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Outline

- What is R
- Computing
 - syntax
 - data manipulation
 - simulation
 - modelling
- Graphics
 - base graphics
 - ggplot2
- Other stuff
 - debugging
 - 3D plots, animations, interactive graphics

Learning a new language



not that scary



What is R

R is the language for statistical computing and graphics (and more)

via

Setting up

- Download: http://cran.rstudio.com (RStudio cloud mirror)
- Windows, Linux, Mac OS X
- Editor?
 - RStudio for this workshop (alternatives: Notepad++/NppToR, Emacs/ESS, Eclipse/StatET, Vim, ...)
 - anything but Notepad under Windows
- The RStudio IDE

A note to the audience

To run the animation examples in the slides, you may need to open a native system graphics device instead of using the default RStudio device.

if (Sys.info()["sysname"] == "Darwin") quartz() else x11()

Some quick examples

- a simple calculator
- a Mine sweeper

```
if (!require("fun")) install.packages("fun")
library(fun)
if (.Platform$0S.type == "windows") x11() else {
    x11(type = "Xlib")
}
mine_sweeper()
```

■ Shiny "hello world"

```
if (!require("shiny")) install.packages("shiny")
shiny::runExample("01_hello")
```

Comparison with other languages

- designed for statistics (mean(), var(), lm(), glm(), rnorm(), boxplot(), ...)
 - but certainly not only for statistics
- highly vectorized (avoid explicit loops in general)
- unbeatable number of packages (> 6000 now)
- computing on the language, lazy evaluation, ...

Getting help

- use the question mark? to read documentation
 - e.g. try ?1m for help on linear models
- or help.start() for full HTML documentation
- Google, or your favorite searching engine
 - the pain of the single letter R
- StackOverflow: http://stackoverflow.com/questions/ tagged/r
- mailing lists?

Install add-on packages

```
## use install.packages(), e.g.
install.packages("animation")
```

You may be asked to choose a mirror.

Too many packages?? Use the task view: http://cran.rstudio.com/web/views/ (e.g. Econometrics)

Base R is still being actively updated

- Debian/Ubuntu: sudo apt-get upgrade
- Windows: may have to uninstall old version and install new version manually (or try the installr package)
- OS X: like Windows, or use Homebrew brew update
- easy to update packages: update.packages()

Simple calculations

- assignment by <- or = (most people use the former but I'm an outlier)
- ?Arithmetic (e.g. x + y, x %% y)
- indexing by [] or [[]] or \$

```
x <- 10
y <- 15:3

1 + 2
11 %% 2
11 %/% 2
3^4
log(10)

Y[4]
y[-1] # what do negative indices mean?

z <- c(a = 1, b = 2, c = 3)
z[1]
z[-1]
z['a']
z[c('a', 'c')]
z[c(TRUE, TRUE, FALSE)]</pre>
```

What to do with an unknown object

```
mtcars # just print it
str(mtcars) # the most useful function in R
plot(mtcars)
mtcars$mpg
mtcars[1, ]
mtcars[, 1]
mtcars[1:3, 5:7]
mtcars[, "mpg"]
mtcars$mpg
```

Functions

function_name(arguments)

```
z = rnorm(100)
fivenum # what are the arguments of this function?

fivenum(z)

fivenum(x = z, na.rm = TRUE)

fivenum(z, TRUE)

f = function(a, b = 1) {
    a + b # or return(a + b)
}

f(1)
f(a = 1)
f(1, 2)
f()
```

Conditions and loops

```
## the if-else statement
if (TRUE) {
    print(1)
} else {
    print(2)
}

## a for-loop (there is also while-loop and repeat)
s = 0
x = c(4, 2, 6)
for (i in 1:3) {
    s = s + x[i]
}
s = the above loop is the most stupid thing to do in R
```

Work with data

- a series of functions like read.table(), read.csv(), ...
- can work with databases too (need add-on packages like RODBC, RMySQL, ...)

```
## the tips data
tips = read.csv("http://dicook.public.iastate.edu/Army/tips.csv")

str(tips)

summary(tips)
mean(tips$bill) # index by $name
var(tips[, "tip"]) # index by character name
table(tips[, 4]) # index by column number

hist(tips$bill)
boxplot(tip ~ sex, data = tips)
plot(tip ~ bill, data = tips, col = as.integer(tips$sex))
```

Other types of data objects

- vector
- matrix, array
- list
- **.**..

Simulation

```
A family of functions for distributions: dfun(), pfun(), qfun() and rfun()

For example, rnorm()
```

A simulation of fire flames

```
library(animation)
demo("fire", ask = FALSE) # an application of image()
```



Another example with more scientific flavor

Q: How many times (on average) do we need to flip the coin until we get a sequence of HTH and HTT respectively? (For example, for the sequence HHTH, the number for HTH to appear is 4, and in THTHTT, the number for HTT is 6.)

