

R... for hydrogeologists(?)

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Februar 28, 2018

Outline

- ▶ Talk 1:
 1. Overview of R
 2. R show case: potential use for AUG-group
- ▶ Talk 2: R language - some important concepts

Resources

- ▶ presentations on P:/RKurs
- ▶ for each task (on <https://emanuelhuber.github.io/Rcourse/>
 - ▶ list of best R-package
 - ▶ cheat sheets
 - ▶ online book/course/tutorial
- ▶ some tutorial on P:/RKurs (including data)

Introduction

Programming language ranking by the IEEE (2017)

Institute of Electrical and Electronics Engineers ranking

Language Rank	Types	Spectrum Ranking
1. Python	🌐💻	100.0
2. C	📱💻⚙️	99.7
3. Java	🌐📱💻	99.5
4. C++	📱💻⚙️	97.1
5. C#	🌐📱💻	87.7
6. R	💻	87.7
7. JavaScript	🌐📱	85.6
8. PHP	🌐	81.2
9. Go	🌐💻	75.1
10. Swift	📱💻	73.7

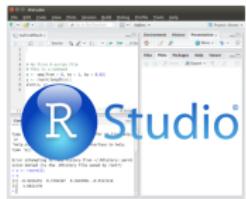
Why R is so popular?

- ▶ free and open-source (no licence)
- ▶ runs on Linux, Windows and MacOS.
- ▶ large community
- ▶ many packages available that are documented (help files + vignettes)
- ▶ can link C, C++, Fortran code
- ▶ excellent tools for data analysis (Google, Airbnb, Facebook, Microsoft...)
- ▶ high-quality graphics
- ▶ object-oriented programming

R Environment: GUI and packages



```
bioconductor> install.packages("BiocManager")
Bioconductor 2.14.0 (2017-04-13) -- "Milestone in Bioconductor"
Copyright 2017 The R Foundation for Statistical Computing
Copyright 2017 The R Core Team
Bioconductor is free software and comes with ABSOLUTELY NO WARRANTY.
You should have received a copy of the GNU General Public License
along with this program. If not, see <http://www.R-project.org/> for details.
Several language supports best running in an Rscript isolate
or in a collaborative environment with many participants.
For more information about Bioconductor, please visit
<http://www.bioconductor.org>. To get help or report a bug,
please use the Bioconductor support system at
<http://www.bioconductor.org/bioc-support.html> or
<http://www.bioconductor.org/bioc-devel.html> for an R-devel interface to help
with R development.
Bioconductor 2.14.0 (2017-04-13) -- "Milestone in Bioconductor"
Copyright 2017 The R Foundation for Statistical Computing
Copyright 2017 The R Core Team
Bioconductor is free software and comes with ABSOLUTELY NO WARRANTY.
You should have received a copy of the GNU General Public License
along with this program. If not, see <http://www.R-project.org/> for details.
Several language supports best running in an Rscript isolate
or in a collaborative environment with many participants.
For more information about Bioconductor, please visit
<http://www.bioconductor.org>. To get help or report a bug,
please use the Bioconductor support system at
<http://www.bioconductor.org/bioc-support.html> or
<http://www.bioconductor.org/bioc-devel.html> for an R-devel interface to help
with R development.
```



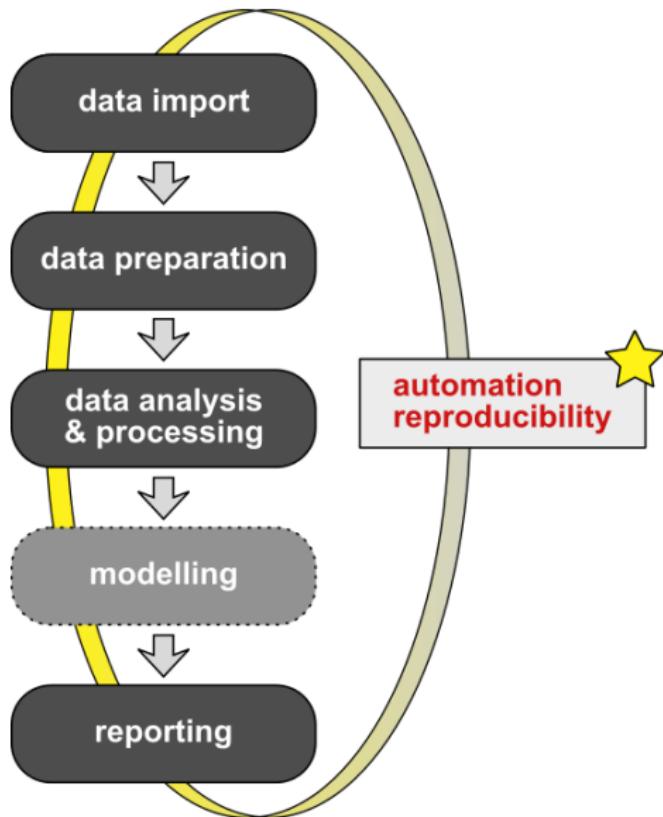
More than 12'000 packages!

CRAN Task Views

Bayesian	Bayesian Inference
ChemPhys	Chemometrics and Computational Physics
ClinicalTrials	Clinical Trial Design, Monitoring, and Analysis
Cluster	Cluster Analysis & Finite Mixture Models
DifferentialEquations	Differential Equations
Distributions	Probability Distributions
Econometrics	Econometrics
Environmetrics	Analysis of Ecological and Environmental Data
ExperimentalDesign	Design of Experiments (DoE) & Analysis of Experimental Data
ExtremeValue	Extreme Value Analysis
Finance	Empirical Finance
FunctionalData	Functional Data Analysis
Genetics	Statistical Genetics
Graphics	Graphic Displays & Dynamic Graphics & Graphic Devices & Visualization
HighPerformanceComputing	High-Performance and Parallel Computing with R
MachineLearning	Machine Learning & Statistical Learning
MedicalImaging	Medical Image Analysis
MetaAnalysis	Meta Analysis
Multivariate	Multivariate Statistics
NaturalLanguageProcessing	Natural Language Processing
NumericalMathematics	Numerical Mathematics
OfficialStatistics	Official Statistics & Survey Methodology
Optimization	Optimization and Mathematical Programming
Pharmacokinetics	Analysis of Pharmacokinetic Data
Phylogenetics	Phylogenetics, Especially Comparative Methods
Psychometrics	Psychometric Models and Methods
ReproducibleResearch	Reproducible Research
Robust	Robust Statistical Methods
SocialSciences	Statistics for the Social Sciences
Spatial	Analysis of Spatial Data
SpatioTemporal	Handling and Analyzing Spatio-Temporal Data
Survival	Survival Analysis
TimeSeries	Time Series Analysis
WebTechnologies	Web Technologies and Services
gR	gRaphical Models in R

Potential use of R for AUG group

R strengths



- ▶ all-in-one tool
- ▶ no licence
- ▶ teaching, research, reporting
- ▶ automation and reproducible workflow

Data import/export

Resources - data import

Function	What It Does
<code>read.table()</code>	Reads any tabular data where the columns are separated <code>read.table(file = "filePath", sep = "\t", header = TRUE)</code>
<code>read.csv()</code>	A simplified version of <code>read.table()</code> to read CSV files. <code>read.csv(file = "filePath")</code>
<code>scan()</code>	Finer control over the read process when your data isn't tabular. <code>scan("filePath", skip = 1, nmax = 100)</code>
<code>readLines()</code>	Reads text from a text file one line at a time. <code>readLines("filePath")</code>
<code>read.fwf()</code>	Read a file with dates in fixed-width format. <code>read.fwf("filePath", widths = c(1, 2, 3))</code>
<code>readxl::read_excel()</code>	To read excel files (xls andxlsx), from <code>readxl</code> package <code>read_excel("filePath", sheet = "mtcars")</code>

Import/export



Data preparation

Resources - data cleaning

- ▶ **Package**
 - ▶ `dplyr`
- ▶ **Cheat sheet**
 - ▶ regular expression cheat sheet
 - ▶ `dplyr`: data transformation cheat sheet
- ▶ **Vignettes/Tutorials/book**
 - ▶ Tutorial: An introduction to data cleaning with R (53 p.)
 - ▶ Hands-On Data Science with R: Data Preparation
 - ▶ `dplyr` vignettes
 - ▶ Tutorial: Regular Expressions in R

Data cleaning (1)

