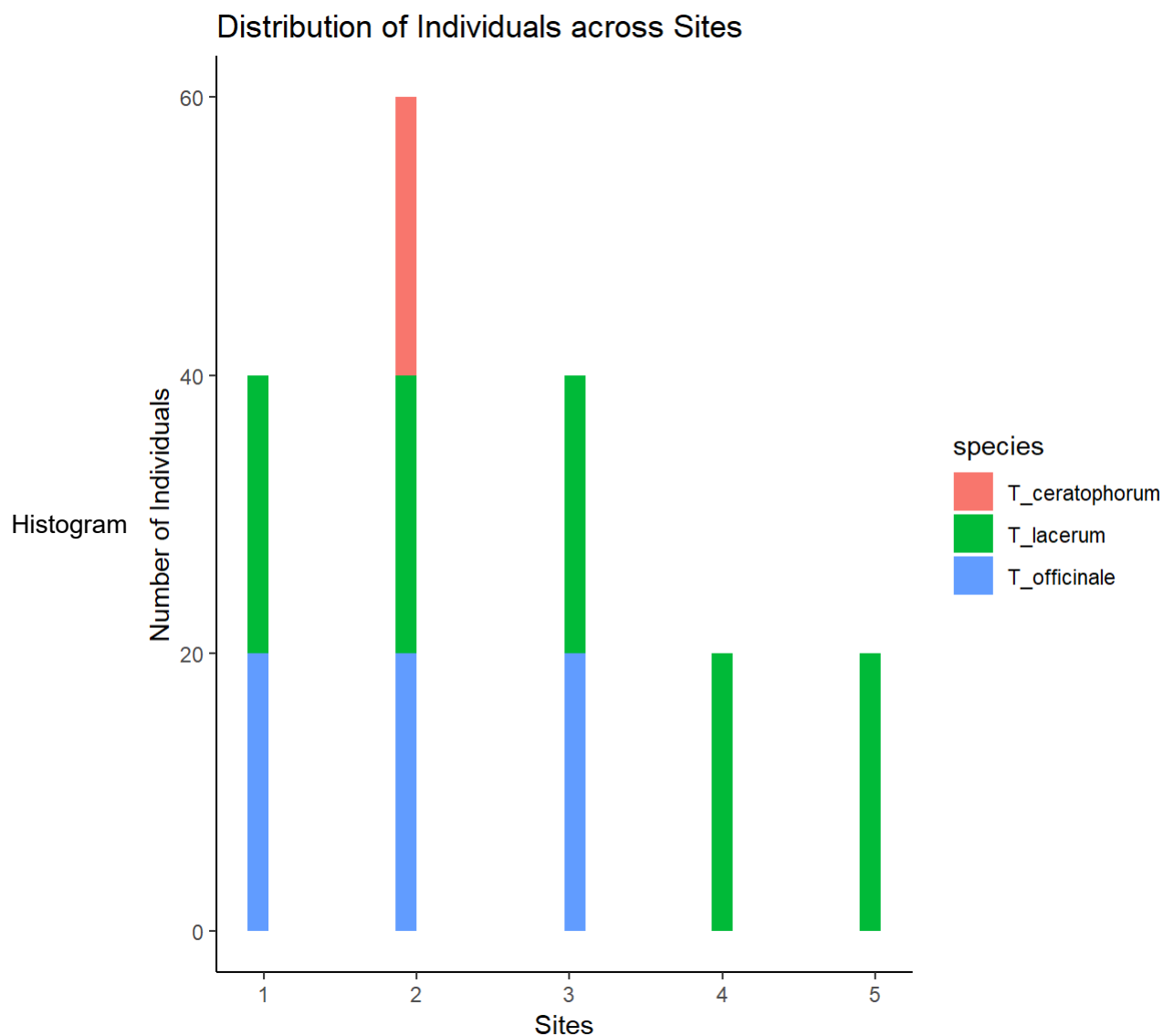
```
## The following objects are masked from 'package:base':
##
##      intersect, setdiff, setequal, union
```

## Visualizing all data

```
## 'data.frame':   180 obs. of  8 variables:
## $ plant  : int  1 2 3 4 5 6 7 8 9 10 ...
## $ date   : Factor w/ 3 levels "27-Aug-18","28-Aug-18",...: 1 1 1 1 1 1 1 1 1 1 ...
## $ site   : int  1 1 1 1 1 1 1 1 1 1 ...
## $ town    : Factor w/ 2 levels "N","Y": 2 2 2 2 2 2 2 2 2 2 ...
## $ species: Factor w/ 3 levels "T_ceratophorum",...: 3 3 3 3 3 3 3 3 3 3 ...
## $ leaf1   : int  10 1 0 0 0 0 0 0 0 0 ...
## $ leaf2   : int  0 0 0 0 3 0 0 0 0 0 ...
## $ leaf3   : int  2 1 0 0 20 0 0 0 0 0 ...
```