A: You may consider a quick simulation.

HTH vs HTT problem cont'd

```
coin_seq = function(v) {
    x = rbinom(3, 1, 0.5)  # sequence of coin results
    n = 3  # a counter
    while (!all(x == v)) {
        x = c(x[-1], rbinom(1, 1, 0.5))
        n = n + 1
    }
    n
}
set.seed(919)
htt = replicate(10000, coin_seq(c(1, 0, 0)))
mean(htt)
hth = replicate(10000, coin_seq(c(1, 0, 1)))
mean(hth)
```

Modelling: linear regression

Take the tips data for example

```
fit1 = lm(tip ~ bill, data = tips)
summary(fit1)
```

You get

Modelling: the formula

The formula is an important component of many R functions for modelling.

```
fit2 = lm(tip ~ bill + sex, data = tips) # two variables

fit3 = lm(tip ~ bill + 0, data = tips) # without intercept

## you try summary() on them
```

Two graphics systems in R

base graphics

- the graphics package
- once drawn, no way to modify it again (have to redraw everything)
- functions to draw points, lines, polygons, ... like other languages
- many built-in types of plots (histogram, boxplot, bar chart, ...)

grid graphics

- the grid package
- more object-oriented: graphical elements are objects
- can be modified without explicitly redraw the whole plot
- more like an infrastructure package (no built-in plot types)

Add-on packages for graphics

There are many add-on packages based on the two systems; see the Graphics task view on CRAN for an overview: http://cran.rstudio.com/web/views/Graphics.html

- lattice: Trellis plots
 - sub-plots conditional on categorical variables
 - shipped with R (no need to install; just library(lattice))
- ggplot2: Grammar of Graphics
 - nice abstraction of graphics layers
 - http://ggplot2.org
 - not a base R package, so
 install.packages('ggplot2')

Examples of base graphics

```
tips = read.csv("http://dicook.public.iastate.edu/Army/tips.csv")
str(tips)

## scatter plot: positive correlation with a 'constraint'
plot(tip ~ bill, data = tips)
## what is the problem with R's default choice of point shapes?

## plot() is a very 'tricky' function in R; details later

hist(tips$tip, main = "histogram of tips")
## you see nothing except a right-skewed distribution

hist(tips$tip, breaks = 30) # more bins

hist(tips$tip, breaks = 100) # what do you see now?
```

~30 years ago, the research on choosing the histogram binwidth was extremely hot in statistics, but... who cares?

A trivial example of interactive graphics

We can change the binwidth interactively in R via many tools; one possibility is to build a GUI

```
library("shiny")
hist_ui = fluidPage(
  titlePanel("Hello Shiny!"),
  sidebarLayout(
    sidebarPanel(
      sliderInput("bins", "Number of bins:",
                  min = 1, max = 50, value = 30)
   ),
   mainPanel(
      plotOutput("distPlot")
  )
hist_server = function(input, output) {
  output$distPlot = renderPlot({
        = faithful[, 2] # Old Faithful Geyser data
   bins = seq(min(x), max(x), length.out = input$bins + 1)
   hist(x, breaks = bins, col = 'darkgray', border = 'white')
  })
}
shinyApp(ui = hist_ui, server = hist_server)
```

Play with colors

There are many color models in R, like rgb(), hsv(), ... And there are built-in color names, e.g. 'red', 'purple'. Here is an example of rgb()

```
rgb(1, 0, 0) # red (hexidecimal representation)
rgb(1, 1, 0) # yellow
shinyApp(
 ui = fluidPage(
   fluidRow(
      column (
        6,
        sliderInput('x1', 'Red', 0, 1, 0),
        sliderInput('x2', 'Green', 0, 1, 0),
        sliderInput('x3', 'Blue', 0, 1, 0)
      column(6, plotOutput('color'))
   )
  ),
  server = function(input, output) {
   output$color = renderPlot({
      par(bg = rgb(input$x1, input$x2, input$x3), mar = rep(0, 4))
      plot.new()
    })
colors() # all names you can use
plot(rnorm(30), pch = 19, col = sample(colors(), 30), cex = 2)
```

Other plots in base graphics system

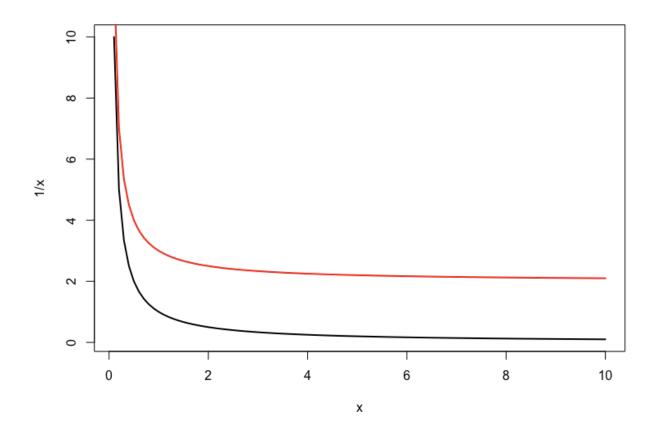
Old-fashioned but many goodies...