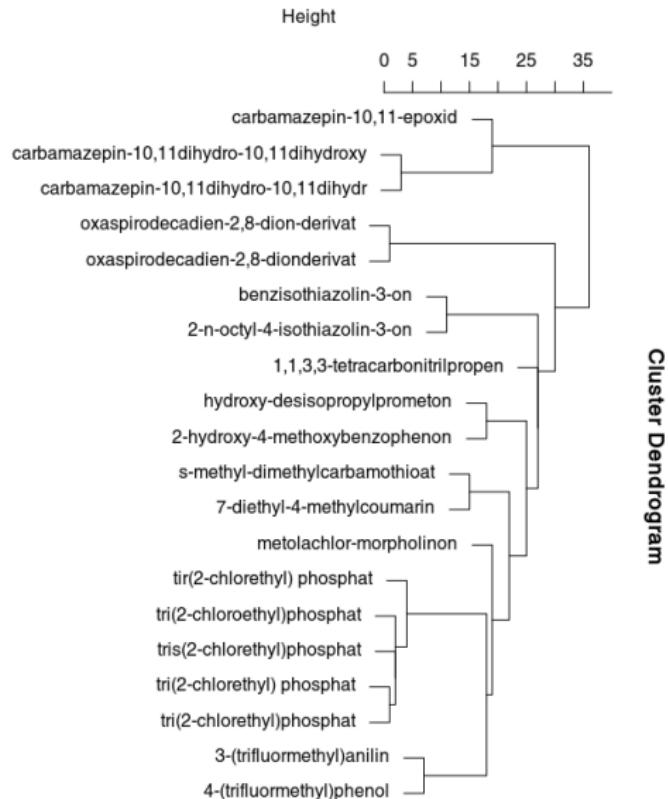
date	location	parameter	value
2011-01-12	RIVER	Head	2.31
2011-01-18	RIVER	nitrat	27.7
2011-01-18	GW_1	RIV_head	NA
2011-01-18	GW_1	nitrat	0.0083
2011-01-18	GW_1	sulfat	0
2011-01-18	GW_1	bromid	6.419
2011-01-18	GW_2	324/head	0.1226
2011-01-18	GW_2	nitrat	1.07
2011-01-18	GW_2	bromid	0
2011-03-02	RIVER	head	0.0194
2011-03-02	RIVER	nitrat	6.116
2011-03-02	RIVER	bromid	1.09
2011-03-02	GW_1	HEAD	0.0347

- ▶ remove rows/columns
- ▶ remove duplicates
- ▶ transform data
- ▶ correct for inconsistencies
- ▶ convert data type
- ▶ deal with missing values

- ▶ rename variables: Head, RIV_head, 324/head, head, HEAD in head

```
pattern <- "RIV_|^[:digit:]+/"  
x$parameter <- sub(pattern, "", x$parameter)  
x$parameter <- tolower(x$parameter)
```

Data cleaning (2)



Cluster Dendrogram

detect typo errors

- ▶ distance between strings
- ▶ dendrogram visualisation
- ▶ partial string matching

Resources - Data shaping

- ▶ **Package**
 - ▶ `tidyverse`
- ▶ **Cheat sheet**
 - ▶ `tidyverse`: Tidy Data (see p. 2)
- ▶ **Tutorials/book**
 - ▶ Concepts of data tidying are well explained in the chapter [Data Tidying](#) from the book Data science with R.

Data shaping 1 (tidy data)

"Messy" data

date	location	parameter	value
2011-01-12	RIVER	head	2.31
2011-01-18	RIVER	nitrat	27.7
2011-01-18	GW_1	head	NA
2011-01-18	GW_1	nitrat	0.0083
2011-01-18	GW_1	sulfat	0
2011-01-18	GW_1	bromid	6.419
2011-01-18	GW_2	head	0.1226
2011-01-18	GW_2	nitrat	1.07
2011-01-18	GW_2	bromid	0
2011-03-02	RIVER	head	0.0194
2011-03-02	RIVER	nitrat	6.116
2011-03-02	RIVER	bromid	1.09
2011-03-02	GW_1	head	0.0347

Tidy data

date	location	head	nitrat	sulfat	bromid
2011-01-12	RIVER	2.31	27.7	NA	NA
2011-01-18	GW_1	NA	0.0083	0	6.419
2011-01-18	GW_2	0.1226	1.07	NA	0
2011-03-02	RIVER	0.0194	6.116	NA	1.09
2011-03-02	GW_1	0.0347	NA	NA	NA

```
x_tidy <- tidyr::spread(x, parameter, value)
```

reverse process possible with `tidyr:gather()`

Tidy data satisfies three rules ([see Data Science with R](#)):

- ▶ Each variable in the data set is placed in its own column
- ▶ Each observation is placed in its own row
- ▶ Each value is placed in its own cell

Data analysis and processing

Data analysis

- ▶ data analysis
 - ▶ statistics: [check](#)
 - ▶ linear regression
 - ▶ [boxplot](#)
 - ▶ linear regression (p-value, R^2)
 - ▶ PCA (linear relationship)
 - ▶ [cluster analysis](#)
 - ▶ dendrogram [nice tutorial](#), [another tutorial](#)
 - ▶ k-means algorithm

check

In short, pair-wise x-y plots were computed between the average baselines of all FCM and sensor parameters for a first visual observation of any apparent correlations. The pair-wise correlations between the full base-lines of all parameters were then quantified by the computation of Pearson's correlation coefficients (PCC, linear relationship) and Spearman's rank correlation coefficients (monotonic relationship) after standardization of the FCM and sensor data sets (see Section 8 in supplementary information). The significance of the correlations was assessed by the computation of p-values at 95% confidence level. The pair-wise coefficients were displayed in a heat map for efficient representation of the gradients in positive and inverse correlations between parameters, and for rapid identification of the pre-dominant correlations. In this heat map, the parameters were reordered by hierarchical clustering using the Ward algorithm (see Section 8 in supplementary information). The additional R packages Vegan (Oksanen et al., 2009), Heatplus (Ploner, 2011), and Heatmap.plus (Day, 2007) were used to these ends. **TP1 Basellandschaft**

Time series - resources

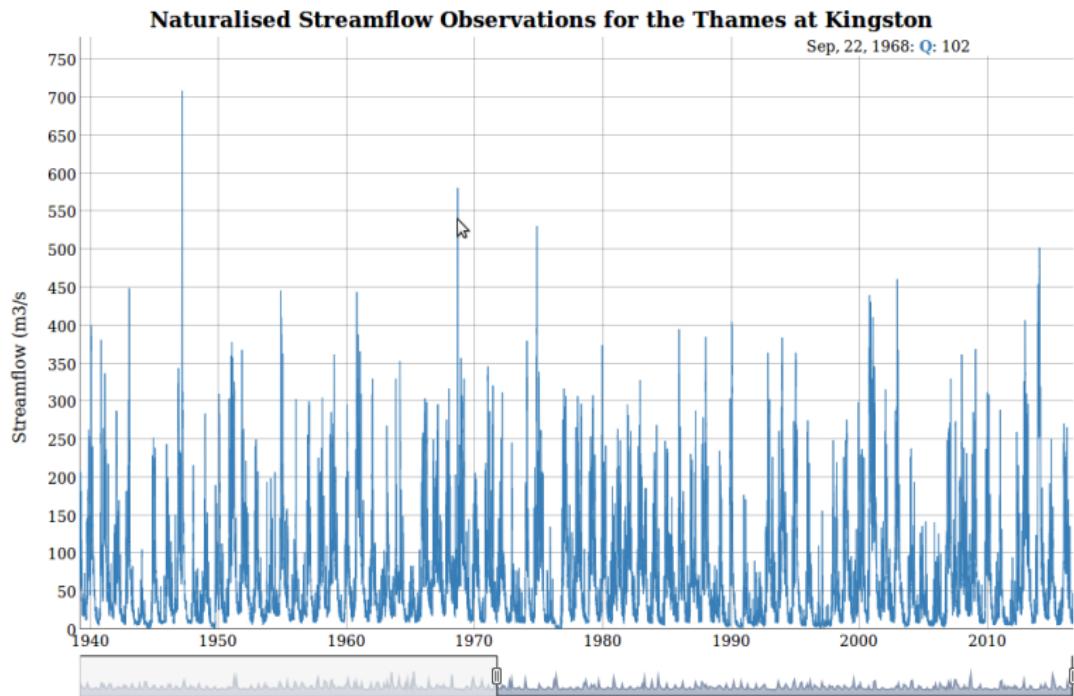
- ▶ **Package**
 - ▶ “eXtensible Time Series” `xts` that extends the `zoo` package
 - ▶ `zoo` for regular and irregular Time Series
 - ▶ `lubridate` to deal with date and time
- ▶ **Cheat sheet**
 - ▶ eXtensible Time Series: `xts`
 - ▶ How to deal with date and time: `lubridate` cheat sheet
- ▶ **Vignette/tutorials/book**
 - ▶ `xts` vignettes
 - ▶ `zoo` vignettes
 - ▶ Dates and Times Made Easy with `lubridate`

See also *

[pracma]((<https://cran.r-project.org/web/packages/pracma/index.html>) for *
[signal]((<https://cran.r-project.org/web/packages/signal/index.html>) for *
check * Filling in missing values?

Time series - Dynamic visualisation

Dynamic time series visualisation with package [dygraph](#)



Time series - Import and preparation

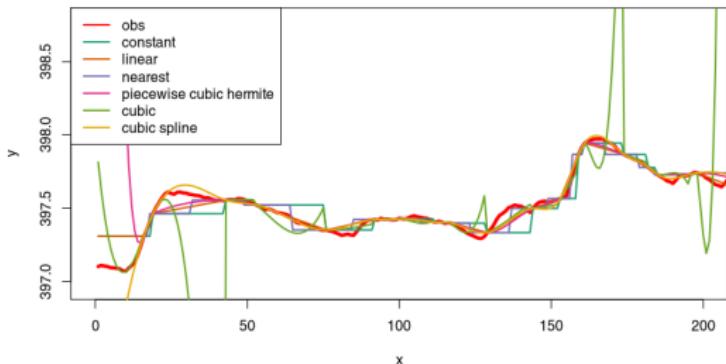
- ▶ fill in missing values (interpolation)
- ▶ regular time-step
 - ▶ smoothing
 - ▶ decimate

Online flow cytometry measurements were linearly interpolated and then sampled at equal time intervals (15-minutes) using the “approx()” command of the statistical software R39. This was to adjust for minor deviations from the 15-minutes sampling interval in the original data set... .