### Description:

- 180 rows of data
- columns:
  1. “plant” = plant ID (1 to 180)
  2. “date” = date of data collection
  3. “site” = site of data collection (1-5)
  4. “town” = binary Y/N of whether plants were found in Churchill townsite
  5. “species” = three *Taraxacum* species (*T. officinale* is invasive, *T. lacerum* and *T. ceratophorum* are native)
  6. “leaf1”, “leaf2”, “leaf3” = measures of herbivory of 3 oldest leaves (i.e., largest, closest to ground)



## Species-Level Differences of Herbivory

### Number of individuals per site

```
## # A tibble: 9 x 4
## # Groups:   site, town [5]
##   site town species      n
##   <int> <fct> <fct>      <int>
## 1     1 Y    T_lacerum      20
## 2     1 Y    T_officinale    20
## 3     2 Y    T_ceratophorum  20
## 4     2 Y    T_lacerum      20
## 5     2 Y    T_officinale    20
## 6     3 Y    T_lacerum      20
## 7     3 Y    T_officinale    20
## 8     4 N    T_lacerum      20
## 9     5 N    T_lacerum      20
```

Notes:

- sites 1-3 were in town, sites 4-5 were not in town
- data for all three species were only collected in site 2
  - only data for *T. ceratophorum* in site 2
- sites 1 and 3 have data for only *T. lacerum* and *T. officinale*
- sites 4 and 5 (i.e., out of town sites) have data only for *T. lacerum*

### Number of individuals per species

```
## # A tibble: 3 x 2
##   species      n
##   <fct>      <int>
## 1 T_ceratophorum    20
## 2 T_lacerum       100
## 3 T_officinale     60
```

N =

- *T. ceratophorum* = 20
- *T. lacerum* = 100
- *T. officinale* = 60

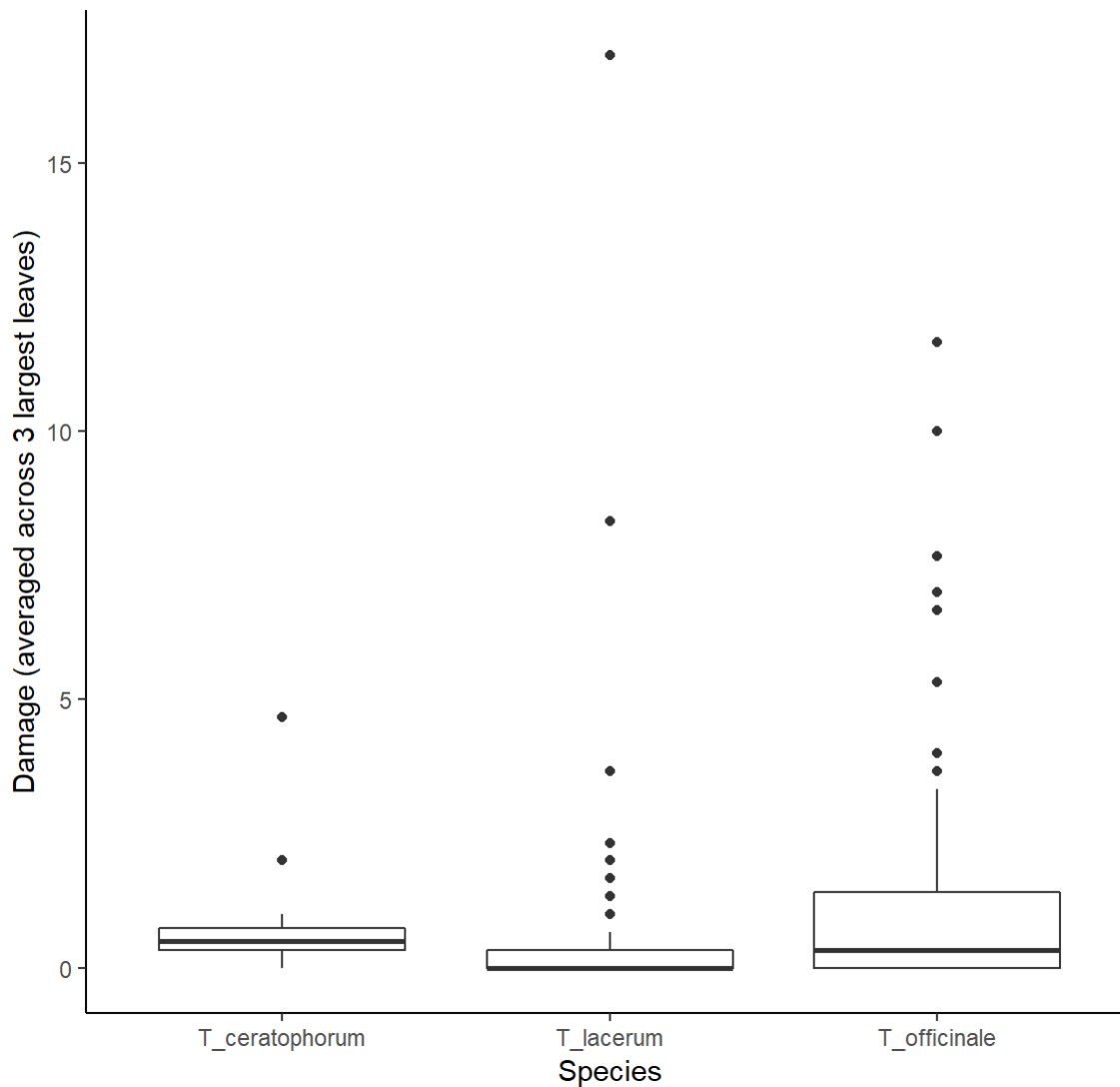
### Averaged damage of all plants in three species

```
## # A tibble: 3 x 5
##   species      leaf1 leaf2 leaf3 average
##   <fct>      <dbl> <dbl> <dbl>   <dbl>
## 1 T_ceratophorum  0.8  1.05  0.45  0.767
## 2 T_lacerum      0.24 0.79  0.71  0.580
## 3 T_officinale   0.5  0.833 3.15  1.49
```

