

# Practical Approaches to Bioanalysis in R

## Day 1 – Intro to R and the Tidyverse Ecosystem

\*Many of these slides have been contributed by or modified from  
slides contributed by Dr. Claus Wilke

# R: The premier data analysis and visualization platform

<https://cran.r-project.org/>



## The Comprehensive R Archive Network

### Download and Install R

Precompiled binary distributions of the base system and contributed packages, **Windows and Mac** users most likely want one of these versions of R:

- [Download R for Linux](#)
- [Download R for \(Mac\) OS X](#)
- [Download R for Windows](#)

R is part of many Linux distributions, you should check with your Linux package management system in addition to the link above.

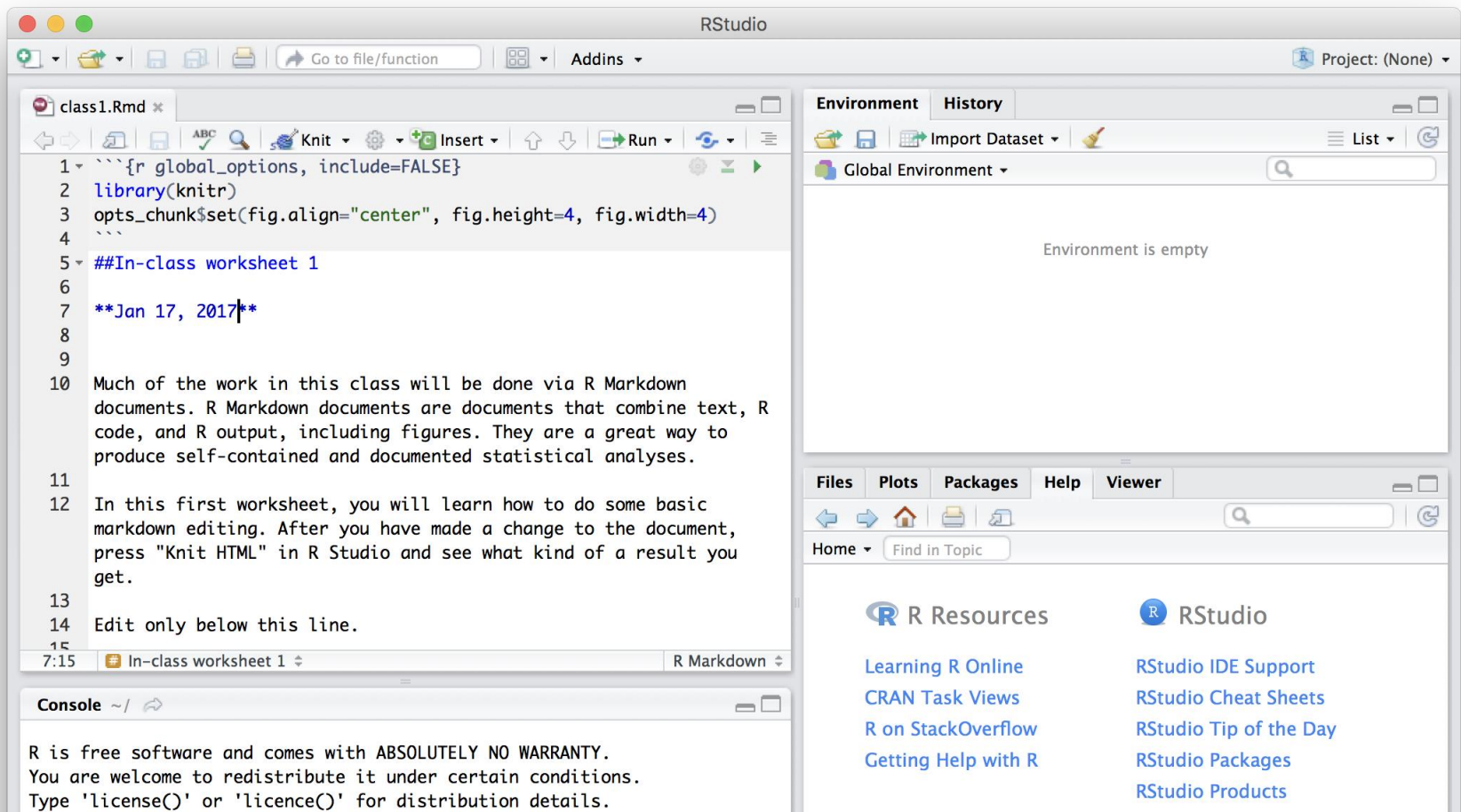
### Source Code for all Platforms

Windows and Mac users most likely want to download the precompiled binaries listed in the upper

# R Studio:

## A nice user interface for R

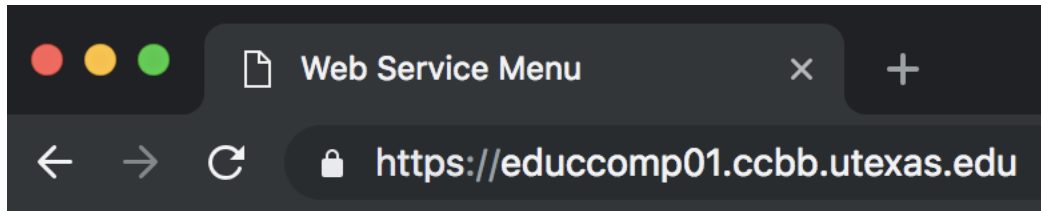
<https://www.rstudio.com/products/rstudio/download/>



# Access R Studio through your web browser

1. <https://gsafcomp01.ccb.b.utexas.edu/>
2. <https://gsafcomp02.ccb.b.utexas.edu/>

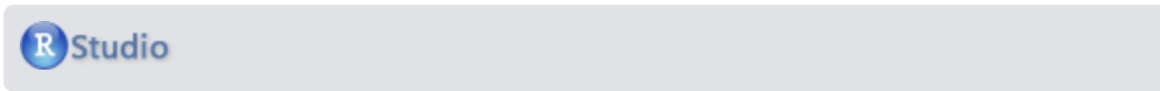
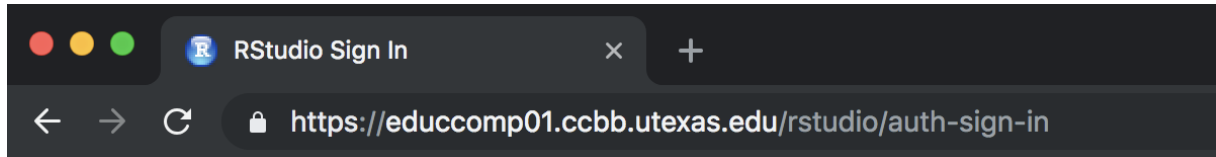
# Select RStudio