- open help.start() and take a look at the graphics package
- all you need to learn about base graphics is there
- many types of plots of interest: contour(),
 filled.contour(), fourfoldplot(),
 mosaicplot(), pairs(), smoothScatter(),
 stripchart(), sunflowerplot(), symbols()

Some comments

- avoid pie charts (why?)
- avoid 3D plots (what?!)
 - unless they are interactive (e.g. the rgl package)
 - an alternative is the contour plot
- consider color-blind people
- The Elements of Graphing Data (William S Cleveland)
 - order of precision (length good; angle bad; ...)

Trend of vertical difference between two curves



Luke, use the source!

Only the source code is real.

```
x = seq(0.1, 10, 0.1)
plot(x, 1/x, type = "1", lwd = 2)
lines(x, 1/x + 2, col = "red", lwd = 2)
```

Why ggplot2?

- you have to wrestle with gory details in base graphics
 - yes, it is flexible
 - but you have to take care of everything
 - point symbols, colors, line types, line width, legend, ...
- common tasks in graphics
 - color the points according to the sex variable
 - different point symbols denote the smoker variable
 - darker points denote larger parties (the size variable)
 - add a smoothing/regression line on a scatter plot

• ...

Simple ggplot2 examples

We still use the tips data here.

```
library(ggplot2)
## different colors denote the sex variable
qplot(bil1, tip, data = tips, color = sex)

## point symbols
qplot(bil1, tip, data = tips, shape = smoker)

## you can manipulate ggplot2 objects
p = qplot(bil1, tip, data = tips, color = size)
p

## do not like the color scheme? change it
p + scale_colour_gradient2(low = "white", high = "blue")

## faceting
qplot(tip, data = tips, facets = time ~ day)

p + geom_smooth() # smoothing line
```

More examples in ggplot2 website

ggplot2 has its own website of documentation, which is a rich source of examples.

- boxplots: http://docs.ggplot2.org/current /geom_boxplot.html
- contours: http://docs.ggplot2.org/current /stat_contour.html
- hexagons: http://docs.ggplot2.org/current /stat_binhex.html
- Pac man chart: http://docs.ggplot2.org/current /coord_polar.html

■ ...

Other packages on graphics

As mentioned before, there are many other packages based on the two graphics systems.

- animation: a gallery of statistical animations and tools to export animations
- rgl: interactive 3D plots
- maps: not surprisingly, for maps
- iplots: interactive statistical graphics
- rggobi: connect R with GGobi (a standalone software package for interactive stat graphics)
- ggvis: next generation of ggplot2, based on R + JavaScript

install.packages(c("animation", "rgl", "ggvis"))

The animation package

The idea is simple:

```
## rotate the word 'Animation'
for (i in 1:360) {
    dev.hold()
    plot(1, ann = FALSE, type = "n", axes = FALSE)
    text(1, 1, "Animation", srt = i, col = rainbow(360)[i], cex = 7 * i/360)
    dev.flush()
    Sys.sleep(0.02)
}
```

animation examples

```
library(animation)
?brownian.motion
?quincunx
?grad.desc

## export to an HTML page
?saveHTML

demo('busybees')

demo('CLEvsLAL')
```

rgl

Play with 3D graphics.

```
## use your mouse (drag or wheel up/down)
library(rgl)
demo("rgl")

## an artificial dataset
library(animation)
demo("pollen")
```

RStudio's manipulate package

```
# this example only works in RStudio
library(manipulate)
y = rnorm(200)^2
manipulate({
    y1 = (y + c)^p
    qqnorm(y1)
    qqline(y1)
}, c = slider(0, 4, 0, step = 0.1), p = slider(-2, 2, 1, step = 0.1))
```

Debugging

The function debug can be used to debug a function.

```
f = function(x) {
    m = length(x)
    x[is.na(x)] = mean(x, na.rm = TRUE) # impute by mean
    s = sum(x^2) # sum of squares
    s
}
f(c(1, NA, 2))

## begin to debug the function now
debug(f)

f(c(1, NA, 2))

undebug(f)
```

Thanks!

- http://yihui.name
- @xieyihui
- https://github.com/yihui