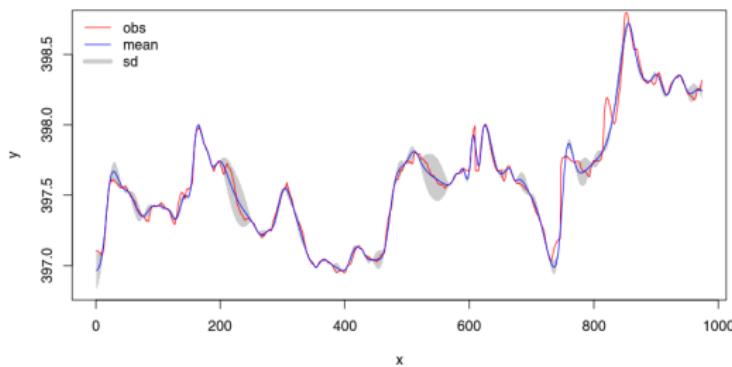
Nature

Time series - Interpolation

1D Interpolation methods



Gaussian process interpolation



Time series - statistics

- ▶ Daily, monthly, yearly values (cf. book: Analysis of ecological data with R)
- ▶ Auto-correlation function (ACF) and Cross-correlation function (CCF) See ARIMA model [tutorial](#), [tutorial2](#)
- ▶ empirical cumulative distribution function

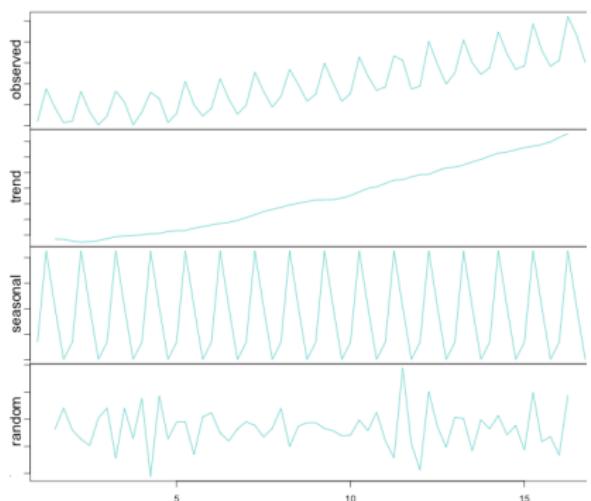
Time series - spectral analysis

- ▶ Fourier
- ▶ SSA
- ▶ ?
- ▶ wavelet analysis
- ▶ impulse response function: Check RRAWFLOW package: [rrawflow website](#)
- ▶ Example: NF-Fisch Plot CP1 against CP2 and CP3: ellipses
- ▶ CD-Experiment
- ▶ [time-series cleanup](#)
- ▶ [time-series](#)

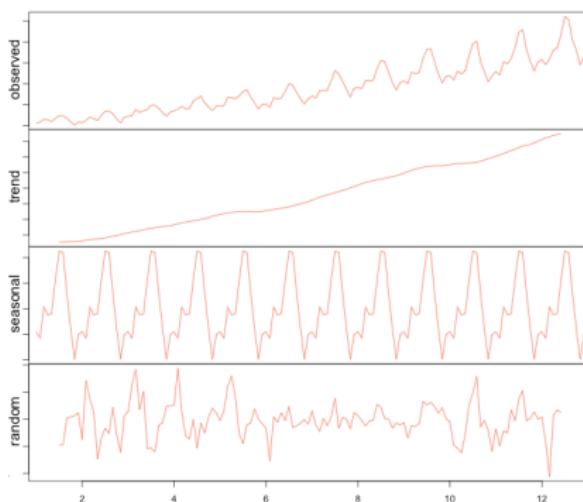
Time series - regression

- ▶ Regression

Time series Trend and seasonal components



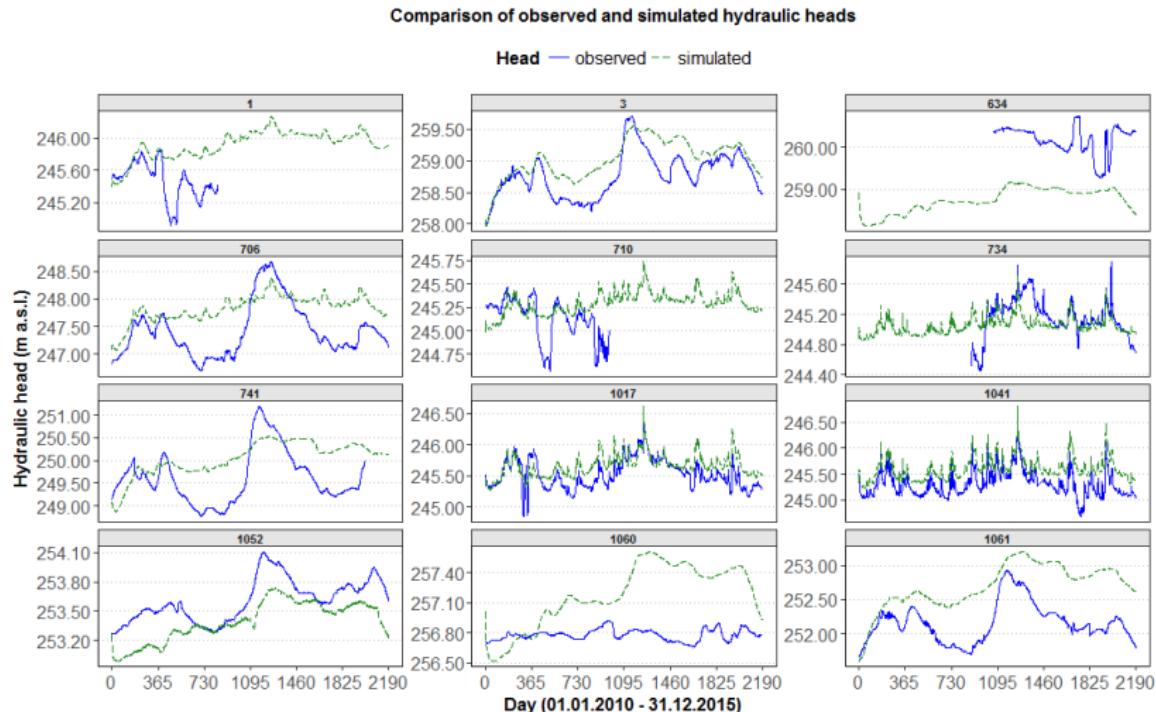
Decomposition of multiplicative time series



... The interpolated time series was then decomposed into a “trend component” (aperiodic dynamic), a “seasonality component” (periodic dynamic; R-code based terminology not related to seasons of the year), and a “remainder component” (noise and dynamics not accounted for by the above two components) using the “`stl()`” command... [Nature](#)

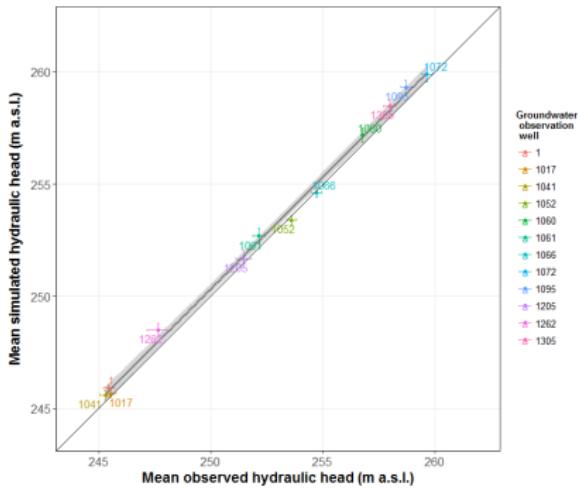
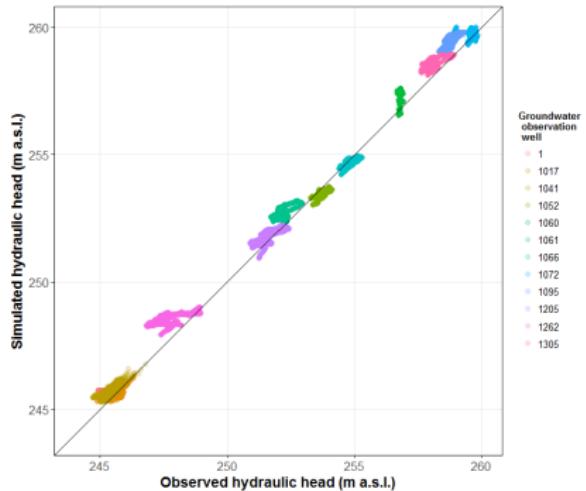
```
x_dcp_add <- decompose(x, "additive")
x_dcp_mul <- decompose(x, "multiplicative")
```