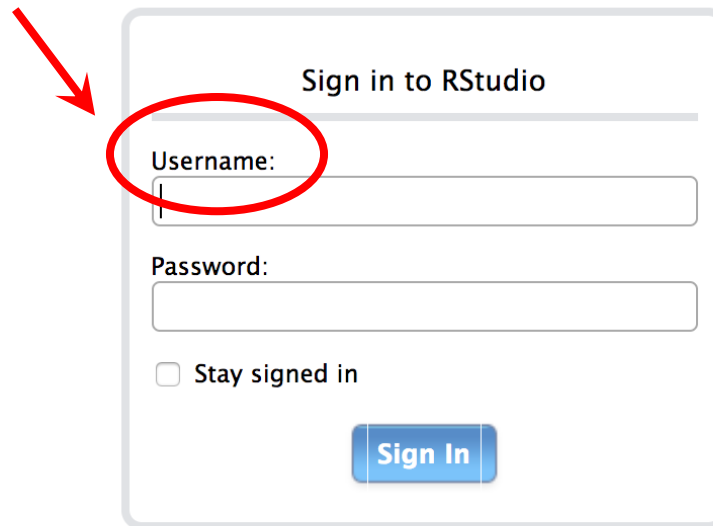
Please choose one of the following applications:

- [RStudio](#) ←
- [Jupyterhub](#)

# Sign in with your student# and password

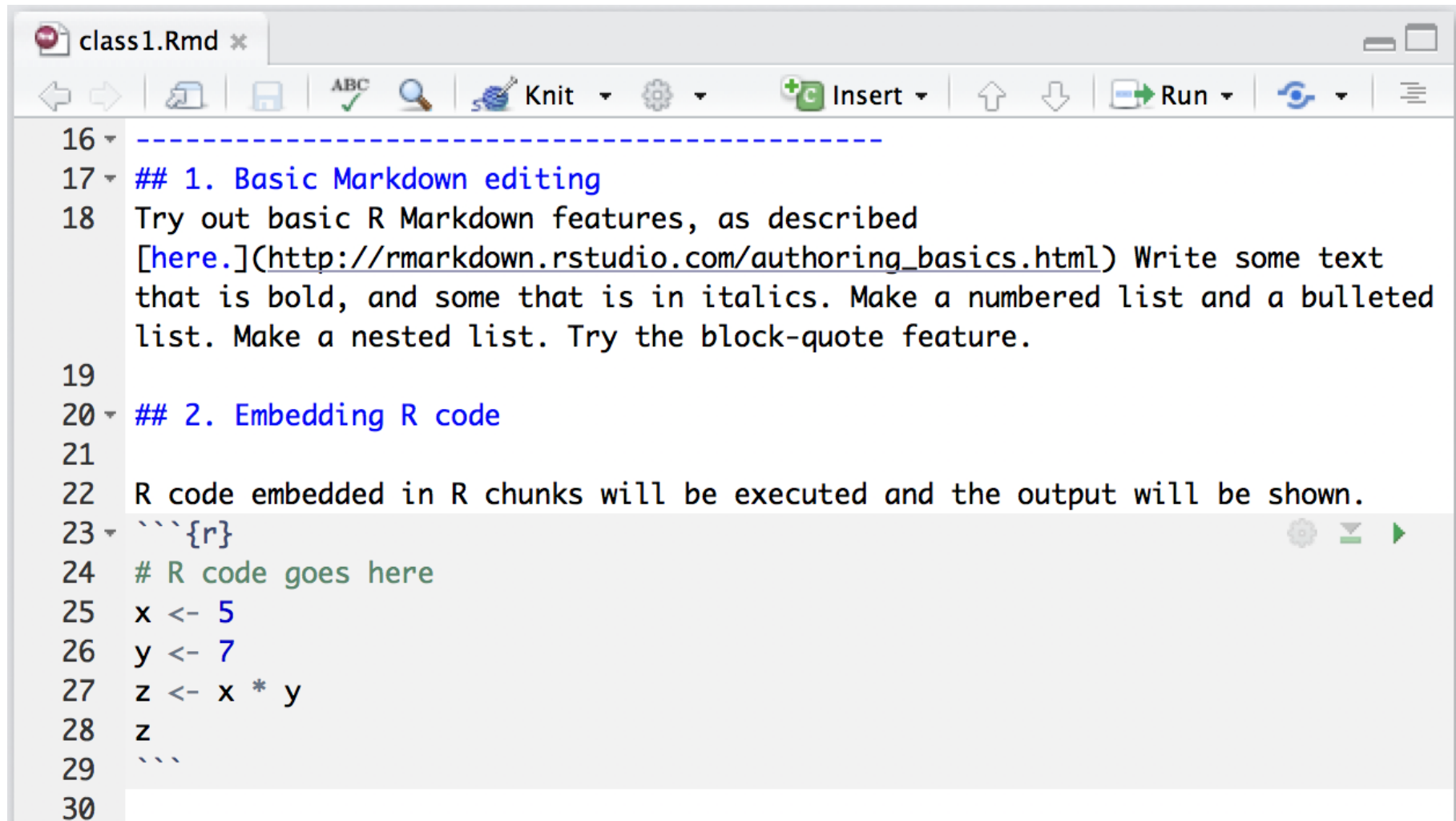


Refer to class email for your individual username

A screenshot of the 'Sign in to RStudio' form. The form is titled 'Sign in to RStudio'. It has two input fields: 'Username:' and 'Password:'. The 'Username:' field is circled in red, and a red arrow points to it from the text above. Below the input fields is a checkbox labeled 'Stay signed in'. At the bottom of the form is a blue button labeled 'Sign In'.

# R Markdown

# R Markdown: Writing documents with embedded R code



The screenshot shows the RStudio editor interface. The title bar indicates the file is 'class1.Rmd'. The toolbar includes icons for navigation, saving, knitting, and running. The editor content is as follows:

```
16 -----
17 ## 1. Basic Markdown editing
18 Try out basic R Markdown features, as described
   [here.](http://rmarkdown.rstudio.com/authoring_basics.html) Write some text
   that is bold, and some that is in italics. Make a numbered list and a bulleted
   list. Make a nested list. Try the block-quote feature.
19
20 ## 2. Embedding R code
21
22 R code embedded in R chunks will be executed and the output will be shown.
23 ```{r}
24 # R code goes here
25 x <- 5
26 y <- 7
27 z <- x * y
28 z
29 ```
30
```



# R Markdown:

## Writing documents with embedded R code

### 1. Basic Markdown editing

Try out basic R Markdown features, as described [here](#). Write some text that is bold, and some that is in italics. Make a numbered list and a bulleted list. Make a nested list. Try the block-quote feature.

