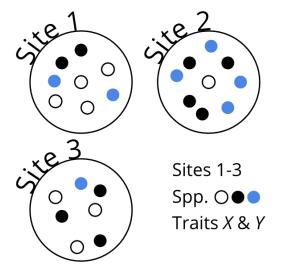
Data wrangling & manipulation in R

Dept. Biological Sciences Postgraduate Workshop

Ruan van Mazijk, MSc candidate

Motivation

Motivation



An example data-collection scenario in biology

| | | Sit | e 1 | | | | | Site | e 1 | | |
|-------|---|-----|-------------------|---|-----------|---|-----|------|-----|----|-----|
| Sp. 1 | | Sp | Sp. 2 Sp. 3 Sp. 1 | | Sp. 2 Sp. | | . 1 | Sp | . 2 | Sp | . 3 |
| Χ | Υ | Χ | Υ | Χ | Υ | Х | Υ | Χ | Υ | Х | Υ |
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One way to lay out your collected data...

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Another way...

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The "best" way. Will make your life easiest in the long-term.

– Embracing the rectangle

- Embracing the rectangle
- **Making** your data rectangular

- Embracing the rectangle
- Making your data rectangular
- Things to see & do in rectangle land

- Embracing the rectangle
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- mutate() & friends—How to extend your raw dataset

- Embracing the rectangle
- Making your data rectangular
- Things to see & do in rectangle land
- mutate() & friends—How to extend your raw dataset
- Complicated Exotic problems



Embracing the rectangle

Long vs wide data

Remember this?

| | | Sit | e 1 | | | | | Site | e 1 | | |
|----|-----|-----|-------------------------|---|-----|-------|---|------|-----|---|---|
| Sp | . 1 | Sp | Sp. 2 Sp. 3 Sp. 1 Sp. 2 | | . 2 | Sp. 3 | | | | | |
| X | Υ | X | Υ | X | Υ | X | Υ | X | Υ | X | Υ |
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Embracing the rectangle

Long vs wide data

Remember this?

| | | | Site 1 | | | | | Site | e 1 | | |
|----|-----|----|--------|----|-----|----|-----|------|-----|----|-----|
| Sp | . 1 | Sp | . 2 | Sp | . 3 | Sp | . 1 | Sp | . 2 | Sp | . 3 |
| X | Υ | Χ | Υ | Х | Υ | Χ | Υ | Χ | Υ | X | Υ |
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This is wide-form data. Let's move away from that...

Using the iris dataset built into R!

Wide-form data

Wide-form data

```
## $setosa
##
    Sepal.Length Sepal.Width Petal.Length Petal.Width
## 1
              5.1
                           3.5
                                        1.4
                                                     0.2
## 2
              4.9
                           3.0
                                        1.4
                                                     0.2
##
## $versicolor
    Sepal.Length Sepal.Width Petal.Length Petal.Width
##
## 1
              7.0
                           3.2
                                        4.7
                                                     1.4
              6.4
                           3.2
                                        4.5
                                                     1.5
## 2
##
## $virginica
    Sepal.Length Sepal.Width Petal.Length Petal.Width
##
## 1
              6.3
                           3.3
                                        6.0
                                                     2.5
              5.8
                           2.7
                                        5.1
                                                     1.9
## 2
```

Classic long-form data

Classic long-form data

| ## | Species Sep | al.Length Se | epal.Widt | h Petal.Lenք | gth Petal.W | ۷ |
|------|-------------|--------------|-----------|--------------|-------------|---|
| ## 1 | setosa | 5.1 | 3.5 | 1.4 | 0.2 | |
| ## 2 | setosa | 4.9 | 3.0 | 1.4 | 0.2 | |
| ## 3 | setosa | 4.7 | 3.2 | 1.3 | 0.2 | |
| ## 4 | versicolor | 7.0 | 3.2 | 4.7 | 1.4 | |
| ## 5 | versicolor | 6.4 | 3.2 | 4.5 | 1.5 | |
| ## 6 | versicolor | 6.9 | 3.1 | 4.9 | 1.5 | |
| ## 7 | virginica | 6.3 | 3.3 | 6.0 | 2.5 | |
| ## 8 | virginica | 5.8 | 2.7 | 5.1 | 1.9 | |
| ## 9 | virginica | 7.1 | 3.0 | 5.9 | 2.1 | |

| Site 1 | | | Site 2 | | | | |
|--------|---|---|--------|---|---|--|--|
| Sp. | Х | Υ | Sp. | Х | Υ | | |
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We can get longer...

We can get longer...

```
Species
                        trait trait value
##
## 1
          setosa Sepal.Length
                                      5.1
## 2
      versicolor Sepal.Length
                                      7.0
## 3
      virginica Sepal.Length
                                      6.3
## 4
          setosa Sepal.Width
                                      3.5
                                      3.2
## 5
      versicolor Sepal.Width
## 6
     virginica Sepal.Width
                                      3.3
          setosa Petal.Length
                                      1.4
## 7
## 8
     versicolor Petal.Length
                                      4.7
## 9
       virginica Petal.Length
                                      6.0
          setosa Petal.Width
                                      0.2
## 10
## 11 versicolor Petal.Width
                                      1.4
      virginica Petal.Width
                                      2.5
## 12
```

- Machine-readable

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- The standard for most software/R-functions (e.g. lm(), plot(), ggplot())

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- The standard for most software/R-functions (e.g. lm(), plot(), ggplot())
- How most statistical methods treat data mathematically

- Machine-readable
- The standard for most software/R-functions (e.g. lm(), plot(), ggplot())
- How most statistical methods treat data mathematically
- Easier to subset & wrangle further!

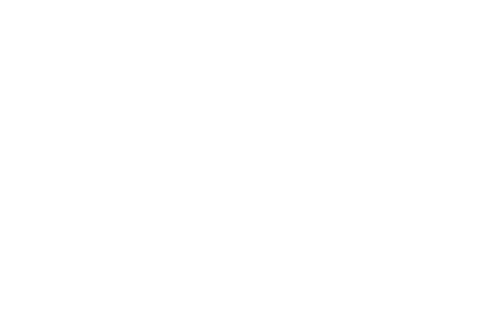
Making your data rectangular

Making your data rectangular

What are your options?

Easiest to lay it out like that from the start...

Tools to follow assume your data is nice & tidy



Things to see & do in rectangle land

mutate() & friends

How to extend your raw dataset

Complicated Exotic problems

dplyr::

```
select()
filter()
group_by()
summarise()
arrange()
join()
mutate()
```

tidyr::

```
gather()
spread()
separate()
unite()
```