

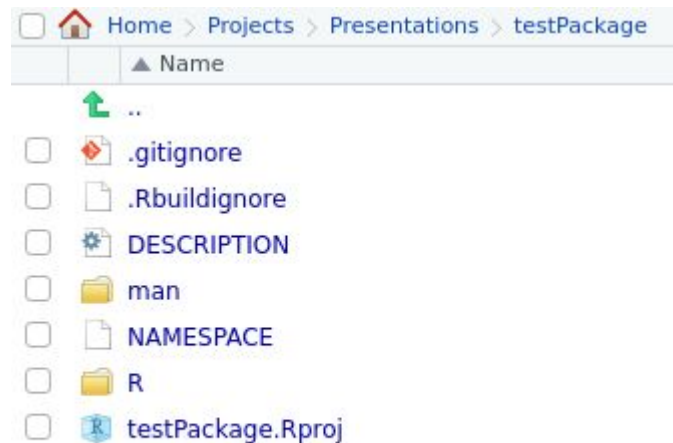
# Creating Data Packages in R

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# What is an R package?

- A collection of functions, documentation, tests and data
- Traditionally *functions* have been the purpose for package distribution
  - Write documentation to explain the usage
  - Write tests to validate them
  - Bundle data to showcase them



# What is a data package?

- This time the data is the purpose for distribution
  - Write functions, documentation and tests to support the data
  - Write documentation to explain usage, detail the source and add additional metadata (*roxygen*)
  - Write tests to qa/qc (*testthat*)
  - Write functions to facilitate additional processing, and visualizations

# Why create data packages?

- Create reproducible workflows for data distribution
  - Capture and version control the entire process of going from raw to clean
  - Facilitate team workflow
- Bundle documentation with the data
  - Using roxygen and a well defined documentation workflow create a package that details sources, usage and purpose for data
- Package and release versioned data alongside other products
  - Develop data packages as part of larger deliverable or “ecosystem”
  - Package deliverable data
- Use a handful of additional packages to extend usage of data
  - Build websites with pkgdown
  - Create API's with plumb
  - Integrate into Shiny Apps

# The Workflow

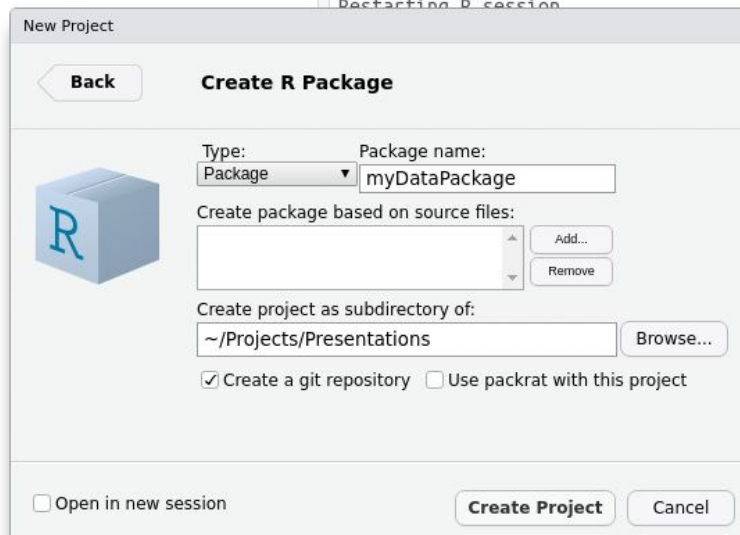
Use the R package framework to capture all aspects of going from raw to clean

*A Proposed Workflow (using the **usethis** package)*

- 1. Start at the data-raw/ folder, place all raw data here*
- 2. Start scripting the wrangling process, place these scripts in data-raw*
- 3. Once complete create a binary of the data in the data/ folder and document*
- 4. Create test suite for the data*
- 5. Build, (Publish?) and repeat*

# Package Creation

- Follow Package naming conventions
- Enable git repository



```
+ all(sapply(myDataPackage::fish_tox, class) == "numeric")
+ )
> all(sapply(myDataPackage::fish_tox, class) == "numeric")
[1] TRUE
```