### 2. Embedding R code

R code embedded in R chunks will be executed and the output will be shown.

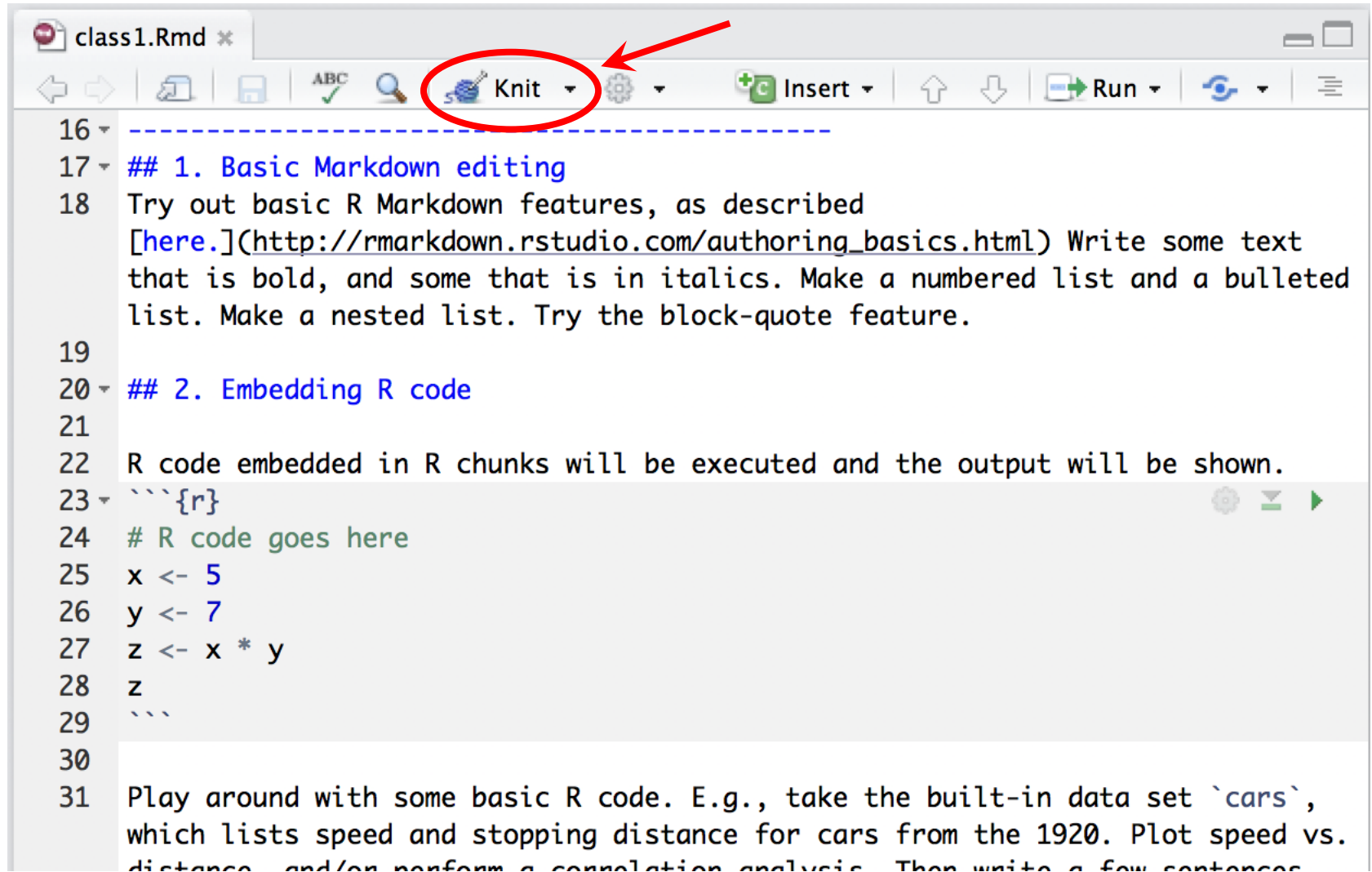
```
# R code goes here
```

```
x <- 5  
y <- 7  
z <- x * y  
z
```

```
## [1] 35
```

Play around with some basic R code. E.g., take the built-in data set `cars`, which lists speed and stopping distance for cars from the 1920. Plot speed vs. distance, and/or perform a correlation analysis. Then write a few sentences describing what you see.

# We convert R Markdown to HTML by “knitting” the Markdown file



# Markdown basics

[http://rmarkdown.rstudio.com/authoring\\_basics.html](http://rmarkdown.rstudio.com/authoring_basics.html)

normal text

*\*italics\**

**\*\*bold\*\***

# Header 1

## Header 2

List:

1. Item 1
2. Item 2
3. Item 3



normal text

*italics*

**bold**

# Header 1

## Header 2

List:

1. Item 1
2. Item 2
3. Item 3

# Markdown basics

Embedded R code will be evaluated and printed

```
```{r}  
head(cars)  
plot(cars$speed, cars$dist)  
```
```