Time series - Import FEFLOW data

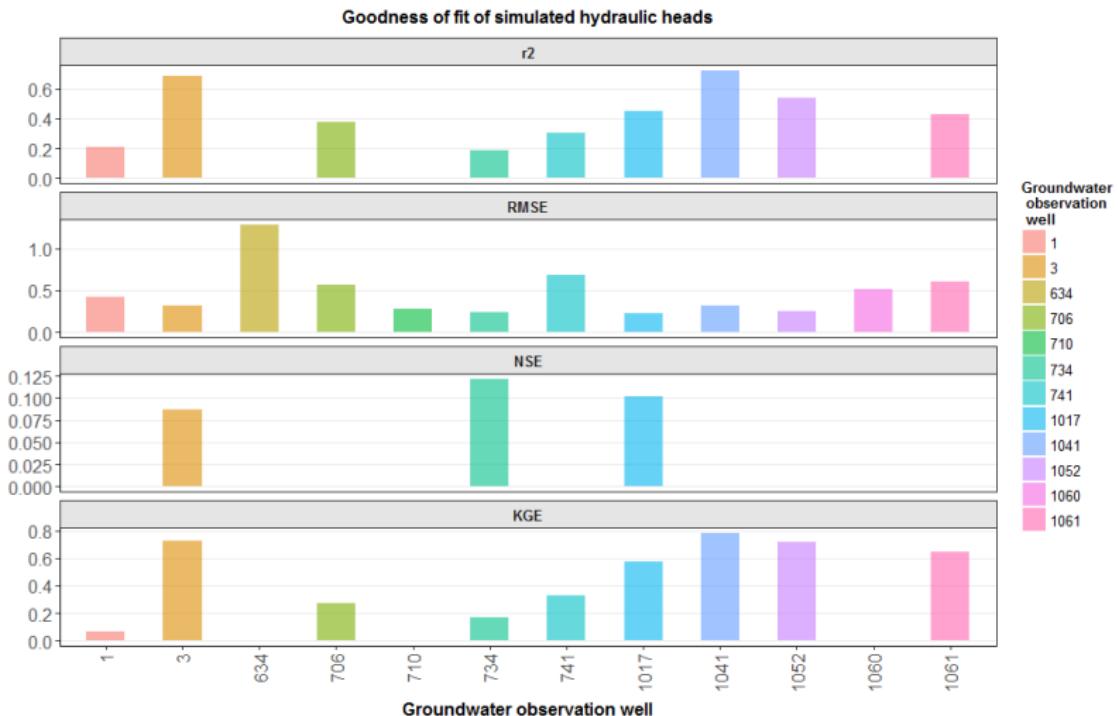


source: MM

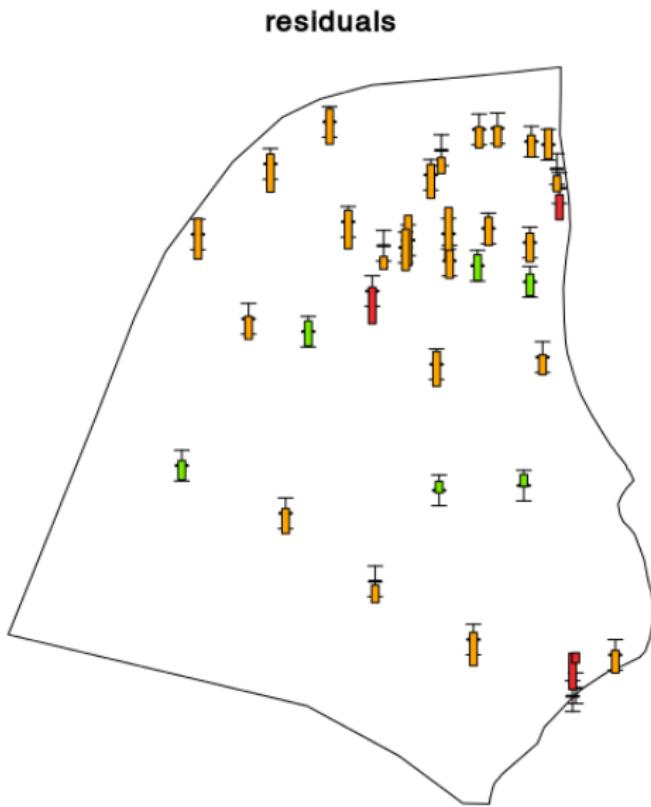
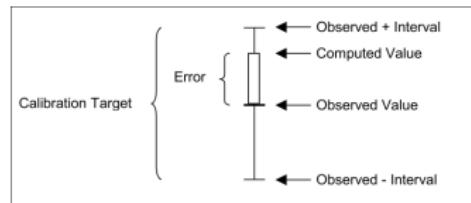
Time series - FEFLOW: Simulated vs observed



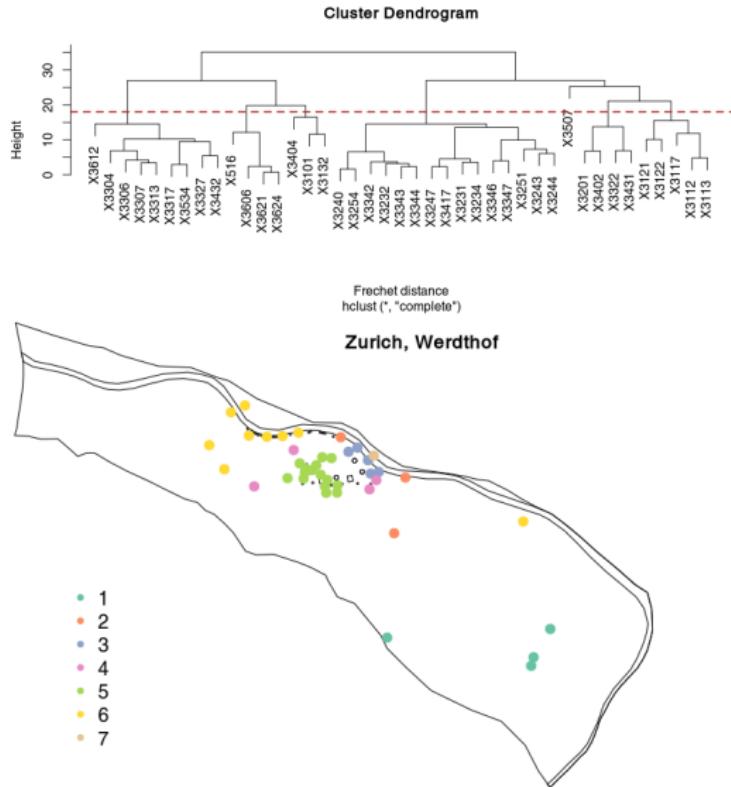
Time series - FEFLOW: Goodness-of-fit



Time series - FEFLOW: Residual visualisation à la GMS



Time series - Clustering



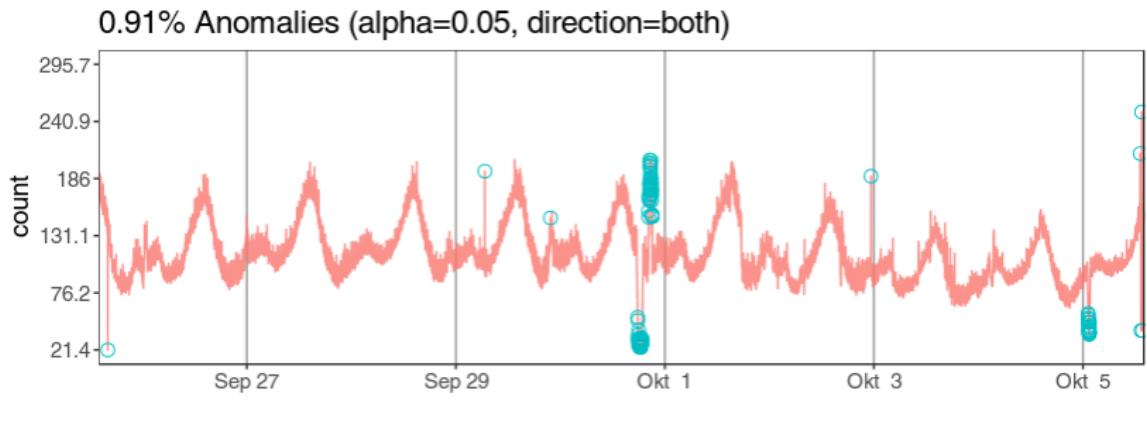
- ▶ remove obs with too many NA's
- ▶ interpolate missing data NA
- ▶ compute distances between obs
- ▶ cut dendrogram → classes
- ▶ plot onto map

CHECK: Time series - mining and clustering

Time series mining and clustering

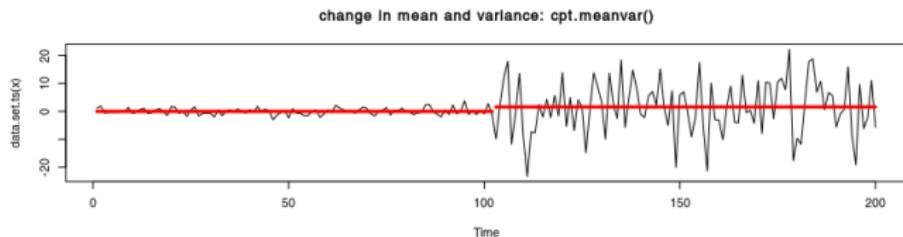
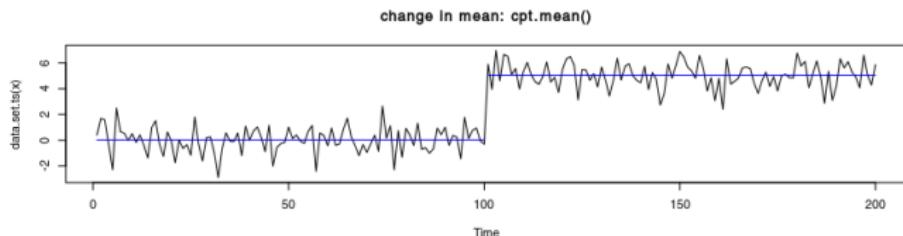
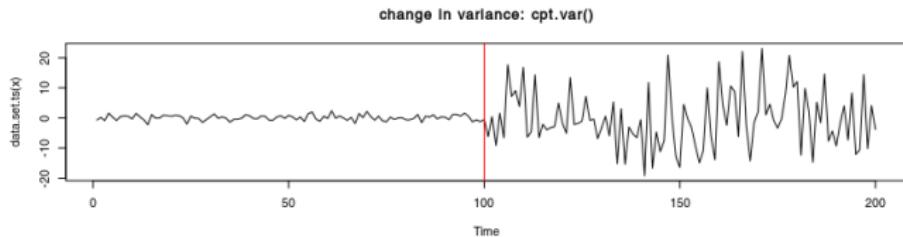
- ▶ Compute distance between time-series
- ▶ Clustering
- ▶ Vizualisation (e.g., MDS)

