Data I/O

The R Bootcamp
www.therbootcamp.com
@therbootcamp

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Data Input/Output

Raw data can come in many shapes and sizes, but R's got you covered.

Package	Description
readr	.csv, .txt, etc.
haven	.sav, .sas7bdat, .dta
readxl	.xls, .xlsx
R.matlab	.mat
jsonlite	.json
rvest	.html
XML, xml2	.xml



Raw (structured) Data

delim-separated data

id, sex, age, height, weight, income, education, confession, childre 1,male,44,174.3,113.4,6300,SEK_III,catholic,2,5,7,610,40,6,4 2, male, 65, 180.3, 75.2, 10900, obligatory_school, confessionless, 3, female, 31, 168.3, 55.5, 5100, SEK_III, NA, 2, 7, 6, 720, 14, 3, 6, 102, 4, male, 27, 209, 93.8, 4200, SEK_III, catholic, 2, 7, 8, 680, 39, 6, 0, 11 5, male, 24, 176.7, NA, 4e3, SEK_III, catholic, 1, 5, 4, 260, 19, 0, 1, 82, 6, male, 63, 186.6, 67.4, 11400, SEK_III, evangelical-reformed, 0, 7, 7, male, 71, 151.6, 83.3, 12e3, SEK_III, evangelical-reformed, 2, 8, 5 8, female, 41, 155.7, 67.8, 7600, SEK_III, confessionless, 1, 7, 2, 135 9, male, 43, 176.1, 69.3, 8500, apprenticeship, catholic, 2, 7, 5, 150, 10, female, 31, 166.1, 66.3, 6100, SEK_II, catholic, 1, 6, 7, 700, 0, 0, 3 11, female, 42, 157.8, 51.9, 8e3, obligatory school, catholic, 2, 9, 7 12, male, 31, 165.9, 66, 5900, apprenticeship, evangelical-reformed 13, female, 38, 162.5, 73.4, 6200, apprenticeship, confessionless, 2 14, female, 49, 182.8, 46.9, NA, SEK_III, evangelical-reformed, 1, 6, 15, female, 39, 160, NA, 5600, SEK_III, other, 2, 7, 4, 540, 35, 7, 4, 122, 16, female, 54, 139.7, 50.3, 10900, SEK_III, evangelical-reformed, 3 17, female, 78, 153.1,64.1,11e3, SEK_III, confessionless, 2, 7, 2, 97 18, female, 62, 174.6, 63.8, 11500, SEK III, confessionless, 2, 9, 7, 1 19, male, 88, 191.4, 99.8, 14200, SEK_III, confessionless, 2, 7, 3, 121 20, male, 74, 183.8, 78.1, 12100, apprenticeship, catholic, 2, 5, 7, 11

markup data

```
<!doctype html>
<html lang="en" class="gr__therbootcamp_github_io">
▶ <head>...</head>
▼<body data-gr-c-s-loaded="true">
    <script async src="https://www.google-analytics.com/analytics.</pre>
   <script type="text/javascript" async src="https://snap.licdn.u</pre>
   insight.min.js"></script>
   <script type="text/javascript">
          _linkedin_data_partner_id = "111419";
        </script>
  ▶ <script type="text/javascript">...</script>
  ▼<div id="particles-js">
    ▼<div class="content">
      ▼<h1>
         <span class="site-title">TheRBootcamp</span>
         <span class="site-description">Learn Data Science in R
       ▼<a class="link" href="#upcoming" data-scroll>
           <font size="6" color="#FF3A2A">Basel July 21 22 28 29
         </a>
       </h1>
```

Delim-separated data

- 1 Most typical file format.
- 2 Requires **delimiter** to separate entries.