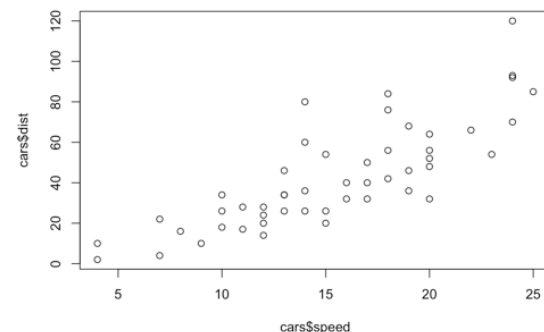


Embedded R code will be evaluated and printed

```
head(cars)
```

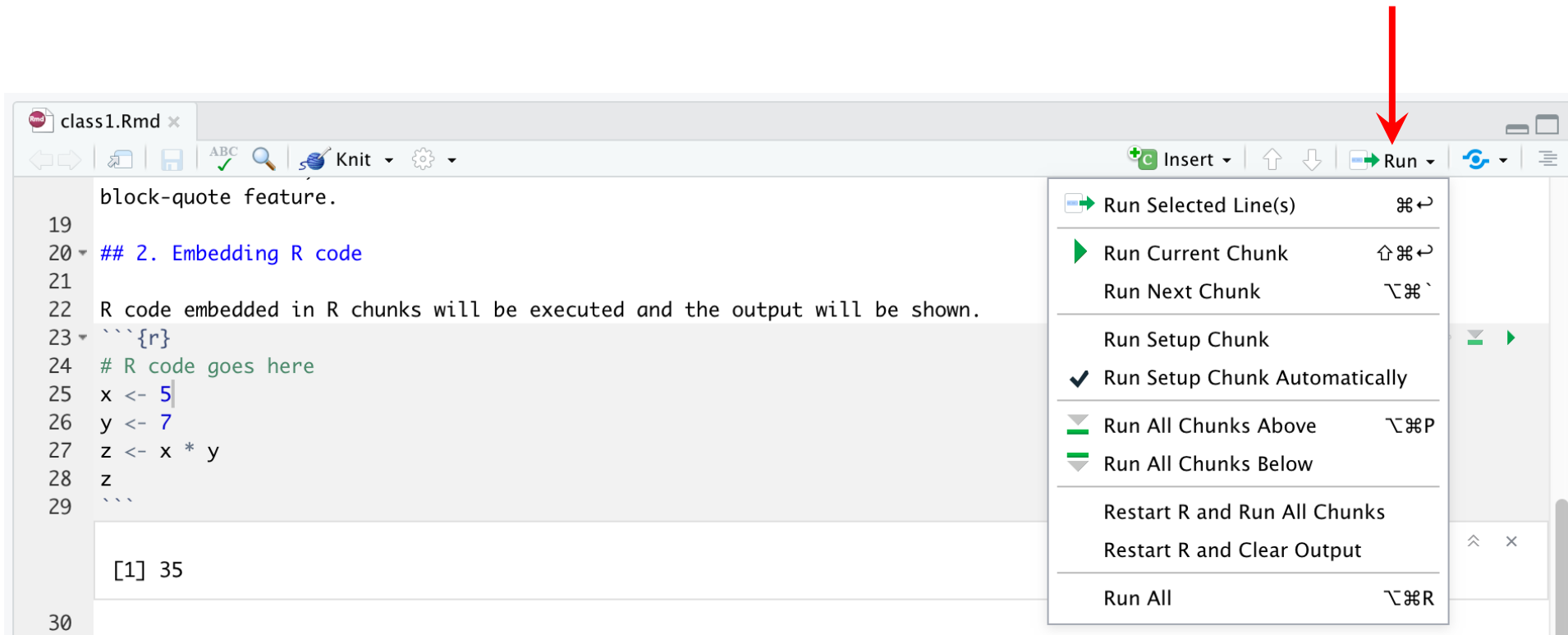
```
##  speed dist  
## 1     4    2  
## 2     4   10  
## 3     7    4  
## 4     7   22  
## 5     8   16  
## 6     9   10
```

```
plot(cars$speed, cars$dist)
```



# Different ways to execute code in RStudio

# Press the “Run” button



class1.Rmd x

block-quote feature.

```
19
20 ## 2. Embedding R code
21
22 R code embedded in R chunks will be executed and the output will be shown.
23 ```{r}
24 # R code goes here
25 x <- 5
26 y <- 7
27 z <- x * y
28 z
29 ```
```

[1] 35

30

Insert | Run

- Run Selected Line(s)
- Run Current Chunk
- Run Next Chunk
- Run Setup Chunk
- Run Setup Chunk Automatically
- Run All Chunks Above
- Run All Chunks Below
- Restart R and Run All Chunks
- Restart R and Clear Output
- Run All

# Highlight code you want to execute and press ctrl+Enter (cmd+Enter on Macs)

R code embedded in R chunks will be executed and the output will be shown.

```
```{r}  
# R code goes here  
x <- 5  
y <- 7  
z <- x * y  
z  
```
```



Console

Terminal x

Jobs x

~/Desktop/projects/ ↗

```
> x <- 5  
> y <- 7  
> z <- x * y  
> z  
[1] 35  
> |
```

# Place pointer on line of code you want to execute, press ctrl+Enter (cmd+Enter on Macs)

R code embedded in R chunks will be executed and the output will be shown.

```
`` `{r}  
# R code goes here  
x <- 5  
y <- 7  
z <- x * y  
z  
`` `
```



Console

Terminal x

Jobs x

~/Desktop/projects/ ↩

```
> z <- x * y
```

```
> |
```



# Use ctrl+Shift+Enter (cmd+Shift+Enter on Macs) to execute an entire code chunk

R code embedded in R chunks will be executed and the output will be shown.

```
`` `{r}  
# R code goes here  
x <- 5  
y <- 7  
z <- x * y  
z  
`` `
```



Console

Terminal x

Jobs x

~/Desktop/projects/ ↩

```
> x <- 5  
> y <- 7  
> z <- x * y  
> z  
[1] 35  
> |
```

# Shortcuts for coding

- **Ctrl+Shift+M** (Cmd+Shift+M on Macs) produces a pipe operator `%>%` (will be used with the tidyverse)
- **Ctrl+Shift+C** (Cmd+Shift+C on Macs) will comment/uncomment a line or multiple lines
- **Tab** and **Shift+Tab** will indent and un-indent lines, respectively

# R Programming Basics

# Assignments, numbers, vectors

```
> x <- 5
```

Assign number 5 to variable x

```
> x
```

```
[1] 5
```

```
> 5*x^2+7
```

Calculate  $5x^2+7$

```
[1] 132
```

```
> y <- c(1, 2, 3, 4, 5)
```

Create vector, assign  
to variable y

```
> y
```

```
[1] 1 2 3 4 5
```

```
> x*y
```

Multiply each element  
in y with the number in x

```
[1] 5 10 15 20 25
```

# Strings

A string contains text:

```
> name <- "Rachael Cox"
> name
[1] "Rachael Cox"
```

A vector of strings:

```
> animals <- c("cat", "mouse", "mouse",
"cat", "rabbit")
> animals
[1] "cat"      "mouse"    "mouse"    "cat"
"rabbit"
```

# Factors

Factors keep track of distinct categories (levels) in a vector:

```
> animals
[1] "cat"      "mouse"    "mouse"    "cat"
"rabbit"
```

```
> factor(animals)
[1] cat      mouse  mouse  cat      rabbit
Levels: cat mouse rabbit
```

# Data frames

We use data frames to store data sets with multiple variables:

```
> pets <- data.frame(  
  family = c(1, 2, 3, 4, 5),  
  pet = animals  
)
```

```
> pets
```

|   | family | pet   |
|---|--------|-------|
| 1 | 1      | cat   |
| 2 | 2      | mouse |
| 3 | 3      | mouse |
| 4 | 4      | cat   |

# Data frames

We access individual columns in a data frame with \$ + the column name:

```
> pets$family  
[1] 1 2 3 4 5
```

```
> pets$pet  
[1] cat      mouse    mouse    cat      rabbit  
Levels: cat mouse rabbit
```