Table:

- “leaf1”, “leaf2” and “leaf3” columns are averaged damage percentages for each leaf
- “average” is the average of columns “leaf1”, “leaf2” and “leaf3”

## Average damage across species



## Notes:

- *T. officinale* (the invasive species) has the greatest herbivory damage
- no general pattern over which leaf is most damaged by herbivory
  - dandelion leaves are in a floret near the base of the plant
  - since all the leaves are close to each other, the lack of difference makes biological sense

## Number of plants per species with no damage

```
## # A tibble: 3 x 2
##   species      n
##   <fct>    <int>
## 1 T_ceratophorum    3
## 2 T_lacerum       61
## 3 T_officinale    24
```

## Notes:

- *T. ceratophorum* = 20
  - 3 individuals with no damage
- *T. lacerum* = 100

- 61 individuals with no damage
- *T. officinale* = 60
  - 24 individuals with no damage

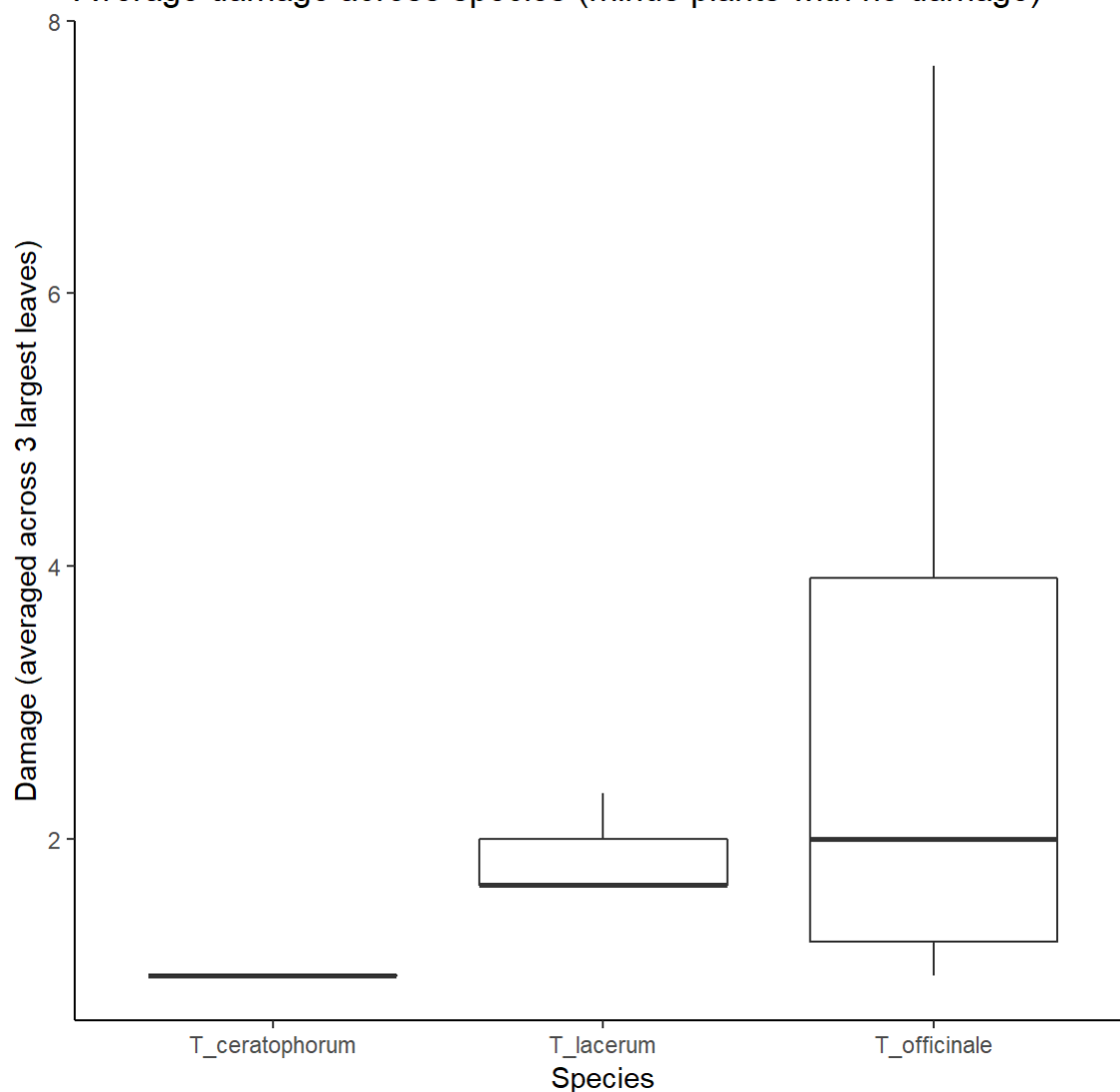
### Averaged damage of all plants minus plants with no damage

```
## # A tibble: 3 x 5
##   species      leaf1 leaf2 leaf3 average
##   <fct>      <dbl> <dbl> <dbl>   <dbl>
## 1 T_ceratophorum    1     1     1       1
## 2 T_lacerum         3   1.67     1   1.89
## 3 T_officinale      2   5.75   1.75   3.17
```

Table:

- “leaf1”, “leaf2” and “leaf3” columns are averaged damage percentages for each leaf
- “average” is the average of columns “leaf1”, “leaf2” and “leaf3”
- this only includes plants with damage (filtered out plants with no damage)

### Average damage across species (minus plants with no damage)



Notes:

- *T. officinale* (the invasive species) again has the greatest herbivory damage

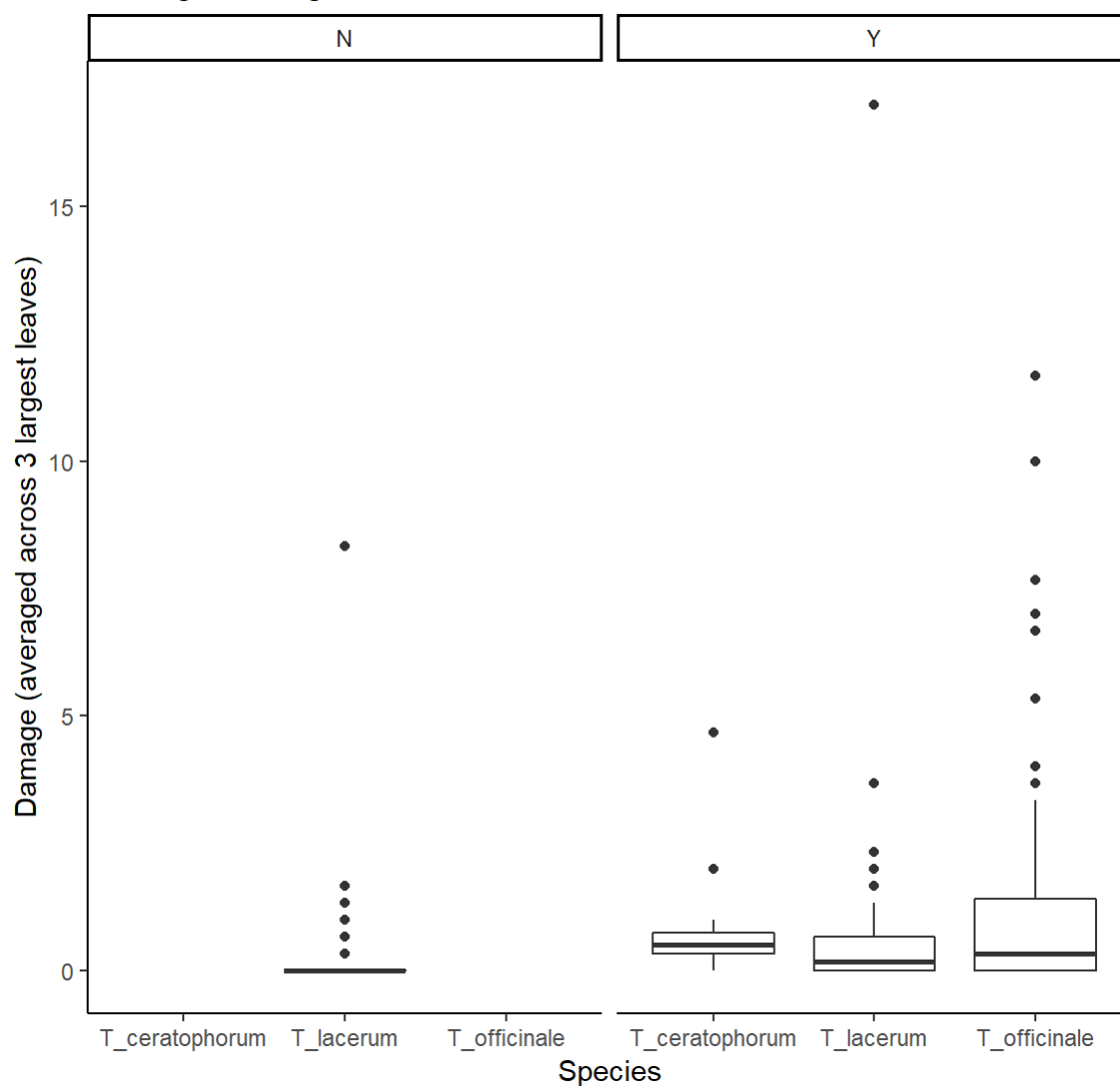
- no general pattern over which leaf is most damaged by herbivory

## Differences in Herbivory between sites

### Average damage in and out of town

```
## # A tibble: 4 x 6
## # Groups:   town [2]
##   town species      leaf1 leaf2 leaf3 average
##   <fct> <fct>      <dbl> <dbl> <dbl> <dbl>
## 1 N     T_lacerum      0.075 0.225 0.775  0.358
## 2 Y     T_ceratophorum 0.8   1.05 0.45   0.767
## 3 Y     T_lacerum      0.35  1.17 0.667  0.728
## 4 Y     T_officinale    0.5   0.833 3.15   1.49
```

