Tidy data with tidyr

Day 3 - Introduction to Data Analysis with R

Selina Baldauf Freie Universität Berlin - Theoretical Ecology

March 2, 2024

What is tidy data?

What is tidy data?



TIDY DATA is a standard way of mapping the meaning of a dataset to its structure. 99

-HADLEY WICKHAM

In tidy data:

- each variable forms a column
- each observation forms a row
- each cell is a single measurement



Wickham, H. (2014). Tidy Data. Journal of Statistical Software 59 (10). DOI: 10.18637/jss.v059.i10

Illustration from the Openscapes blog Tidy Data for reproducibility, efficiency, and collaboration by Julia Lowndes and Allison Horst

What is tidy data?

Let's look at some examples

Tidy

id	name	color	
1	floof	gray	
2	max	black	
3	cat	orange	
4	donut	gray	
5	merlin	black	
6	panda	calico	

Non-tidy

floof	max	cat	donut	merlin	panda
gray	black	orange	gray	black	calico
	gray	black	orange	calico	
	floof	max	cat	panda	
	donut	merlin			

Sometimes *raw data* is non-tidy because its structure is optimized for data entry or viewing rather than analysis.

Why tidy data?

The main advantages of **tidy** data is that the tidyverse packages are built to work with it.

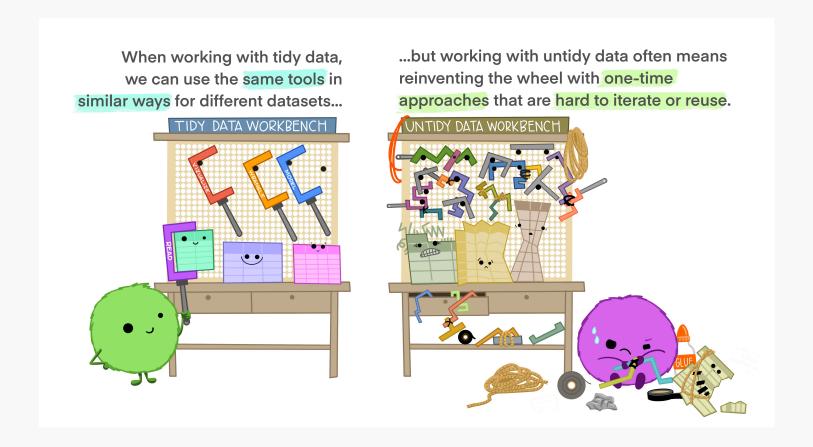


Illustration from the Openscapes blog *Tidy Data for reproducibility, efficiency, and collaboration* by Julia Lowndes and Allison Horst

Example

Let's go back to the city data set from earlier:

```
cities tbl
#> # A tibble: 10 × 4
     city
                     population area km2 country
   <chr>
                                <dbl> <chr>
#>
                          <dbl>
   1 Istanbul
                       15100000
                                   2576 Turkey
                                   2561 Russia
#>
   2 Moscow
                      1250000
#> 3 London
                      900000
                                   1572 UK
  4 Saint Petersburg 5400000
                                   1439 Russia
#>
   5 Berlin
                        3800000
                                    891 Germany
#>
   6 Madrid
                        3200000
                                     604 Spain
   7 Kyiv
                        3000000
                                    839 Ukraine
#>
   8 Rome
                        2800000
                                   1285 Italy
   9 Bucharest
                        2200000
                                    228 Romania
#> 10 Paris
                        2100000
                                    105 France
```

This already looks pretty tidy.

Same data different format

```
cities untidy
\#>\# A tibble: 2 × 11
                Turkey Istanbul Russia Moscow UK London `Russia Saint Petersburg`
     type
     <chr>
                           <dbl>
                                                    <dbl>
#> 1 population
                        15100000
                                      12500000
                                                  9000000
                                                                              5400000
#> 2 area km2
                                          2561
                            2576
                                                     1572
                                                                                 1439
     Germany Berlin Spain Madrid Ukraine Kyiv Italy Rome Romania Bucharest
              <dbl>
                            <dbl>
                                         <dbl>
                                                     <dbl>
#>
                                                                        <dbl>
#> 1
            3800000
                          3200000
                                        3000000
                                                   2800000
                                                                      2200000
                                                                          228
                891
                              604
                                            839
                                                      1285
#> # i 1 more variable: France Paris <dbl>
```

What's not tidy here?