# Data frames

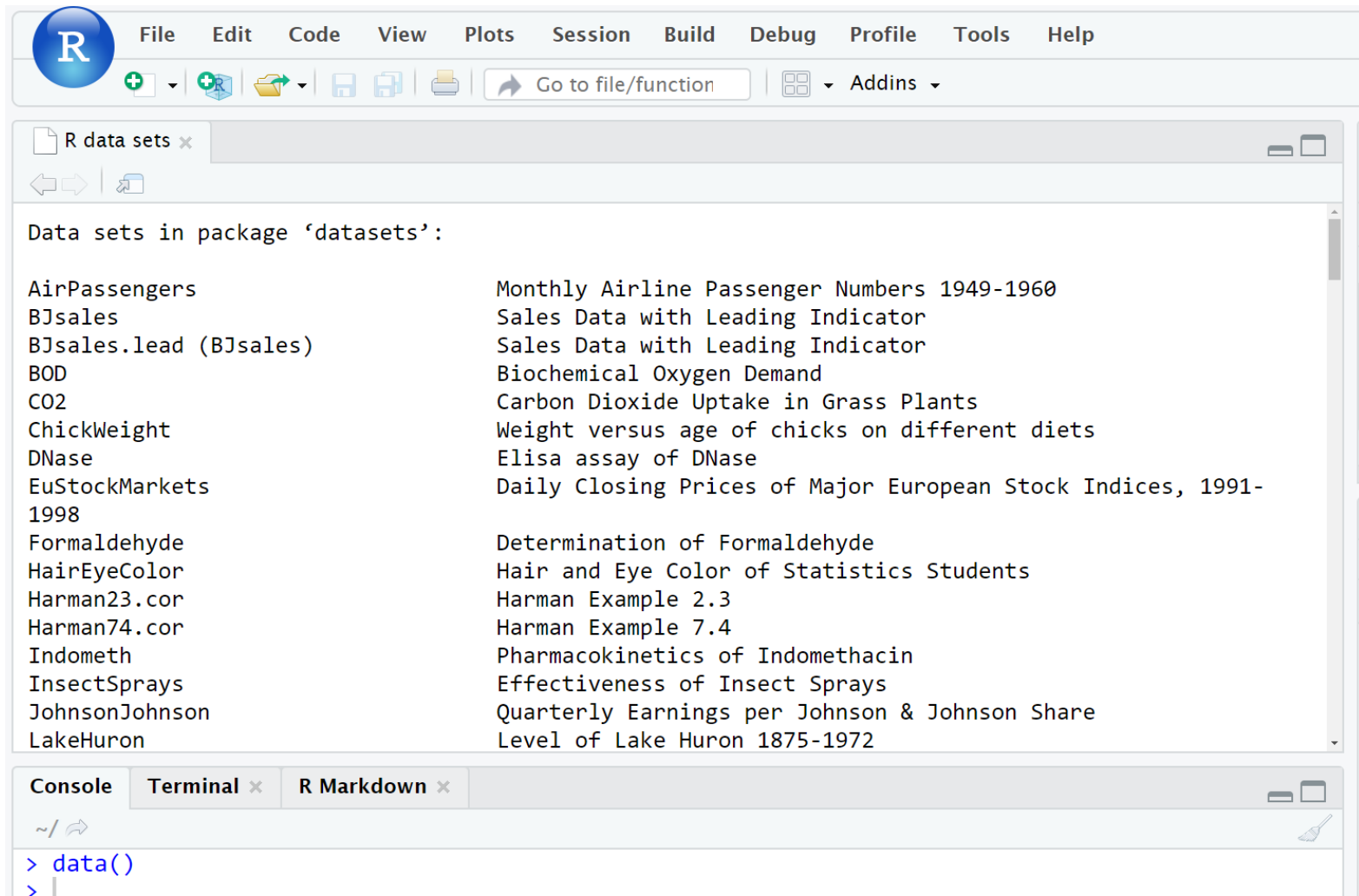
R has many built-in data frames:

```
> cars
```

|    | speed | dist |
|----|-------|------|
| 1  | 4     | 2    |
| 2  | 4     | 10   |
| 3  | 7     | 4    |
| 4  | 7     | 22   |
| 5  | 8     | 16   |
| 6  | 9     | 10   |
| 7  | 10    | 18   |
| 8  | 10    | 26   |
| 9  | 10    | 34   |
| 10 | 11    | 17   |

# Data frames

Available built-in datasets can be accessed with `data()`



The screenshot displays the RStudio environment. The top menu bar includes File, Edit, Code, View, Plots, Session, Build, Debug, Profile, Tools, and Help. Below the menu is a toolbar with icons for adding files, saving, and navigating. The 'R data sets' pane is open, showing a list of datasets in the 'datasets' package. The console at the bottom shows the command `> data()` being entered.

**R data sets**

Data sets in package 'datasets':

|                        |   |
|------------------------|---|
| AirPassengers          | Monthly Airline Passenger Numbers 1949-1960                     |
| BJsales                | Sales Data with Leading Indicator                               |
| BJsales.lead (BJsales) | Sales Data with Leading Indicator                               |
| BOD                    | Biochemical Oxygen Demand                                       |
| CO2                    | Carbon Dioxide Uptake in Grass Plants                           |
| ChickWeight            | Weight versus age of chicks on different diets                  |
| DNase                  | Elisa assay of DNase  |
| EuStockMarkets         | Daily Closing Prices of Major European Stock Indices, 1991-1998 |
| Formaldehyde           | Determination of Formaldehyde                                   |
| HairEyeColor           | Hair and Eye Color of Statistics Students                       |
| Harman23.cor           | Harman Example 2.3  |
| Harman74.cor           | Harman Example 7.4  |
| Indometh               | Pharmacokinetics of Indomethacin                                |
| InsectSprays           | Effectiveness of Insect Sprays                                  |
| JohnsonJohnson         | Quarterly Earnings per Johnson & Johnson Share                  |
| LakeHuron              | Level of Lake Huron 1875-1972                                   |

**Console**

```
> data()  
>
```

# Data frames

Data set information can be accessed with `?dataset`

The screenshot shows the RStudio interface. In the left pane, the 'R data sets' list includes 'cars', which is circled in red. A red arrow points from this 'cars' entry to the 'Speed and Stopping Distances of Cars' section in the right pane. The right pane shows the documentation for the 'cars' dataset, including its description, usage, format, and source. The console at the bottom shows the command `?cars` being entered.

**Environment** History Connections

Files Plots Packages **Help** Viewer

R: Speed and Stopping Distances of Cars Find in Topic

`cars {datasets}`

## Speed and Stopping Distances of Cars

### Description

The data give the speed of cars and the distances taken to stop. Note that the data were recorded in the 1920s.

### Usage

```
cars
```

### Format

A data frame with 50 observations on 2 variables.

```
[,1] speed numeric Speed (mph)
[,2] dist  numeric Stopping distance (ft)
```

### Source

Ezekiel, M. (1930) *Methods of Correlation Analysis*. Wiley.