delim-separated data

id, sex, age, height, weight, income, education, confession, childre 1, male, 44, 174.3, 113.4, 6300, SEK_III, catholic, 2, 5, 7, 610, 40, 6, 4 2, male, 65, 180.3, 75.2, 10900, obligatory_school, confessionless, 3, female, 31, 168.3, 55.5, 5100, SEK_III, NA, 2, 7, 6, 720, 14, 3, 6, 102, 4, male, 27, 209, 93.8, 4200, SEK_III, catholic, 2, 7, 8, 680, 39, 6, 0, 11 5, male, 24, 176.7, NA, 4e3, SEK_III, catholic, 1, 5, 4, 260, 19, 0, 1, 82, 6, male, 63, 186.6, 67.4, 11400, SEK_III, evangelical-reformed, 0, 7, 7, male, 71, 151.6, 83.3, 12e3, SEK_III, evangelical-reformed, 2, 8, 5 8, female, 41, 155.7, 67.8, 7600, SEK_III, confessionless, 1, 7, 2, 135 9, male, 43, 176.1, 69.3, 8500, apprenticeship, catholic, 2, 7, 5, 150, 10, female, 31, 166.1, 66.3, 6100, SEK_II, catholic, 1, 6, 7, 700, 0, 0, 3 11, female, 42, 157.8, 51.9, 8e3, obligatory_school, catholic, 2, 9, 7 12, male, 31, 165.9, 66, 5900, apprenticeship, evangelical-reformed 13, female, 38, 162.5, 73.4, 6200, apprenticeship, confessionless, 2 14, female, 49, 182.8, 46.9, NA, SEK_III, evangelical-reformed, 1, 6, 15, female, 39, 160, NA, 5600, SEK_III, other, 2, 7, 4, 540, 35, 7, 4, 122, 16, female, 54, 139.7, 50.3, 10900, SEK_III, evangelical-reformed, 3 17, female, 78, 153.1, 64.1, 11e3, SEK_III, confessionless, 2, 7, 2, 97 18, female, 62, 174.6, 63.8, 11500, SEK_III, confessionless, 2, 9, 7, 1 19, male, 88, 191.4, 99.8, 14200, SEK_III, confessionless, 2, 7, 3, 121 20, male, 74, 183.8, 78.1, 12100, apprenticeship, catholic, 2, 5, 7, 11

readr

readr is a tidyverse package that provides convenient functions to **read in** (non-nested) data files into data frames (tibbles to be precise):



```
# Importing data from a file

data <- read_csv(file, ...) # comma-delimited
data <- read_csv2(file, ...) # semicolon-delimeted
data <- read_delim(file, ...) # arbitrary-delimited

# Writing a data frame to a file

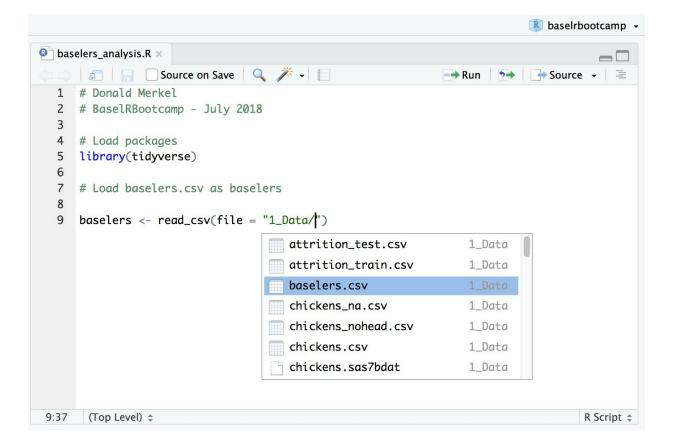
write_csv(data_object, file, ...) # comma-delimited
write_delim(data_object, file, ...) # arbitrary-delimited</pre>
```

Finding the file path

- 1 Identify the file path using the **auto-complete**.
- 2 Initiate auto-complete and browse through the folder structure by placing the cursor between two quotation marks and using the tab key.



3 - Auto-complete begins with the project folder - place your data inside your project folder!



Identifying the delimiter

- 1 Find the file on your hard drive. Should be in your data folder inside your project.
- 2 Open the file in RStudio (right-click on the file in the pane) a text viewer, e.g., (Mac), (Windows).



