

# R package development tutorial

a gentle introduction

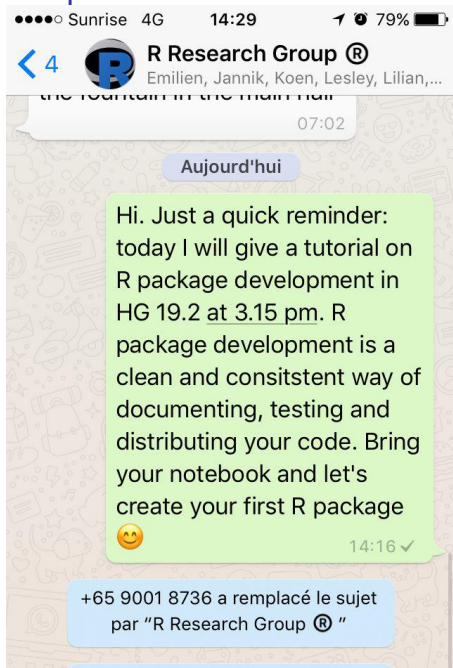
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# Today's plan

- ▶ first 60 minutes: Theory + group practice.
- ▶ last 30 minutes: (optional participation): Training problems, general questions.

# The impact of this tutorial



# What is R package development?

Process of

- ▶ writing code in a standardized framework.
- ▶ writing code for generic use.

# Why should I develop an R Package?

Tell me why :-)

# Why should I develop an R Package?

Standard way of

- ▶ documenting
- ▶ testing
- ▶ distributing

code

# What is a package (states)?

- ▶ source code (when you create it).
- ▶ built package (what you save to your disk with `install.packages()`).

# What is a package (source code)?

A directory with a few files / folders:

- ▶ DESCRIPTION (meta info)
- ▶ NAMESPACE (import / export)
- ▶ R/ (your functions)
- ▶ man/ (your documentation)
- ▶ vignettes/ (long form documentation)
- ▶ tests/ (tests)
- ▶ data/ (your data)



# Creating a package (skeleton)

Let's do it together.

- ▶ Open RStudio.
- ▶ New RStudio Project -> Package

Done :-)

## A few basic things about using Rstudio

- ▶ go to file/function.
- ▶ file browser.
- ▶ break points and `browser()`
- ▶ Command history (arrow + recursive search).

## Clean-up

- ▶ make NAMESPACE ready for roxygen2 by overwriting NAMESPACE contents with `# Generated by roxygen2: do not edit by hand.`
- ▶ remove the documentation file for `hello-world` (how?) and the code file `hello-world.R` (how).
- ▶ enable markdown support Roxygen: `list(markdown = TRUE)`. This will allow you to use markdown syntax.
- ▶ adapt DESCRIPTION to your specific needs.

## Intermezzo: Markdown syntax

- ▶ `[label](https://...)` for web-links
- ▶ `[fun()]` for cross-references
- ▶ `'code'` for code font.
- ▶ stars /numbers with dots for enumerations.
- ▶ ...

# Framework for package development

We are going to use the devtools framework with uses the following R packages:

- ▶ roxygen2 for in line documentation.
- ▶ testthat for unit tests.
- ▶ usethis for common non-coding, manipulating, editing tasks.

## roxygen

- ▶ Special comments `#'` we use in source code are called roxygen comments.
- ▶ `roxygen2` extracts those and creates documentation in `man/` for you. The file format of the documentation is `.Rd`.
- ▶ Alternative: learn latex-like language and write plain `.Rd`.

## Adding a function to your package

- ▶ `>usethis::use_r("my-file-name")` to create a new file `my-file-name.R` in `R/`.

- ▶ Create a function. I suggest `add_two_numbers <- function(x, y) {`

```
  sum(x, y)
```

```
}
```

- ▶ Suggest to name files by context, not by function.
- ▶ Can have multiple function declarations in one file.
- ▶ `R/` is only for declarations, no top-level function calls.
- ▶ Exception: Obviously in function declarations, you can have calls.