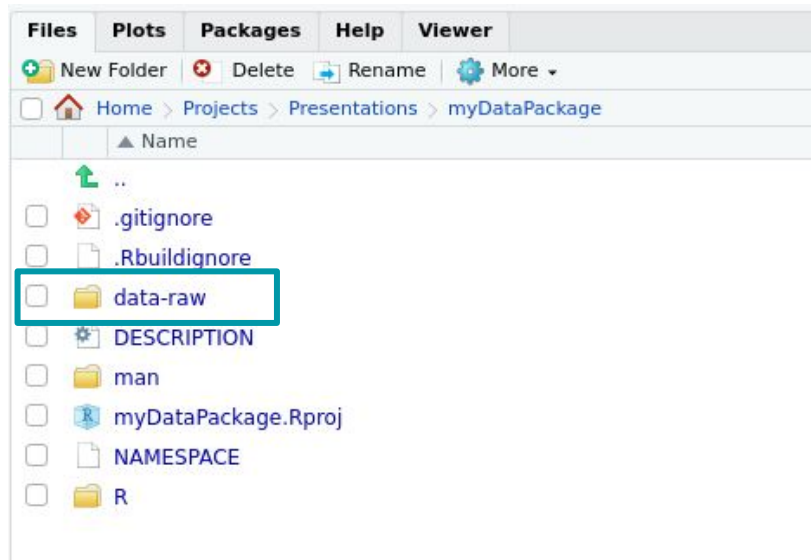
```
fish_tox
Format
data frame with 908 rows and 7 columns
c1c0
molecular descriptor
```

ve regression QSAR mo  
LC50 data, which is th  
descriptors: MLOGP (m  
, NdsCH ((atom-type cc

# Package Creation

```
usethis::use_data_raw()
```

- ✓ Setting active project to '/home/emanuel/Projects/Presentations/myDataPackage'
- ✓ Creating 'data-raw/'
- ✓ Adding '^data-raw\$' to '.Rbuildignore'
- ✓ Writing 'data-raw/DATASET.R'
  - Modify 'data-raw/DATASET.R'
  - Finish the data preparation script in 'data-raw/DATASET.R'
  - Use `usethis::use\_data()` to add prepared data to package



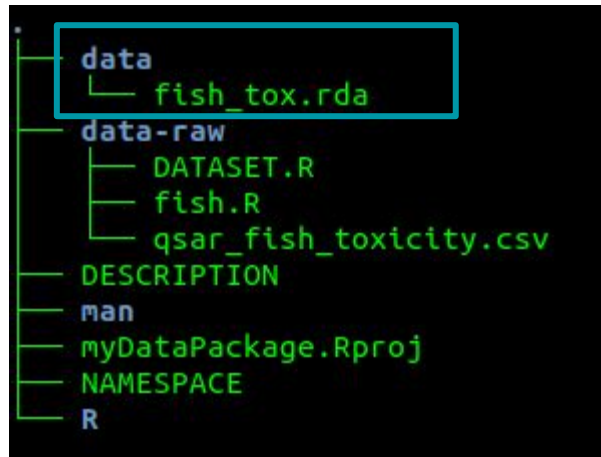
# Wrangling and Packaging

```
# data-raw/fish.R
library(tidyverse)
col_names <- c("c1c0", "sm1",
              "gat", "ndsch",
              "ndssc", "mlo",
              "resp")

fish_tox <-
read_delim("data-raw/qsar_fish_toxicity.csv",
           col_names = col_names,
           delim = ";")

usethis::use_data(fish_tox, overwrite = TRUE)
```

- ✓ Setting active project to  
'/home/emanuel/Projects/Presentations/myDataPackage'
- ✓ Creating 'data/'
- ✓ Saving 'fish\_tox' to 'data/fish\_tox.rda'






# Document Data

- Use roxygen2 to document datasets in detail
- Create and use a data.R file in R the directory
- Build documentation
  - `devtools::document(roclets = c('rd', 'collate', 'namespace'))` or
  - **Ctrl+Shift+B** (build package)