baselers.csv

id, sex, age, height, weight, income, education, confession, childre 1, male, 44, 174.3, 113.4, 6300, SEK_III, catholic, 2, 5, 7, 610, 40, 6, 4 2, male, 65, 180.3, 75.2, 10900, obligatory_school, confessionless, 3, female, 31, 168.3, 55.5, 5100, SEK_III, NA, 2, 7, 6, 720, 14, 3, 6, 102, 4, male, 27, 209, 93.8, 4200, SEK_III, catholic, 2, 7, 8, 680, 39, 6, 0, 11 5, male, 24, 176.7, NA, 4e3, SEK_III, catholic, 1, 5, 4, 260, 19, 0, 1, 82, 6, male, 63, 186.6, 67.4, 11400, SEK_III, evangelical-reformed, 0, 7, 7, male, 71, 151.6, 83.3, 12e3, SEK_III, evangelical-reformed, 2, 8, 5 8, female, 41, 155.7, 67.8, 7600, SEK_III, confessionless, 1, 7, 2, 135 9, male, 43, 176.1, 69.3, 8500, apprenticeship, catholic, 2, 7, 5, 150, 10, female, 31, 166.1, 66.3, 6100, SEK_II, catholic, 1, 6, 7, 700, 0, 0, 3 11, female, 42, 157.8, 51.9, 8e3, obligatory school, catholic, 2, 9, 7 12, male, 31, 165.9, 66, 5900, apprenticeship, evangelical-reformed 13, female, 38, 162.5, 73.4, 6200, apprenticeship, confessionless, 2 14, female, 49, 182.8, 46.9, NA, SEK_III, evangelical-reformed, 1, 6, 15, female, 39, 160, NA, 5600, SEK_III, other, 2, 7, 4, 540, 35, 7, 4, 122, 16, female, 54, 139.7, 50.3, 10900, SEK III, evangelical-reformed, 3 17, female, 78, 153.1,64.1,11e3, SEK_III, confessionless, 2, 7, 2, 97 18, female, 62, 174.6, 63.8, 11500, SEK III, confessionless, 2, 9, 7, 1 19, male, 88, 191.4, 99.8, 14200, SEK_III, confessionless, 2, 7, 3, 121 20, male, 74, 183.8, 78.1, 12100, apprenticeship, catholic, 2, 5, 7, 11

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Handling headers

- 1 readr- functions typically expect the **column names** in the first line.
- 2 If no column names are available, use the col_namesargument to provide them.

baselers.csv

id, sex, age, height, weight, income, education, confession, childre 1, male, 44, 174.3, 113.4, 6300, SEK_III, catholic, 2, 5, 7, 610, 40, 6, 4 2, male, 65, 180.3, 75.2, 10900, obligatory_school, confessionless, 3, female, 31, 168.3, 55.5, 5100, SEK_III, NA, 2, 7, 6, 720, 14, 3, 6, 102, 4, male, 27, 209, 93.8, 4200, SEK_III, catholic, 2, 7, 8, 680, 39, 6, 0, 11 5, male, 24, 176.7, NA, 4e3, SEK_III, catholic, 1, 5, 4, 260, 19, 0, 1, 82, 6, male, 63, 186.6, 67.4, 11400, SEK_III, evangelical-reformed, 0, 7, 7, male, 71, 151.6, 83.3, 12e3, SEK_III, evangelical-reformed, 2, 8, 5 8, female, 41, 155.7, 67.8, 7600, SEK_III, confessionless, 1, 7, 2, 135 9, male, 43, 176.1, 69.3, 8500, apprenticeship, catholic, 2, 7, 5, 150, 10, female, 31, 166.1, 66.3, 6100, SEK_II, catholic, 1, 6, 7, 700, 0, 0, 3 11, female, 42, 157.8, 51.9, 8e3, obligatory school, catholic, 2, 9, 7 12, male, 31, 165.9, 66, 5900, apprenticeship, evangelical-reformed 13, female, 38, 162.5, 73.4, 6200, apprenticeship, confessionless, 2 14, female, 49, 182.8, 46.9, NA, SEK_III, evangelical-reformed, 1, 6, 15, female, 39, 160, NA, 5600, SEK_III, other, 2, 7, 4, 540, 35, 7, 4, 122, 16, female, 54, 139.7, 50.3, 10900, SEK_III, evangelical-reformed, 3 17, female, 78, 153.1,64.1,11e3, SEK_III, confessionless, 2, 7, 2, 97 18, female, 62, 174.6, 63.8, 11500, SEK_III, confessionless, 2, 9, 7, 1 19, male, 88, 191.4, 99.8, 14200, SEK_III, confessionless, 2, 7, 3, 121 20, male, 74, 183.8, 78.1, 12100, apprenticeship, catholic, 2, 5, 7, 11