# Adding a function to your package

- ▶ How can I use this function interactively? -> Workflow



## Intermezzo: Namespaces

- ▶ Every object in R is defined in a “context”.
- ▶ The order of the namespaces on the search path defines where R will look for an object first.
- ▶ What does `search()`?
- ▶ You probably used the global namespace so far.
- ▶ What happens when you call `library()`?
- ▶ Every package a name space.
- ▶ That's why you can redefine `var()` and `sd()` is unaffected (Why?).

# Workflow

- ▶ Edit a file.
- ▶ Run `devtools::load_all()`. Just updates the package namespace.
- ▶ Don't put anything in the global name space, e.g. via `source`.
- ▶ Run `devtools::document()` to generate `.Rd` from roxygen comments.

## devtools::load\_all()

- ▶ This updates the namespace in your current R session.
- ▶ You don't change the package in the place where you have all your other packages stored.
- ▶ For this reason: (i) it is much faster than building the package with `devtools::build()` and (ii) it is not available in other R sessions.

## Adding a function to your package

- ▶ How can I use this function as a “usual” R package in any R session?
- ▶ Need to build the package.

## NAMESPACE stuff

- ▶ decide whether you want function to be exported (=available for the end user) (roxygen tag `@export`).
- ▶ if you need functions from other packages:  
`usethis::use_package("pkgname")`. This will add package to DESCRIPTION.
- ▶ then, refer to the function from the package with  
`pkgname::fun()`.
- ▶ Alternative: Refer to package with `fun()` and add roxygen tag `@importFrom pkgname fun`. This will add package and function to NAMESPACE.
- ▶ You can often use a roxygen comment to refer to multiple "things". I.e. `@importFrom pkgname fun1 fun2 fun3`.

# Documentation

- ▶ Example: `style_pkg()` from the `styler` package.
- ▶ Compare (i) rendered `.Rd` with `styler::style_pkg()` with (ii) the source at <https://github.com/r-lib/styler/blob/master/R/ui.R#L6>

Structure:

- ▶ Title
- ▶ two lines blank
- ▶ description
- ▶ `@param x,y Vectors.`
- ▶ `@export`
- ▶ `@examples`

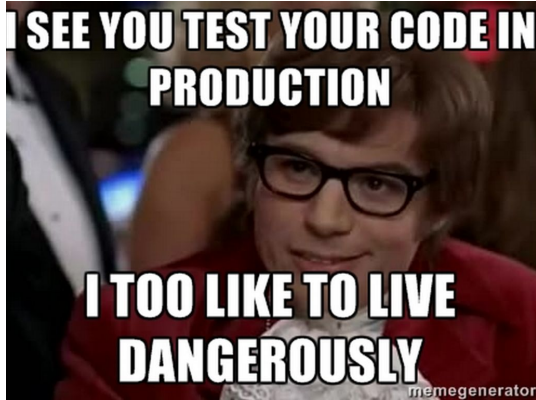
# Documentation

Other useful roxygen tags:

- ▶ @inheritParams
- ▶ @seeAlso
- ▶ @family
- ▶ ...

Start at this vignette (has a some non-markdown syntax in there like `\code{x}`, just use it for the tags).

## Testing (basic idea)





## Testing (basic idea)



## Testing (basic idea)

- ▶ Why? Complexity grows exponentially with internal dependencies.
- ▶ test whether your function returns what you expect.
- ▶ I.e. match result of function call with reference.

## Testing (basic idea)

- ▶ Example with `add_two_numbers()`?
- ▶ unit testing -> test (small) units.
- ▶ fail fast.
- ▶ high coverage (-> covr package)

## Testing (Setting up)

- ▶ tests live in `tests/`
- ▶ we use the package `testthat` for unit testing.
- ▶ `>usethis::use_testthat()` to add infrastructure

## Testing (adding a test)

- ▶ `usethis::use_test("testname")` adds a test file in `tests/testthat`
- ▶ all testthat test file names start with `test-`.