### Average damage in and out of town

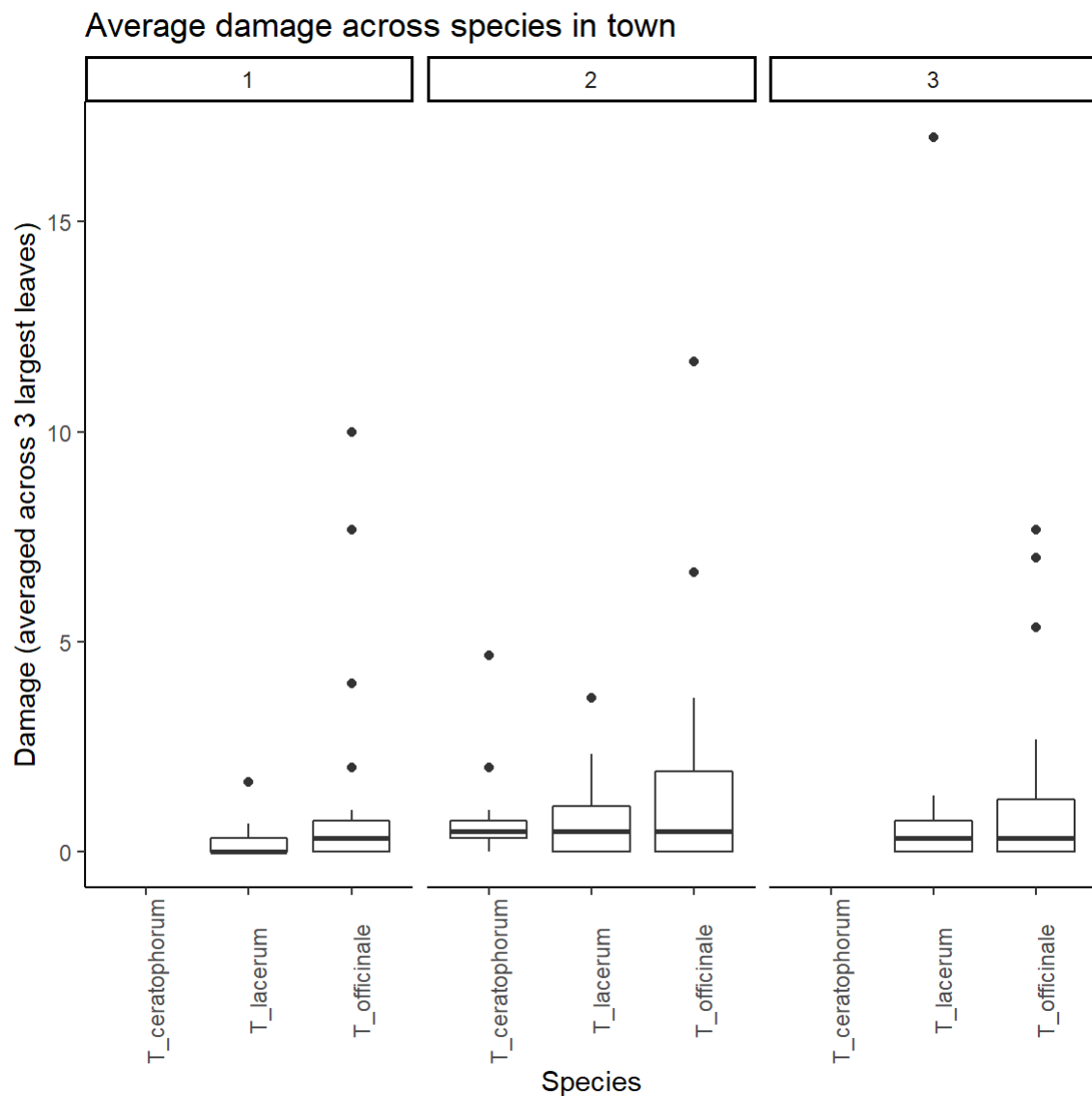


#### Notes:

- *T. lacerum* was the only species that had data both in and out of town
- more damage in town

### Average damage across species in town

```
## # A tibble: 3 x 6
## # Groups:   town [1]
##   town species      leaf1 leaf2 leaf3 average
##   <fct> <fct>      <dbl> <dbl> <dbl> <dbl>
## 1 Y     T_ceratophorum 0.8   1.05  0.45  0.767
## 2 Y     T_lacerum      0.35  1.17  0.667 0.728
## 3 Y     T_officinale   0.5   0.833 3.15   1.49
```



Notes:

- *T. officinale* (invader) had most herbivory damage
- more damage in town

## Effects of Date of Data Collection

Date of data collection across sites

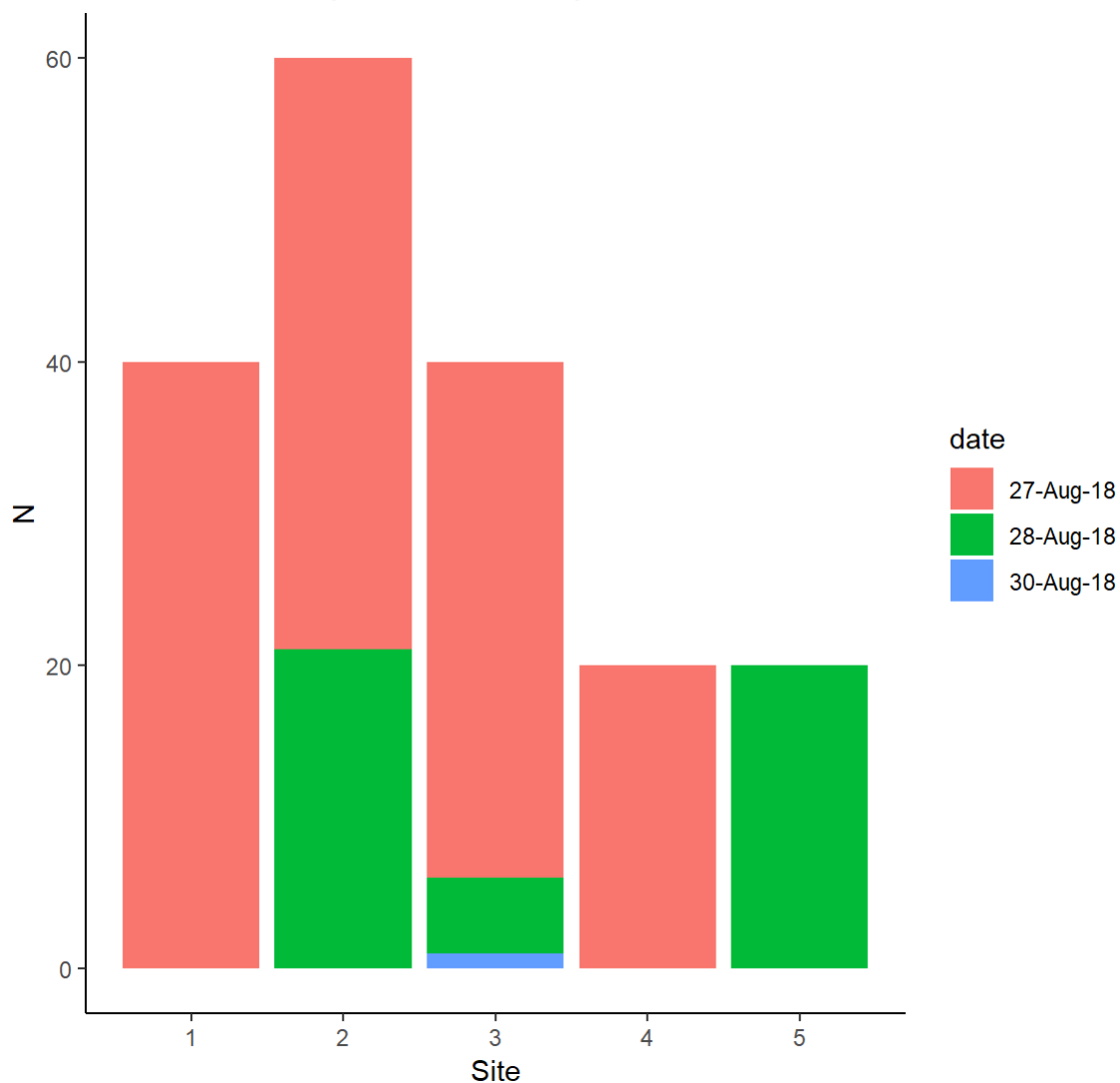


```
## # A tibble: 8 x 3
## # Groups:   date [3]
##   date      site    n
##   <fct>    <int> <int>
## 1 27-Aug-18     1    40
## 2 27-Aug-18     2    39
## 3 27-Aug-18     3    34
## 4 27-Aug-18     4    20
## 5 28-Aug-18     2    21
## 6 28-Aug-18     3     5
## 7 28-Aug-18     5    20
## 8 30-Aug-18     3     1
```

## Notes

- most of the data (N = 133) collected on August 27th
  - data collected from sites 1-4
- some data collected Aug 28 (N = 46) and Aug 30 (N = 1)
  - data collected on Aug 28th from sites 2, 3, 5
  - one data point collected Aug 30th from site 3