Time series - Anomaly detection



source

Time series - change detection



changepoint

package

R GIS - resources

R is a **GIS software** (`sp`, `rgeos`, `raster`, `rgdal`) see also `sf` : [chjeck](#)

► Package

- ▶ `sf` package for spatial vector data. Binds to GDAL for reading and writing data, to GEOS for geometrical operations, and to Proj.4 for projection conversions and datum (*will replace sp/rgeos/rgdal in the long term* [link](#))
- ▶ `raster` package for raster, multi-band raster, ...
- ▶ `lidR` for airborne LiDAR data manipulation and visualization for forestry application
- ▶ packages to interact with existing GIS software [link](#)
 - ▶ `spgrass6`: Provides an interface between R and GRASS 6+. Allows for running R from within GRASS as well as running GRASS from within R.
 - ▶ `rgrass7`: Same as `spgrass6`, but for the latest version of GRASS, GRASS 7.
 - ▶ `RPyGeo`: A wrapper for accessing ArcGIS from R. Utilizes intermediate python scripts to fire up ArcGIS. Hasn't been updated in some time.
 - ▶ `RSAGA`: R interface to the command line version of SAGA GIS.

► Cheat sheet

- ▶ nothing...

► Tutorials/book

- ▶ Book: [geocomputation with R](#)
- ▶ [Spatial Data Analysis and Modeling with R](#)

R GIS

ArcToolbox

- ⊕ 3D Analyst Tools
- ⊕ Analysis Tools
- ⊕ Cartography Tools
- ⊕ Conversion Tools
- ⊕ Data Interoperability Tools
- ⊕ Data Management Tools
- ⊕ Editing Tools
- ⊕ Geocoding Tools
- ⊕ Geostatistical Analyst Tools
- ⊕ Linear Referencing Tools
- ⊕ Multidimension Tools
- ⊕ Network Analyst Tools
- ⊕ Parcel Fabric Tools
- ⊕ Schematics Tools
- ⊕ Server Tools
- ⊕ Spatial Analyst Tools
 - ⊕ Conditional
 - ⊕ Density
 - ⊕ Distance
 - ⊕ Extraction
 - ⊕ Generalization
 - ⊕ Groundwater
 - ⊕ Hydrology
 - ⊕ Interpolation
 - ⊕ Local
 - ⊕ Map Algebra
 - ⊕ Math
 - ⊕ Multivariate
 - ⊕ Neighborhood
 - ⊕ Overlay
 - ⊕ Raster Creation
 - ⊕ Reclass
 - ⊕ Solar Radiation
 - ⊕ Surface
 - ⊕ Zonal
- ⊕ Spatial Statistics Tools
- ⊕ Tracking Analyst Tools

Tool

- ▶ manipulation raster
- ▶ manipulation feature
- ▶ raster interpolation:

Still missing

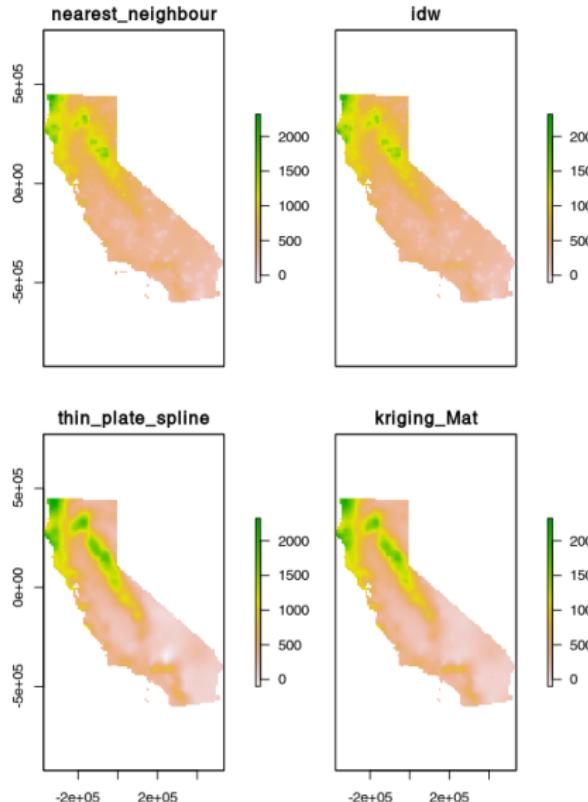
- ▶ TIN
- ▶ watershed but
 - ▶ check [that](#)
 - ▶ check [how to compute flow accumulation](#)
 - ▶ idea: use local structure tensor to compute direction and accumulation. . . .
- ▶ download tiles webgis of Italy region

R GIS - Spatial interpolation

Raster interpolation - check book R_Applied Spatial Data Analysis with R.pdf (chap. 8, 8.11)

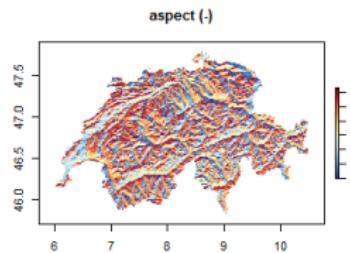
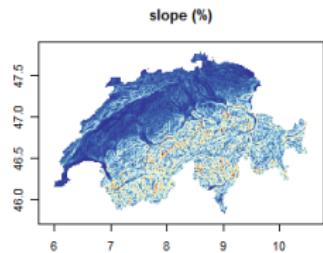
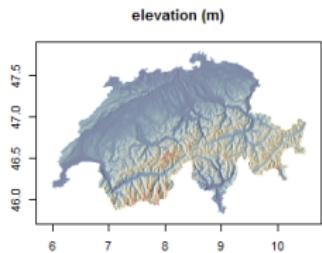
Adapted from [here](#) and [here](#)

California



R GIS - DEM processing

make a 4-4 pictures !!



R GIS - 3D raster visualisation

TODO

R GIS - Feature projection

check graticules sf class

Mercator projection



Lambert Azimuthal Equal Area Projection



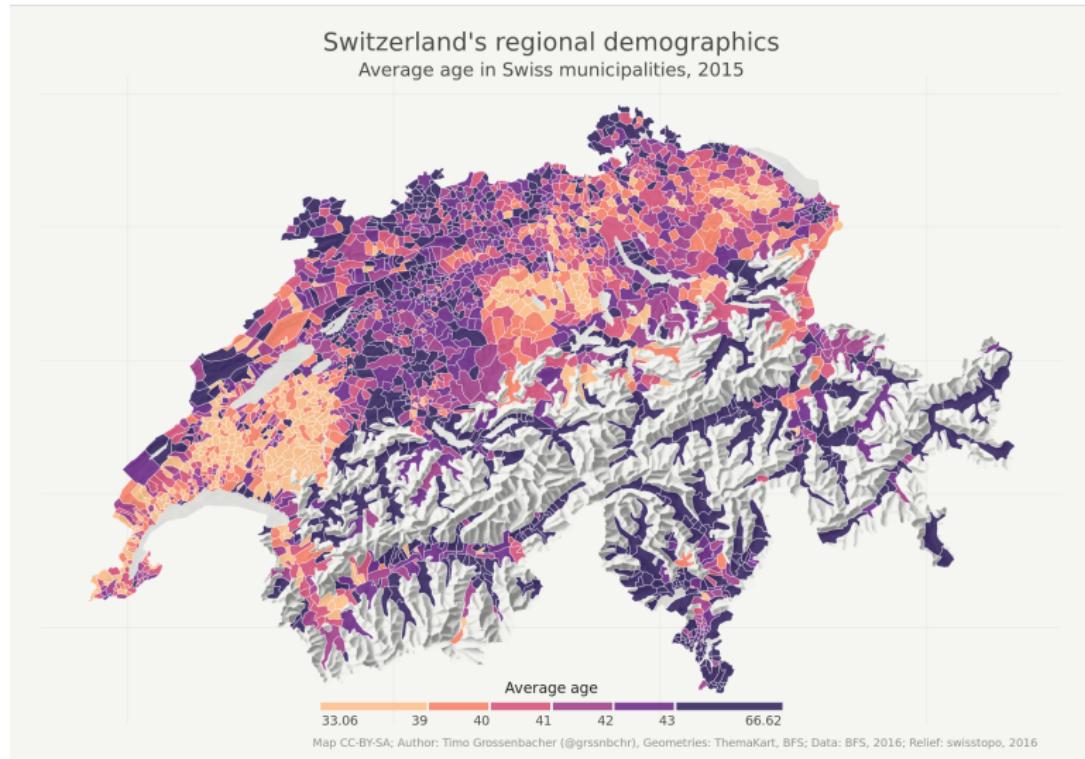
Lambert Conformal Conic Projection



Albers Equal Area Conic



R GIS - Maps (1)