Console Terminal R Markdown

```
> data()
> ?data
> ?cars
> |
```

# Data frames

The `head()` function shows the first few lines of a data frame:

```
> head(cars)
  speed  dist
1     4     2
2     4    10
3     7     4
4     7    22
5     8    16
6     9    10
>
```

# Functions

Functions are called in the format `function (argument)`

```
> head(cars)
```



Function name



First argument

# Functions

Functions can have any number of required arguments or optional arguments

> head(cars, 8)

Function name

First argument (required)

Second argument (optional; default = 6)

# Functions

`head(cars, 8)` will show the first 8 lines of the data frame instead of the default 6:

```
> head(cars, 8)
```

```
  speed dist
```

```
1      4     2
```

```
2      4    10
```

```
3      7     4
```

```
4      7    22
```

```
5      8    16
```

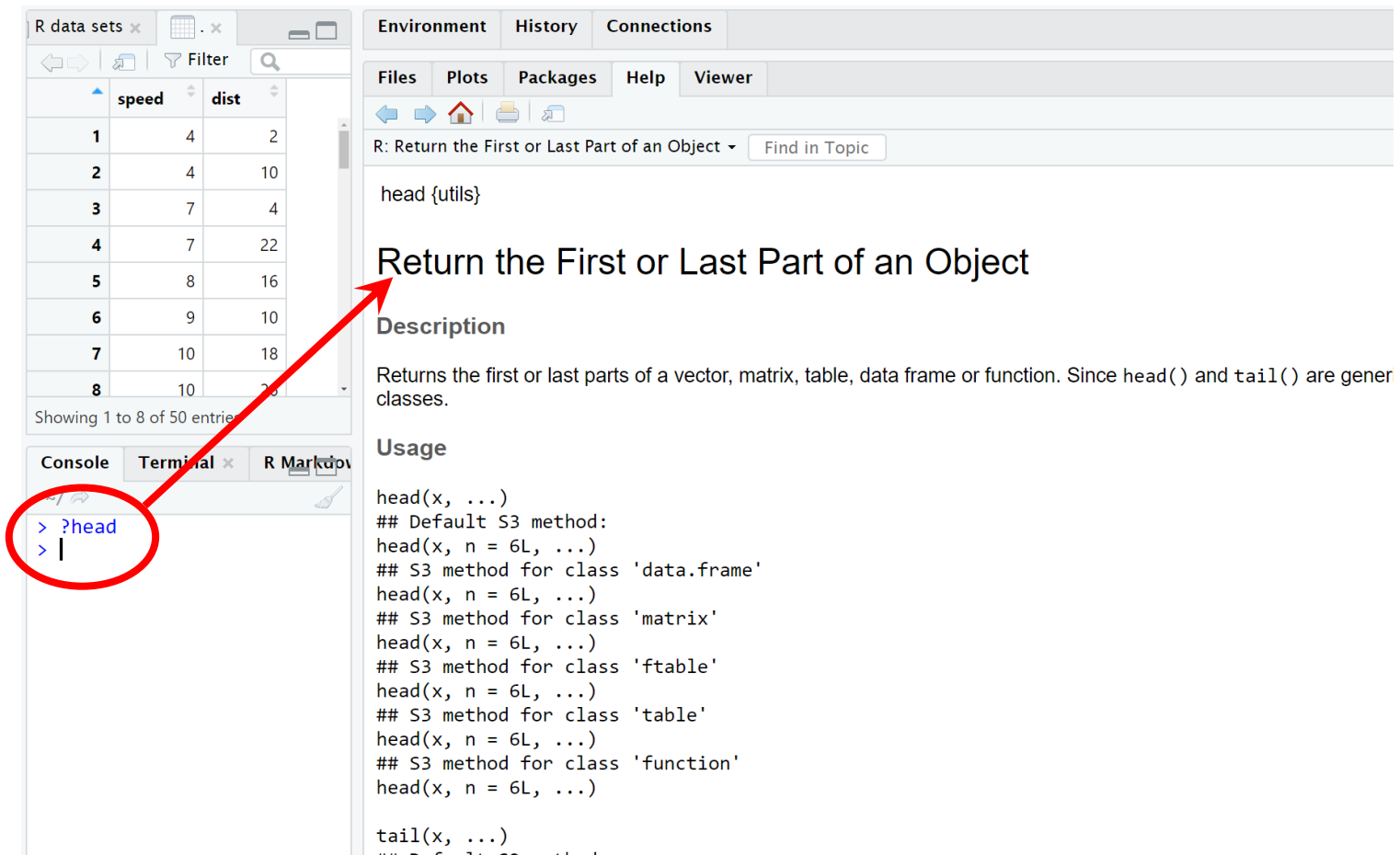
```
6      9    10
```

```
7     10    18
```

```
8     10    26
```

# Functions

More information about what a function does and/or requires can be accessed with `?function`



The screenshot shows the RStudio interface. On the left, a data frame with columns 'speed' and 'dist' is displayed. The 'Console' tab is active, showing the command `> ?head` entered, which is circled in red. A red arrow points from this command to the help page for `head()` on the right. The help page includes the title 'Return the First or Last Part of an Object', a description, and usage examples for both `head()` and `tail()`.

|   | speed | dist |
|---|-------|------|
| 1 | 4     | 2    |
| 2 | 4     | 10   |
| 3 | 7     | 4    |
| 4 | 7     | 22   |
| 5 | 8     | 16   |
| 6 | 9     | 10   |
| 7 | 10    | 18   |
| 8 | 10    | 20   |

Showing 1 to 8 of 50 entries

## Return the First or Last Part of an Object

**Description**

Returns the first or last parts of a vector, matrix, table, data frame or function. Since `head()` and `tail()` are generic classes.