# Document

R/data.R

```
##' @title Fish Toxins
##' @description This dataset was used to develop quantitative regression
##' QSAR
##' models to predict acute aquatic toxicity towards the fish Pimephales
##' promelas
##' (fathead minnow) on a set of 908 chemicals. LC50 data, which is the
##' concentration that causes death in 50% of test fish over a test duration
##' of
##' 96 hours, was used as model response. The model comprised 6 molecular
##' descriptors: MLOGP (molecular properties), CIC0 (information indices),
##' GATS1i (2D autocorrelations), NdssC (atom-type counts),
##' NdsCH ((atom-type counts), SM1_Dz(Z) (2D matrix-based descriptors).
##' @format data frame with 908 rows and 7 columns
##' \describe{
##' \item{c1c0}{molecular descriptor}
##' \item{sm1}{molecular descriptor}
##' \item{gat}{molecular descriptor}
##' \item{ndsSch}{molecular descriptor}
##' \item{ndssc}{molecular descriptor}
##' \item{mlo}{molecular descriptor}
##' \item{resp}{experimental response}
##' }
##' @details
##' Details can be found in the quoted reference: M. Cassotti, D. Ballabio,
##' R. Todeschini,
##' V. Consonni. A similarity-based QSAR model for predicting acute toxicity
##' towards
##' the fathead minnow (Pimephales promelas), SAR and QSAR in Environmental
##' Research (2015), 26, 217-243; doi: 10.1080/1062936X.2015.1018938
"fish_tox"
```



Standard roxygen syntax  
allows for detailed  
documentation of all  
dataset aspects



Reference dataset name



fish\_tox {myDataPackage}

R Documentation

## Fish Toxins

### Description

This dataset was used to develop quantitative regression QSAR models to predict acute aquatic toxicity towards the fish *Pimephales promelas* (fathead minnow) on a set of 908 chemicals. LC50 data, which is the concentration that causes death in 50 96 hours, was used as model response. The model comprised 6 molecular descriptors: MLOGP (molecular properties), C1C0 (information indices), GATS1i (2D autocorrelations), NdssC (atom-type counts), NdsCH ((atom-type counts), SM1\_Dz(Z) (2D matrix-based descriptors).

### Usage

fish\_tox

### Format

data frame with 908 rows and 7 columns

c1c0

molecular descriptor

sm1

molecular descriptor

gat

molecular descriptor

ndsch

molecular descriptor

ndssc

molecular descriptor

mlo

molecular descriptor

resp

experimental response

### Details

Details can be found in the quoted reference: M. Cassotti, D. Ballabio, R. Todeschini, V. Consonni. A similarity-based QSAR model for predicting acute toxicity towards the fathead minnow (*Pimephales promelas*), SAR and QSAR in Environmental Research (2015), 26, 217-243; doi: 10.1080/1062936X.2015.1018938

# Build a test suite for your data

- Use `testthat` to build a suite of test for data
- Make running test part of the workflow for data wrangling

# Test Data

Write test as guided by the testthat package, set up using `use_this::use_testthat()`

```
# test/testthat/test-fish-data.R

context("Fish data")
library(myDataPackage)

test_that("Columns are of the correct type", {
  expect_true(
    all(sapply(myDataPackage::fish_tox, class) ==
"numeric")
  )
})
```

```
Loading myDataPackage
Testing myDataPackage
✓ | OK F W S | Context
✓ | 1      | Fish data
```

```
— Results —————
OK:      1
Failed:  0
Warnings: 0
Skipped: 0
```

# Package and release versioned data

- Data is clean, has been documented and been put through a test suite
- Distribute as need; <https://github.com/ERGZ/myDataPackage>
- Build a website for it and deploy on Github pages

# Use case

<https://github.com/FlowWest/cvpiaHabitat>

# More info

Use this: <https://usethis.r-lib.org/>

Test that: <https://testthat.r-lib.org/>

roxygen2: <http://r-pkgs.had.co.nz/man.html>

Devtools: <https://devtools.r-lib.org/>