[link](#)

San Francisco Crime (2014)



[link](#)

See also - [ipdw Spatial Interpolation via Inverse Path Distance Weighting](#) - check that

R GIS - LiDAR

R package for airborne LiDAR data manipulation and visualisation for forestry application [lidR](#)

R GIS - making and using bathymetric maps in R with `marmap` pakage

[link](#)

Image analysis and processing - resources

- ▶ **Package**
 - ▶ `imager`
 - ▶ `EBImage`
- ▶ **Tutorials/book**
 - ▶ check `imager` vignettes
 - ▶ `imager` project website
 - ▶ check `EBImage` vignettes

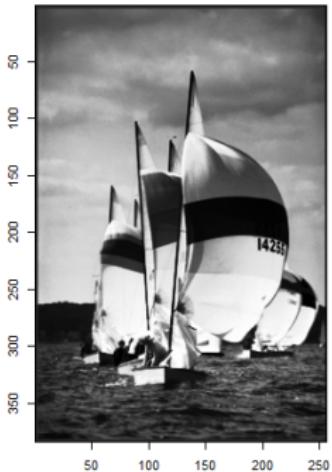
Image analysis and processing

Example: imager package

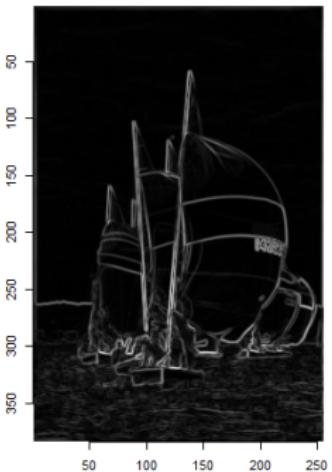
image



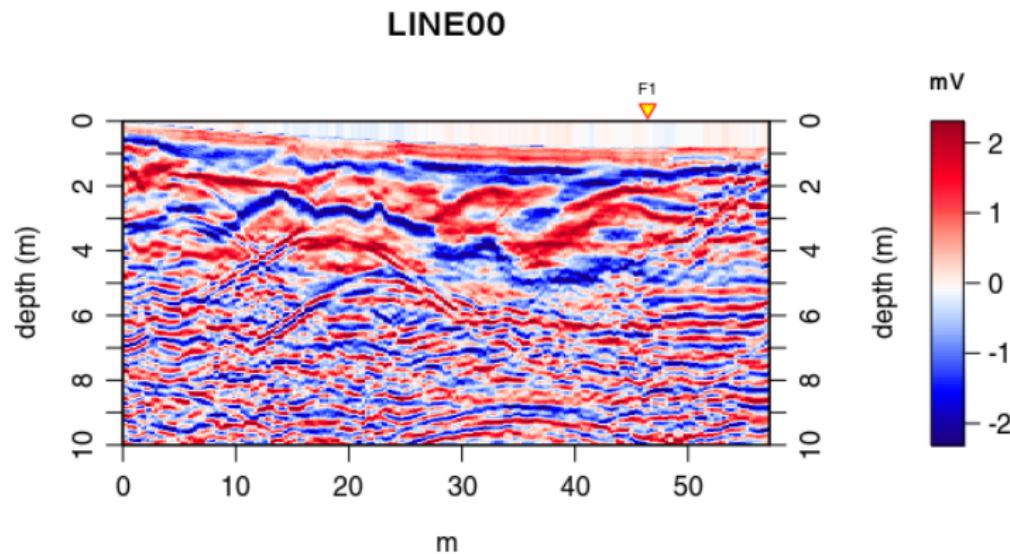
With histogram equalisation



Gradient magnitude



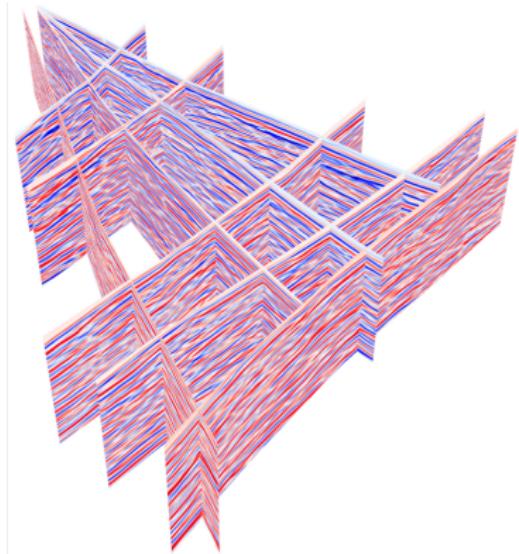
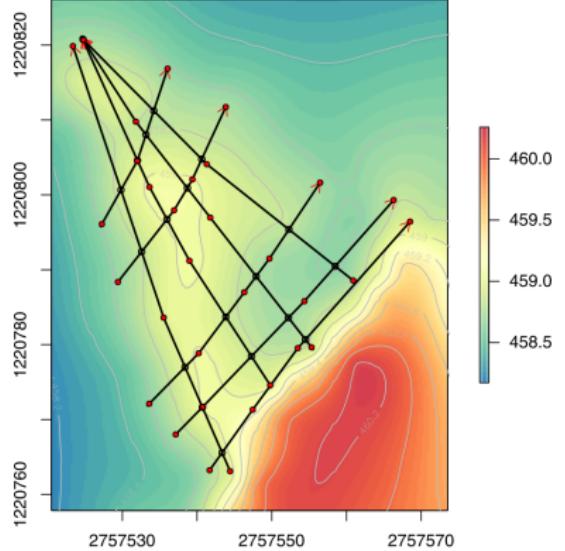
GPR data processing RGPR (1)



RGPR package

online tutorial

GPR data processing RGPR (2)

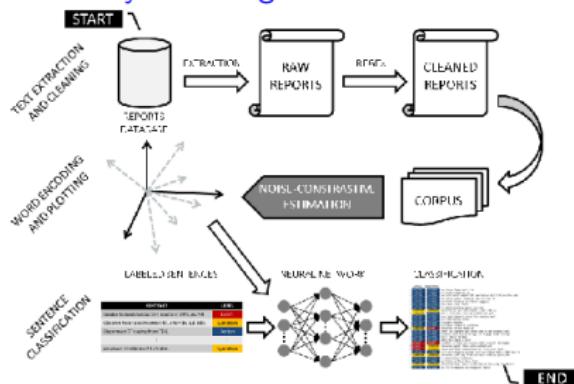


Seismic data

- ▶ seismic data analysis and processing
- ▶ eisis package
- ▶ talk

Database

- ▶ quality control: detect “outliers”, bad quality data, errors
- ▶ statistics, plots, reporting
- ▶ **text analytic meet geosciences**



from arxiv.org/abs/1712.01476

- ▶ Regli et al. (2002) Interpretation of drill core and georadar data of coarse gravel deposits [doi:10.1016/S0022-1694\(01\)00531-5](https://doi.org/10.1016/S0022-1694(01)00531-5)

Misc

- ▶ Package [rioja](#): Functions for the analysis of Quaternary science data, including constrained clustering, WA, WAPLS, IKFA, MLRC and MAT transfer functions, and stratigraphic diagrams.

Modeling/simulations

Statistical/stochastic models

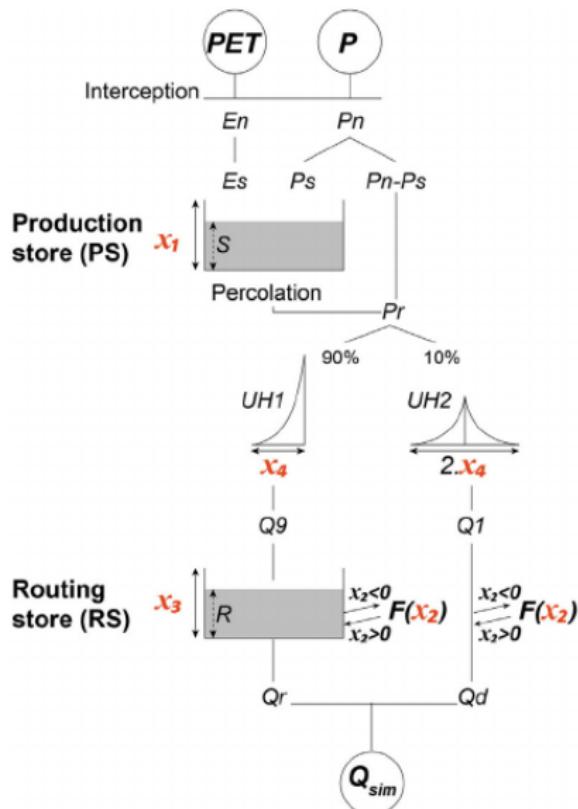
- ▶ probability distribution
- ▶ Gaussian process/Kriging (`RandomFields`): account for correlation
 - ▶ 3D subsurface heterogeneity model
- ▶ point process and marked point process
 - ▶ faults, CBRDM

Catchment flow simulation

- ▶ RRAWFLOW: Rainfall-Response Aquifer and Watershed Flow Model
- ▶ topmodel and dynatopmodel packages

Catchment flow simulation (1)

Package **airGR**, see tutorial on [companion website](#)