Handling data types

Reading in data, readr infers the type of data for each column.

```
# Read baselers
read_csv(file = "1_Data/baselers.csv")
## Parsed with column specification:
## cols(
     .default = col_integer(),
     sex = col_character(),
    height = col_double(),
    weight = col_double(),
    income = col_double(),
     education = col_character(),
     confession = col_character(),
     food = col_double(),
     fasnacht = col_character(),
     eyecor = col_character()
## )
## See spec(...) for full column specifications.
```

baselers.csv

id, sex, age, height, weight, income, education, confession, childre 1, male, 44, 174.3, 113.4, 6300, SEK_III, catholic, 2, 5, 7, 610, 40, 6, 4 2, male, 65, 180.3, 75.2, 10900, obligatory_school, confessionless, 3, female, 31, 168.3, 55.5, 5100, SEK_III, NA, 2, 7, 6, 720, 14, 3, 6, 102, 4, male, 27, 209, 93.8, 4200, SEK_III, catholic, 2, 7, 8, 680, 39, 6, 0, 11 5, male, 24, 176.7, NA, 4e3, SEK_III, catholic, 1, 5, 4, 260, 19, 0, 1, 82, 6, male, 63, 186.6, 67.4, 11400, SEK_III, evangelical-reformed, 0, 7, 7, male, 71, 151.6, 83.3, 12e3, SEK_III, evangelical-reformed, 2, 8, 5 8, female, 41, 155.7, 67.8, 7600, SEK_III, confessionless, 1, 7, 2, 135 9, male, 43, 176.1, 69.3, 8500, apprenticeship, catholic, 2, 7, 5, 150, 10, female, 31, 166.1, 66.3, 6100, SEK_II, catholic, 1, 6, 7, 700, 0, 0, 3 11, female, 42, 157.8, 51.9, 8e3, obligatory_school, catholic, 2, 9, 7 12, male, 31, 165.9, 66, 5900, apprenticeship, evangelical-reformed 13, female, 38, 162.5, 73.4, 6200, apprenticeship, confessionless, 2 14, female, 49, 182.8, 46.9, NA, SEK_III, evangelical-reformed, 1, 6, 15, female, 39, 160, NA, 5600, SEK_III, other, 2, 7, 4, 540, 35, 7, 4, 122, 16, female, 54, 139.7, 50.3, 10900, SEK III, evangelical-reformed, 3 17, female, 78, 153.1,64.1,11e3, SEK_III, confessionless, 2, 7, 2, 97 18, female, 62, 174.6, 63.8, 11500, SEK III, confessionless, 2, 9, 7, 1 19, male, 88, 191.4, 99.8, 14200, SEK_III, confessionless, 2, 7, 3, 121 20, male, 74, 183.8, 78.1, 12100, apprenticeship, catholic, 2, 5, 7, 11

Handling data types

Incorrect data types can be fixed. Typically this involves:

- 1 **removing character elements** from otherwise numeric variables.
- 2 Setting **explicit** NA **strings** using the na-argument.
- 3 Re-running type_convert.