Number of data points collected per site across date



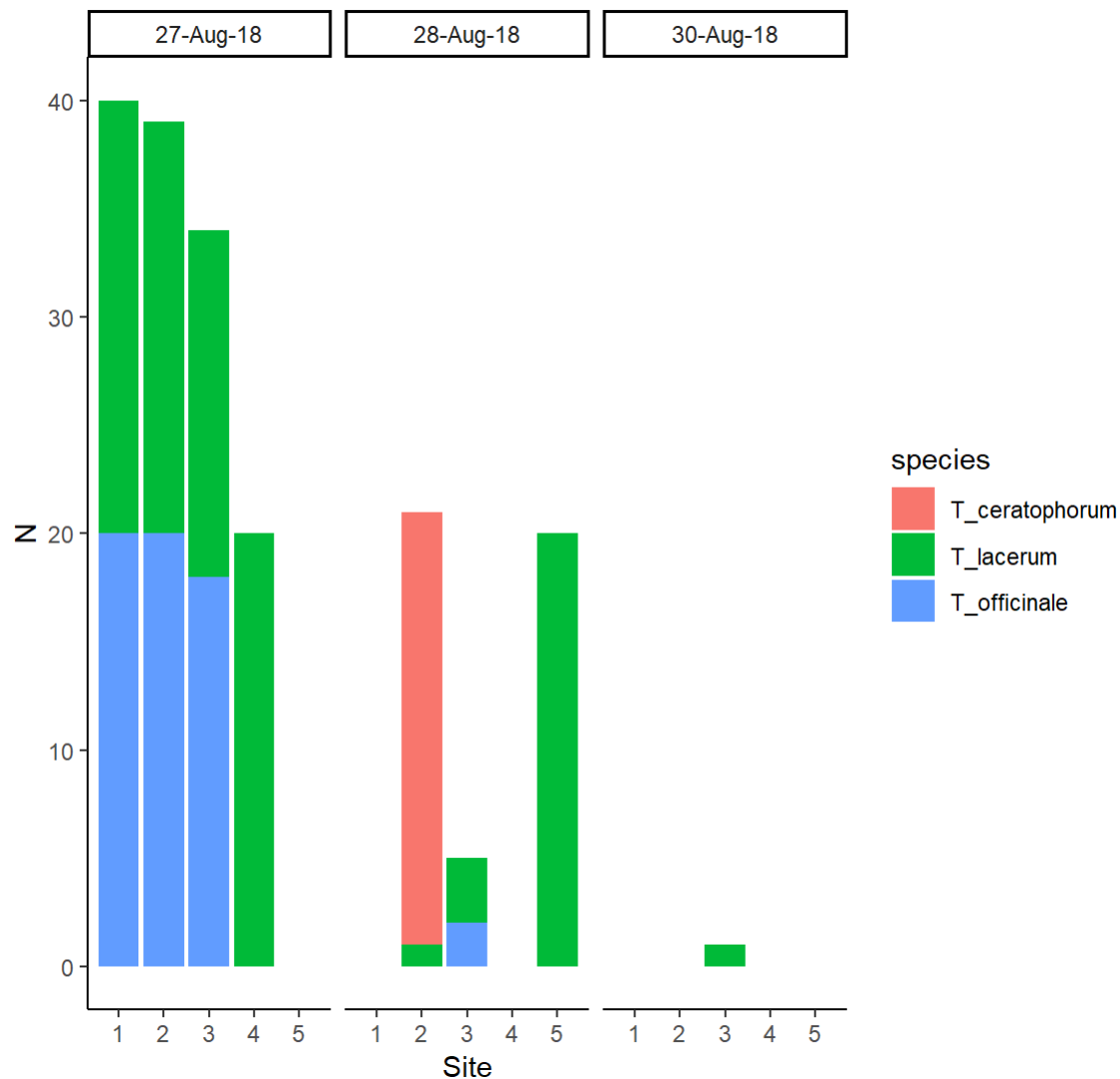
## Date of data collection across species

```
## # A tibble: 6 x 3
## # Groups:   date [3]
##   date      species      n
##   <fct>    <fct>    <int>
## 1 27-Aug-18 T_lacerum      75
## 2 27-Aug-18 T_officinale  58
## 3 28-Aug-18 T_ceratophorum 20
## 4 28-Aug-18 T_lacerum      24
## 5 28-Aug-18 T_officinale    2
## 6 30-Aug-18 T_lacerum      1
```

### Notes

- Aug 27th data (N = 133)
  - only *T. lacerum* and *T. officinale* data collected
- Aug 28th data (N = 46)
  - data from all three species collected
  - N (*T. ceratophorum*) = 20
  - N (*T. officinale*, the invader) = 2
  - N (*T. lacerum*) = 24
- Aug 29th only has one data point for *T. lacerum*

Number of species data collected per site across date



## General thoughts

1. The variables that are affecting the system here are:

- date (Aug 27, 28, 30)
- site (1-5)
- in or out of town (Y/N)

2. I am looking at herbivory differences across the three Taraxacum species

- not sure if I should use all three herbivory measures, choose one, or average the three measurements into a new measure

3. I don't have data about the specific dates of data collection (like weather conditions, temperature, etc.). I might be able to get that data and can add it to the model. It may be important, or I can just generalize these differences into the "date" variable