Simulation variables

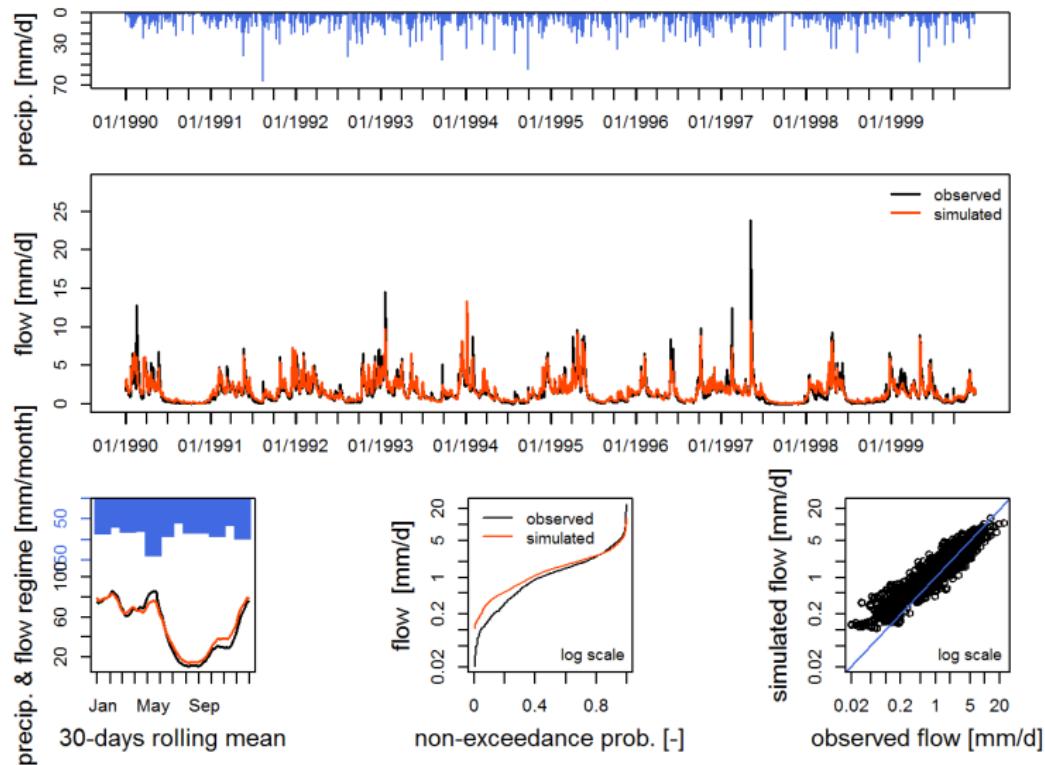
- P : Precipitation
- PET : Potential evapotranspiration
- En : Net evapotranspiration capacity
- Pn : Net precipitation
- Es : Evaporation from the production store
- Ps : Water filling the production store
- S : Level in the production store
- Pr : Water filling the routing store
- $UH1$: Unit hydrograph 1
- $UH2$: Unit hydrograph 2
- $Q9$: Output of $UH1$
- R : Level in the routing store
- $Q1$: Output of $UH2$
- Qr : Outflow of the routing store
- F : Groundwater exchange term
- Qd : Flow component from $Q1$ and F
- Q_{sim} : Total simulated streamflow

Calibration parameters

- x_1 : maximum capacity of the PS (mm)
- x_2 : groundwater exchange coefficient (mm)
- x_3 : maximum capacity of the RS (mm)
- x_4 : time base of unit hydrograph UH1 (d)

Catchment flow simulation (2)

Package `airGR`, see [companion website](#)

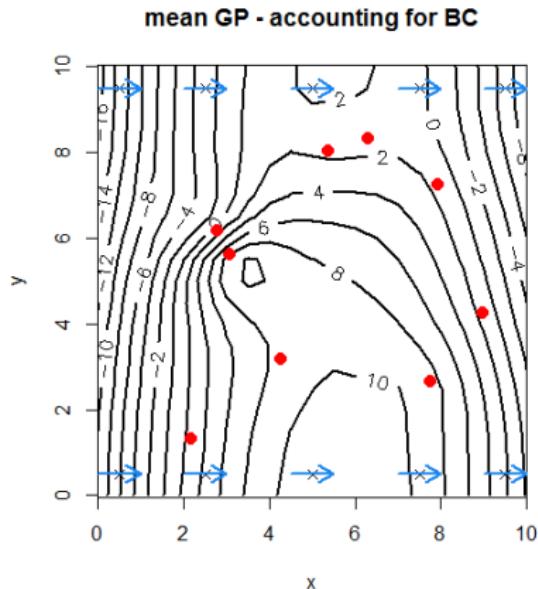
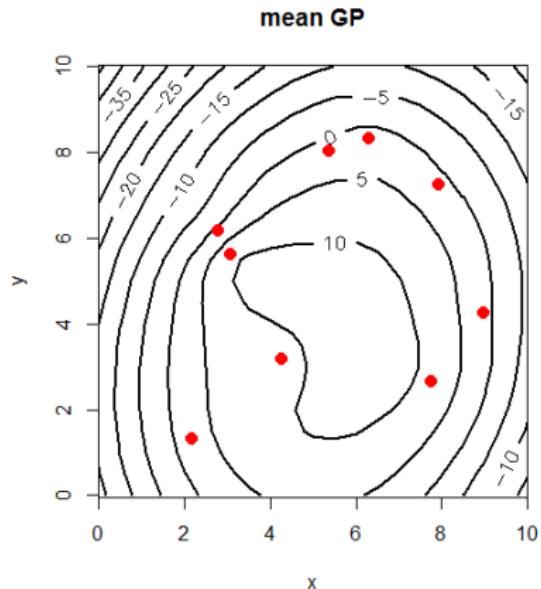


physically based lumped model

simulate groundwater fluctuations in response to precipitation and pumping: package
`ambhasGW` Sekhar et al. (2017)

Groundwater head interpolation

package GauProMod: Gaussian process (Kriging) with constraints on boundaries



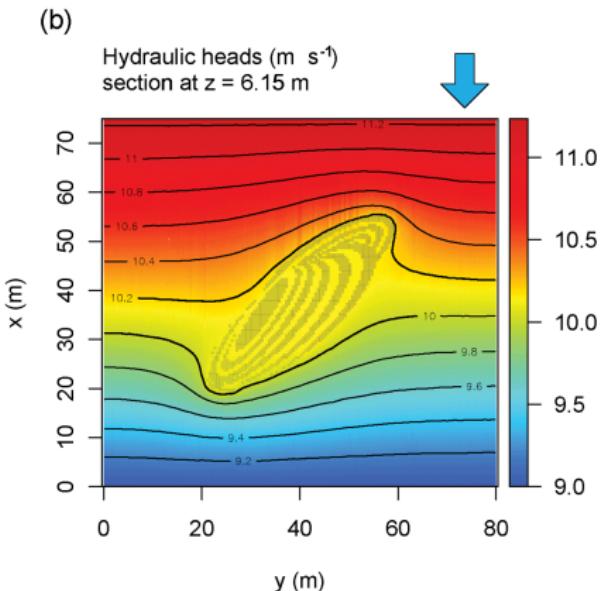
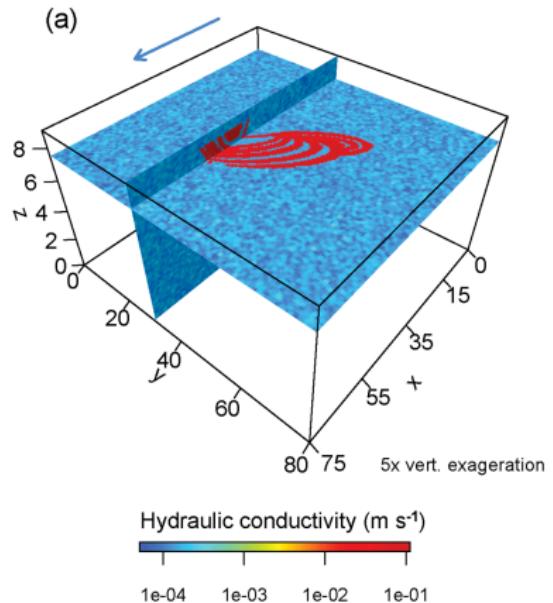
After [Kuhlman and Igusquiza \(2010\)](#)

Modflow - US-GS reproducible report

github.com/USGS-R/wrv

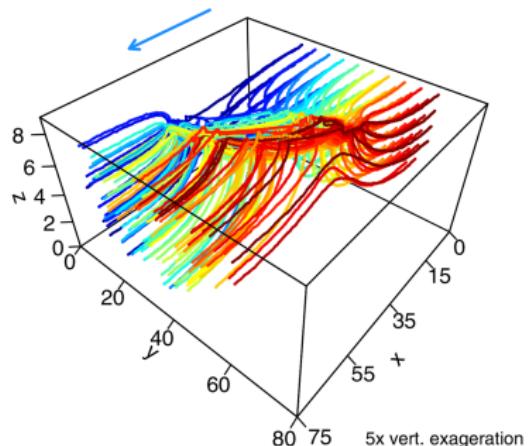
Modflow - subsurface flow mixing (1)

personal code based github.com/USGS-R/wrv

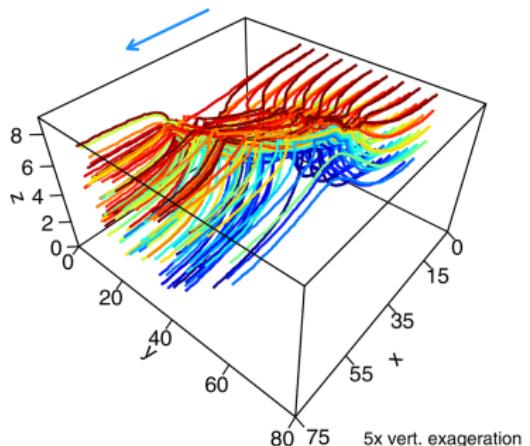


Modflow - subsurface flow mixing (2)