`baselers.csv`

id, sex, age, height, weight, income, education, confession, childre 1, male, 44, 174.3, 113.4, 6300, SEK_III, catholic, 2, 5, 7, 610, 40, 6, 4 2, male, 65, 180.3, 75.2, 10900, obligatory_school, confessionless, 3, female, 31, 168.3, 55.5, 5100, SEK_III, NA, 2, 7, 6, 720, 14, 3, 6, 102, 4, male, 27, 209, 93.8, 4200, SEK_III, catholic, 2, 7, 8, 680, 39, 6, 0, 11 5, male, 24, 176.7, NA, 4e3, SEK_III, catholic, 1, 5, 4, 260, 19, 0, 1, 82, 6, male, 63, 186.6, 67.4, 11400, SEK_III, evangelical-reformed, 0, 7, 7, male, 71, 151.6, 83.3, 12e3, SEK_III, evangelical-reformed, 2, 8, 5 8, female, 41, 155.7, 67.8, 7600, SEK_III, confessionless, 1, 7, 2, 135 9, male, 43, 176.1, 69.3, 8500, apprenticeship, catholic, 2, 7, 5, 150, 10, female, 31, 166.1, 66.3, 6100, SEK_II, catholic, 1, 6, 7, 700, 0, 0, 3 11, female, 42, 157.8, 51.9, 8e3, obligatory school, catholic, 2, 9, 7 12, male, 31, 165.9, 66, 5900, apprenticeship, evangelical-reformed 13, female, 38, 162.5, 73.4, 6200, apprenticeship, confessionless, 2 14, female, 49, 182.8, 46.9, NA, SEK_III, evangelical-reformed, 1, 6, 15, female, 39, 160, NA, 5600, SEK_III, other, 2, 7, 4, 540, 35, 7, 4, 122, 16, female, 54, 139.7, 50.3, 10900, SEK_III, evangelical-reformed, 3 17, female, 78, 153.1,64.1,11e3, SEK_III, confessionless, 2, 7, 2, 97 18, female, 62, 174.6, 63.8, 11500, SEK_III, confessionless, 2, 9, 7, 1 19, male, 88, 191.4, 99.8, 14200, SEK_III, confessionless, 2, 7, 3, 121 20, male, 74, 183.8, 78.1, 12100, apprenticeship, catholic, 2, 5, 7, 11

Other data

R provides read and write functions for practically all data file formats. See rio.

readr



```
# read fixed width files (can be fast)
data <- read_fwf(file, ...)
# read Apache style log files
data <- read_log(file, ...)</pre>
```

haven



```
# read SAS's .sas7bat and sas7bcat files
data <- read_sas(file, ...)

# read SPSS's .sav files
data <- read_sav(file, ...)

# etc</pre>
```

readxl



```
# read Excel's .xls and xlsx files
data <- read_excel(file, ...)</pre>
```

Other

```
# Read Matlab .mat files
data <- R.matlab::readMat(file, ...)

# Read and wrangle .xml and .html
data <- XML::xmlParseParse(file, ...)

# from package jsonlite: read .json files
data <- jsonlite::read_json(file, ...)</pre>
```

Websites

R provides **read and write functions** for practically all data file formats. See **rio**.

```
# load package
library(rvest)
library(xml2)

# get html page (abbreviated)
url <- '.../R_(programming_language)'
page <- read_html(u)

# get xpath (abbreviated)
xpath <- '.../div/table[2]'

# get table using XPath
table <- page %>%
  html_node(
    xpath = xpath) %>%
  html_table()
```

```
## # A tibble: 15 x 3
     Release Date
                        Description
      <chr>
              <chr>
                         <chr>>
                        This is the last alpha version
## 1 0.16
## 2 0.49
             1997-04-23 This is the oldest source rele
## 3 0.60
             1997-12-05 "R becomes an official part of "
## 4 0.65.1 1999-10-07 First versions of update.packa
##
   5 1.0
              2000-02-29 Considered by its developers s
              2001-12-19 "S4 methods are introduced and "
##
   6 1.4
## 7 2.0
              2004-10-04 Introduced lazy loading, which
## 8 2.1
             2005-04-18 Support for UTF-8 encoding, an
## 9 2.11
              2010-04-22 Support for Windows 64 bit sys
## 10 2.13
              2011-04-14 Adding a new compiler function
## 11 2.14
              2011-10-31 Added mandatory namespaces for
## 12 2.15
              2012-03-30 "New load balancing functions."
## 13 3.0
              2013-04-03 Support for numeric index valu
## 14 3.4
              2017-04-21 Just-in-time compilation (JIT)
## 15 3.5
              2018-04-23 Packages byte-compiled on inst
```

Remote databases

R provides all necessary tools to pull data from or directly work with remote databases such as, e.g., a SQL database. Find out more at:

db.rstudio.com

R's data formats

R's own formats provide the possibility to store data as R objects as well as substantial compression.

.RData

- 1 Bundles several R objects.
- 2 Loads objects directly into workspace.

```
# save data as .RData
save(baselers, zuerichers, ...,
    file = "my_data.RData")

# load data from .RData
load("my_data.RData")
```

.RDS

- 1 Stores single R objects.
- 2 Import is **assigned to object**.

Practical

Link to practical