**Usage**

```
head(x, ...)  
## Default S3 method:  
head(x, n = 6L, ...)  
## S3 method for class 'data.frame'  
head(x, n = 6L, ...)  
## S3 method for class 'matrix'  
head(x, n = 6L, ...)  
## S3 method for class 'ftable'  
head(x, n = 6L, ...)  
## S3 method for class 'table'  
head(x, n = 6L, ...)  
## S3 method for class 'function'  
head(x, n = 6L, ...)  
  
tail(x, ...)
```



# Functions

?function has argument information

The screenshot shows the RStudio interface. On the left, a data frame with columns 'speed' and 'dist' is visible. The console at the bottom shows the command `> ?head`. The main pane displays the help page for the `tail` function, which includes the title 'R: Return the First or Last Part of an Object', S3 method definitions for 'ftable', 'table', and 'function' classes, and a detailed 'Arguments' section. A red circle highlights the 'Arguments' section in the help text, and another red circle highlights the console input `?head`.

|   | speed | dist |
|---|-------|------|
| 1 | 4     |      |
| 2 | 4     |      |
| 3 | 7     |      |
| 4 | 7     |      |
| 5 | 8     |      |
| 6 | 9     |      |
| 7 | 10    |      |

Showing 1 to 8 of 50 entries

**Console** **Terminal**

```
> ?head
> |
```

**Environment** **History** **Connections**

**Files** **Plots** **Packages** **Help** **Viewer**

R: Return the First or Last Part of an Object

```
## S3 method for class 'ftable'
tail(x, n = 6L, addrownums = FALSE, ...)
## S3 method for class 'table'
tail(x, n = 6L, addrownums = TRUE, ...)
## S3 method for class 'function'
tail(x, n = 6L, ...)
```

**Arguments**

|            |  |
|------------|--|
| x          | an object  |
| n          | a single integer. If positive, size for the resulting object: number of elements for a vector (including lists), rows for a matrix or data frame or lines for a function. If negative, all but the n last/first number of elements of x. |
| addrownums | if there are no row names, create them from the row numbers.   |
| ...        | arguments to be passed to or from other methods.   |

# Functions

We can implicitly or explicitly pass arguments

```
> head(cars, 8)
```

```
  speed dist
```

```
1      4     2
```

```
2      4    10
```

```
3      7     4
```

```
4      7    22
```

```
5      8    16
```

```
6      9    10
```

```
7     10    18
```

```
8     10    26
```

```
>
```

```
> head(x=cars, n=8)
```

```
  speed dist
```

```
1      4     2
```

```
2      4    10
```

```
3      7     4
```

```
4      7    22
```

```
5      8    16
```

```
6      9    10
```

```
7     10    18
```

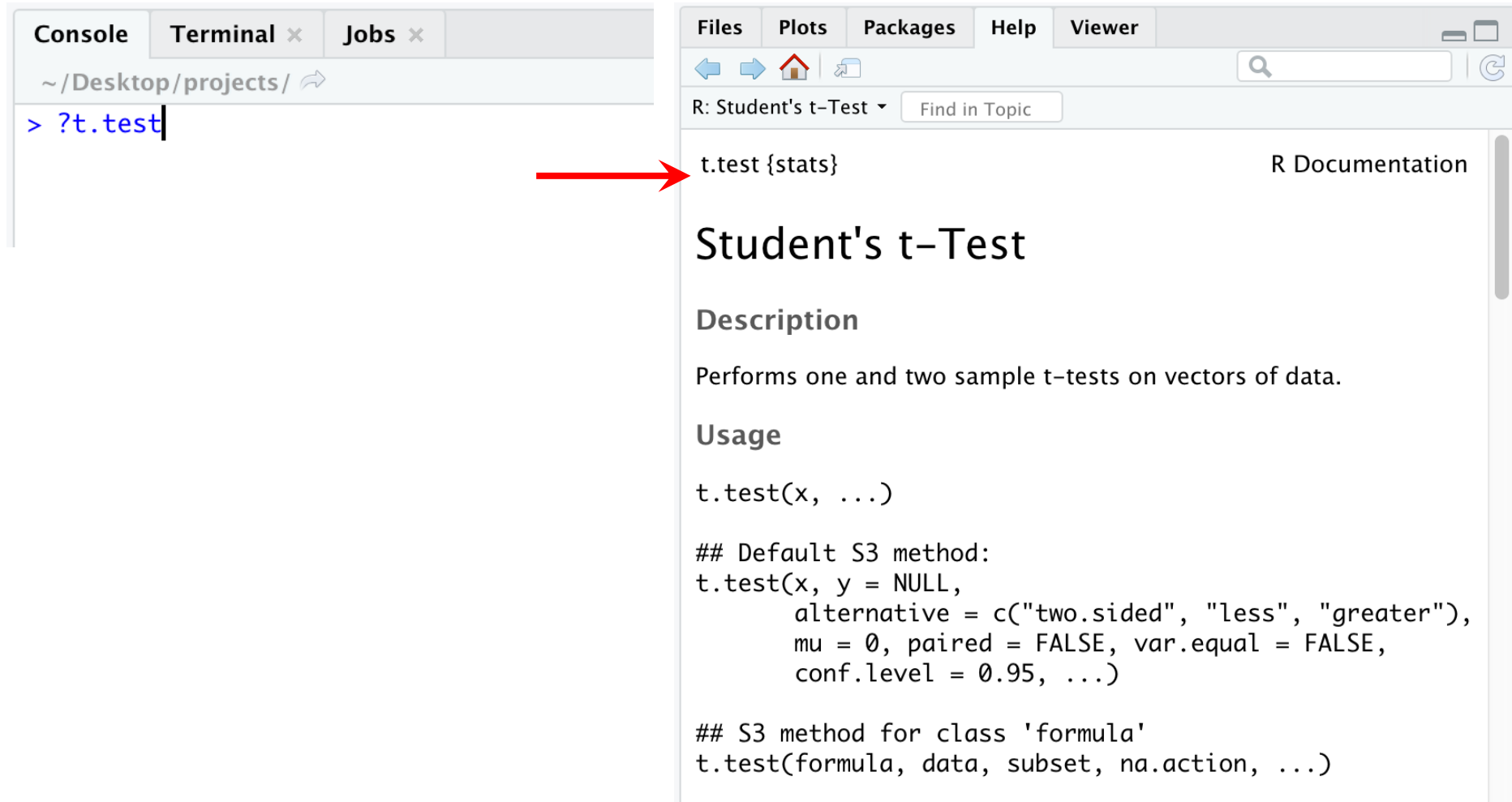
```
8     10    26
```

```
>
```

# Troubleshooting

# Ask RStudio for help

Type `?function` into console



The screenshot shows the RStudio interface. On the left, the Console pane displays the command `> ?t.test`. A red arrow points from this command to the right pane. The right pane shows the help documentation for `t.test {stats}`, titled "Student's t-Test". The documentation includes a description, usage, and default arguments.

**Console:**

```
~/Desktop/projects/
> ?t.test
```

**Help Pane: R Documentation**

**t.test {stats}**

## Student's t-Test

### Description

Performs one and two sample t-tests on vectors of data.