- Each row has multiple observation
- At the same time, each observation is split across multiple rows
- Country and city variable are split into multiple columns
- Country and city variable values are united to one value

Let's tidy this data using functions from the tidyr package!

pivot_longer()

One variable split into multiple columns can be solved with pivot_longer

```
#> # A tibble: 2 × 11
                Turkey Istanbul Russia Moscow UK London `Russia Saint Petersburg`
     type
     <chr>
                           <dbl>
                                         <dbl>
                                                    <dbl>
                                                                               <dbl>
#>
#> 1 population
                       15100000
                                      12500000
                                                  9000000
                                                                             5400000
#> 2 area km2
                            2576
                                          2561
                                                     1572
                                                                                1439
     Germany Berlin Spain Madrid Ukraine Kyiv Italy Rome Romania Bucharest
#>
                            <dbl>
                                         <dbl>
                                                     <dbl>
                                                                        <dbl>
#>
              <dbl>
                          3200000
                                       3000000
                                                   2800000
#> 1
            3800000
                                                                      2200000
#> 2
                891
                              604
                                           839
                                                      1285
                                                                          228
#> # i 1 more variable: France Paris <dbl>
```

pivot_longer()

One variable split into multiple columns can be solved with pivot_longer

pivot_longer()

One variable split into multiple columns can be solved with pivot_longer

Another way to select the columns to pivot:

separate wider delim()

Multiple variable values that are united into one can be separated using

```
separate wider delim
\#>\# A tibble: 20 \times 3
#> type location value
  <chr> <chr>
                      <dbl>
#> 1 population Turkey Istanbul 15100000
#> 2 population Russia Moscow
                          12500000
#> # i 18 more rows
step2 <- separate wider delim(</pre>
  step1,
                                   # the tibble
  location,
                                  # the column to separate
  delim = " ",
                          # the separator
  names = c("country", "city")) # names of new columns
\#>\# A tibble: 20 × 4
  type country city value
   <chr> <chr> <chr> <chr> <chr>
#> 1 population Turkey Istanbul 15100000
#> 2 population Russia Moscow
                         12500000
#> # i 18 more rows
```

The opposite function exists as well and is called unite. Check out ?unite for details.

pivot_wider()

One observation split into multiple rows can solved with pivot_wider

```
\#  # A tibble: 20 × 4
#> type country city value
#> <chr> <chr>
                  <chr> <dbl>
#> 1 population Turkey Istanbul 15100000
#> 2 population Russia Moscow
                         12500000
#> # i 18 more rows
step3 <- pivot wider(</pre>
                           # the tibble
  step2,
  values from = value) # the values
#> # A tibble: 10 × 4
                    population area km2
  country city
  <chr> <chr>
                          <dbl>
                                  <dbl>
#> 1 Turkey Istanbul
                                  2576
                       15100000
                                2561
#> 2 Russia Moscow
                       12500000
                                1572
#> 3 UK London
                        9000000
                                1439
#> 4 Russia Saint Petersburg 5400000
                 3800000
#> 5 Germany Berlin
                                891
#> # i 5 more rows
```

All steps in 1

We can also use a pipe to do all these steps in one:

```
cities tidy <- cities untidy |>
 pivot longer(
    Turkey Istanbul: France Paris,
    names to = "location",
   values to = "values"
  ) |>
  separate wider delim(
    location,
   delim = "_",
    names = c("country", "city")
  ) |>
 pivot wider (
    names_from = type,
   values from = values
```

Now you

Task (30 min)

Tidy data with tidyr

Find the task description here