## Testing (writing tests)

- ▶ `context()`: Useful when running tests to see which one fail / succeed.
- ▶ `'test_that("x y z returns correct number of rows", [code])`.
- ▶ Form sentences for easy understanding: "Test that x y z returns correct number of rows"

## Testing (testing functions)

- ▶ most testthat functions start with `expect_`.
- ▶ `expect_silent()`
- ▶ `expect_s3class()`
- ▶ `expect_equal()`
- ▶ `expect_true()`
- ▶ `expect_equal_to_reference()` (use `git !` or `update = FALSE`)
- ▶ ...
- ▶ `skip_*()` to skip platform dependent.

## How to run tests

- ▶ Cmd+Shift+T or build tab.
- ▶ Note that default working directory of for tests is not root directory of package.
- ▶ Using the `rprojroot` package to find these files. Also useful for `.Rmd` files (since their default working directory is where the file is located).

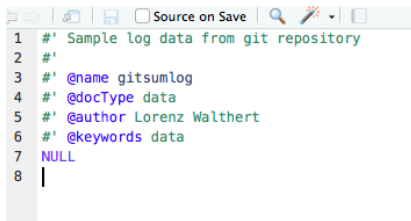
```
testthat_file <- function(...) {  
  file.path(rprojroot::find_testthat_root_file(), ...)  
}
```

- ▶ Then, in tests, refer to files relative to `testthat` directory as follows:
- ▶ `expect_equal_to_references(my_object,  
 test_that_file("reference-objects/ref-1"))`



# Adding data

- ▶ `>usethis::use_data(dataset)` adds data with the name `dataset`.



```
1 #' Sample log data from git repository
2 #'
3 #' @name gitsumlog
4 #' @docType data
5 #' @author Lorenz Walthert
6 #' @keywords data
7 NULL
8 |
```

# Putting it all together: R CMD CHECK

Asserts a whole range of things, in particular:

- ▶ documentation matches code (all arguments documented).
- ▶ all unit tests pass.
- ▶ package can be installed
- ▶ ...

Run `devtools::check()` (or simply `Ctrl+Shift+E`)

# Let's make your package pass R CMD CHECK

Iterative process of

- ▶ running `devtools::check()`.
- ▶ fixing errors, warnings, notes.

# Using continuous integration

Can run R CMD check locally, but also on fresh copy of

- ▶ Linux / mac (with Travis)
- ▶ Windows (with AppVeyor)

## More add ons

- ▶ covr for code coverage reports.
- ▶ slack notifications etc.

An example: [www.github.com/r-lib/styler](https://www.github.com/r-lib/styler)

# Vignettes

- ▶ Long for documentation.
- ▶ `>usethis::use_vignette("vignette-title")`
- ▶ can be found via package index.
- ▶ build vignettes into `inst/` with `devtools::build_vignettes()`

# pkgdown

- ▶ Package to create nice html documentation from your source code.
- ▶ can be hosted on GitHub.

An example: [www.github.com/r-lib/styler](https://www.github.com/r-lib/styler)

# Releases

- ▶ Why releases?
- ▶ Suggested form: `major.minor.patch`, e.g. `0.1.2`
- ▶ Change in `DESCRIPTION`



# Putting your package on GitHub

Last weeks course:

1. initialize GitHub repo locally.
2. Create repo on GitHub
3. Go back to command line and push

## Installing from GitHub

```
remotes::install_github("[username]/[repo]"), e.g.  
remotes::install_github("tidyverse/dplyr").
```

# Announcement

- ▶ We are looking for R package developers in Google Summer of code for styler
- ▶ 3 months 1:1 code review from me and Kirill Müller (2nd most CRAN downloads after Hadley Wickham)
- ▶ CHF 6600 from Google
- ▶ and (probably) also ~6 credits from ETH for applied area.
- ▶ Talk to me afterwards or go to this GitHub repo.

## Closing

- ▶ Go here for more details: <http://r-pkgs.had.co.nz>
- ▶ Thanks for your attention.