### Usage

```
t.test(x, ...)
```

## Default S3 method:

```
t.test(x, y = NULL,
      alternative = c("two.sided", "less", "greater"),
      mu = 0, paired = FALSE, var.equal = FALSE,
      conf.level = 0.95, ...)
```

## S3 method for class 'formula'

```
t.test(formula, data, subset, na.action, ...)
```

# Ask Google for help

how do i run a t test in r



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About 2,780,000,000 results (0.64 seconds)

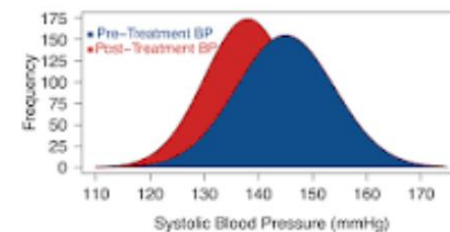
How to Perform **T-tests in R**. To conduct a one-sample **t-test in R**, we use the syntax `t.test(y, mu = 0)` where `x` is the name of our variable of interest and `mu` is set equal to the mean specified by the null hypothesis.


Aug 17, 2015


[datascienceplus.com](#) › t-tests ▾

[How to Perform T-tests in R | DataScience+](#)


Systolic Blood Pressure Before and After Treatment




 Error in `t.test.default(x, y)` : not enough 'x' observations

 Error in `t.test.default(x, y)` : not enough 'x' observations - Google Search

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What's this?

## Rotating and spacing axis labels in ggplot2


Ask Question

Asked 10 years, 10 months ago   Active 18 days ago   Viewed 768k times

680

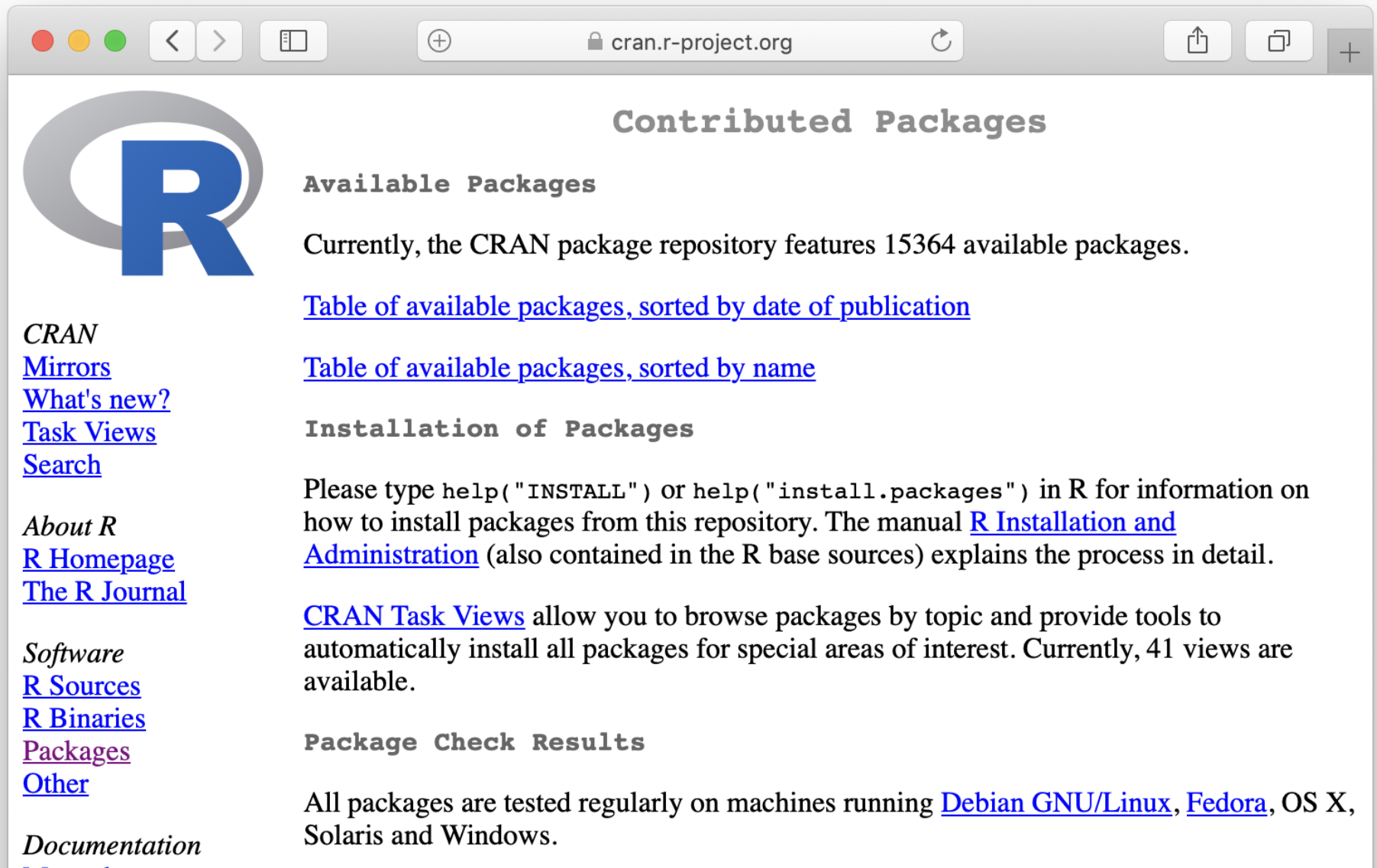


I have a plot where the x-axis is a factor whose labels are long. While probably not an ideal visualization, for now I'd like to simply rotate these labels to be vertical. I've figured this part out with the code below, but as you can see, the labels aren't totally visible.



Extending R through packages:  
There's a package for everything

# R packages are available on CRAN (Comprehensive R Archive Network)

A screenshot of a web browser displaying the CRAN (Comprehensive R Archive Network) website. The browser's address bar shows 'cran.r-project.org'. The website features the R logo on the left and a main content area with various links and information. The browser window includes standard macOS window controls (red, yellow, green buttons) and navigation icons (back, forward, home, search, and a plus sign for additional tabs).

**Contributed Packages**

**Available Packages**

Currently, the CRAN package repository features 15364 available packages.

[Table of available packages, sorted by date of publication](#)

[Table of available packages, sorted by name](#)

**Installation of Packages**

Please type `help("INSTALL")` or `help("install.packages")` in R for information on how to install packages from this repository. The manual [R Installation and Administration](#) (also contained in the R base sources) explains the process in detail.

[CRAN Task Views](#) allow you to browse packages by topic and provide tools to automatically install all packages for special areas of interest. Currently, 41 views are available.

**Package Check Results**

All packages are tested regularly on machines running [Debian GNU/Linux](#), [Fedora](#), OS X, Solaris and Windows.

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# Bio-specific R packages are available on Bioconductor



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*Bioconductor* provides tools for the analysis and comprehension of high-throughput genomic data.

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- Registration open for [BioC2020](#).
- Core team **job opportunities** available, contact Martin.Morgan at [RoswellPark.org](#)
- Bioconductor* [F1000 Research Channel](#) is

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- Call for birds-of-feather, hack-a-thon, and how-to sections. Please see [posting](#) for more information.
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