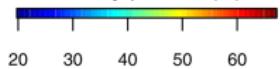
(a) Particles coloured by their inflow y-position (m)



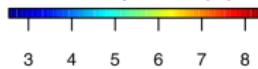
(b) Particles coloured by their inflow z-position (m)



Inflow y-position (m)

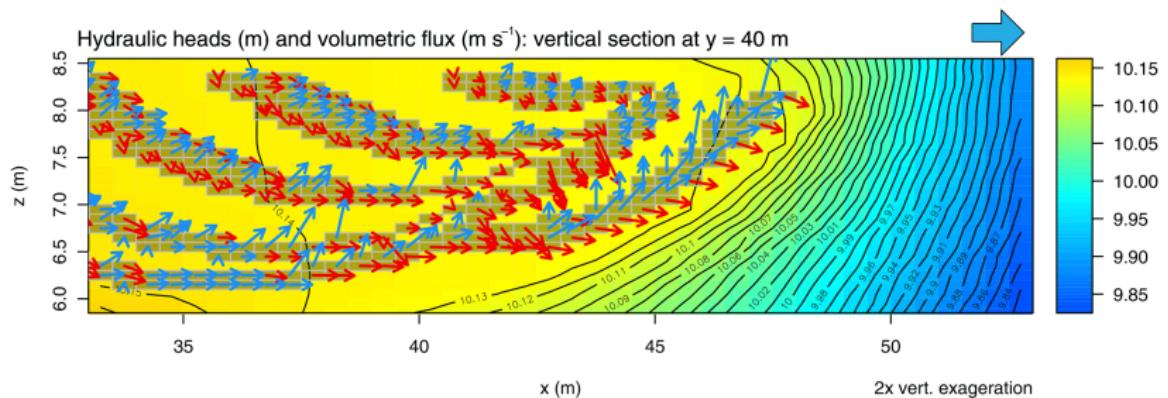


Inflow z-position (m)



5x vert. exaggeration

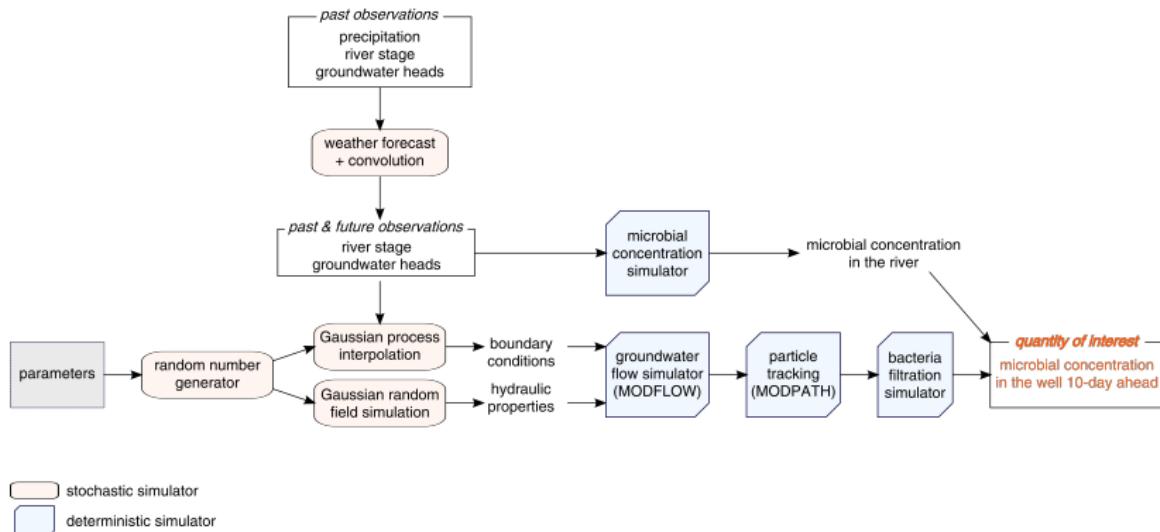
Modflow - subsurface flow mixing (3)



Modflow -stochastic simulation (1)

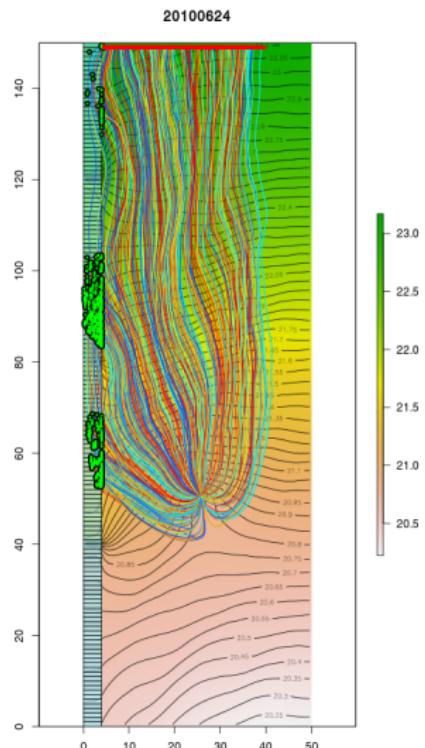
(gwModBac personal code based on github.com/USGS-R/wrv Groundwater flow simulation and particle tracking to forecast microbial concentration in a drinking water extraction well.

Workflow

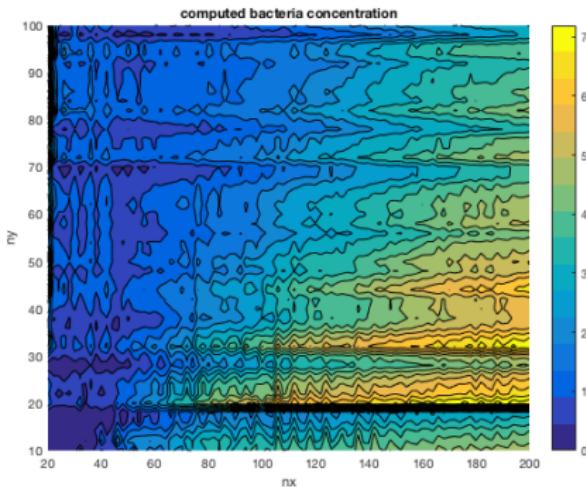


Modflow -stochastic simulation (2)

Bacteria pathways



Bacteria concentration as a function of grid size



Other applications:

- ▶ uncertainty quantification (MCMC)
- ▶ sensitivity analysis
- ▶ teaching

OpenFOAM - Stochastic simulation

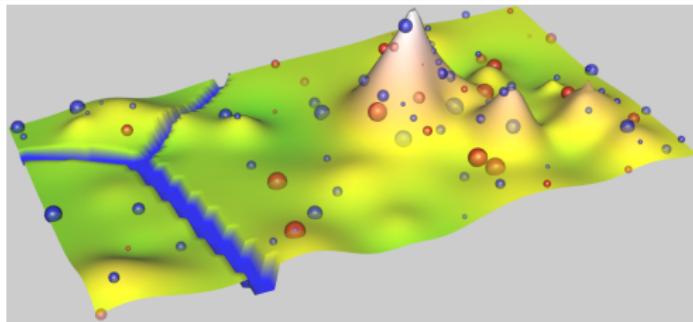
Reporting

publication-quality figures (see also package `ggplot2`)

See R-graph gallery

- ▶ `ggplot` and `ggplot2` and theirs cousins
- ▶ or base `graphics`, `plot3D`
- ▶ 2D plots
- ▶ 2D interactive plots
- ▶ 3D interactive plots with `rgl` (based on OpenGL)

```
library(rgl)
demo(abundance)
```



Export

- ▶ `png`, `jpeg`, `gif`
- ▶ `pdf`
- ▶ `svg`
- ▶ `html` (3D)
- ▶ `latex` (?)

Report, presentation, book

[bookdown](#) - Report/presentation/book: HTML/PDF (packages RMarkdown and knitr)

Web applications

- ▶ interactive web apps (package shiny)

R package

- ▶ combine several codes in a package
- ▶ include data in the package

Interactive R teaching modules

- ▶ R can create interactive teaching modules: You can do it in the console with `swirl` or on the web with Datamind.

Tools

RStudio

- ▶ code, figures (export), help, etc.
- ▶ package creation and development
- ▶ report (R markdown)

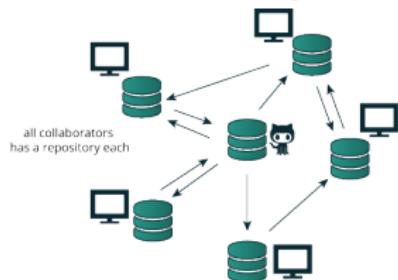


git

a free and open source distributed version control system

github

a web-based hosting service for version control using git



Github public/private repository:

- ▶ host code with version control
- ▶ several branches (develop)
- ▶ wiki
- ▶ project board (task management)
- ▶ host project website

Reproducible research

from Karl Broman

0. Separate the raw data from everything (and don't modify them)
1. Organize your data & code
2. Everything with a script
3. Automate the process (GNU Make)
4. Turn scripts into reproducible reports
5. Turn repeated code into functions
6. Create a package/module
7. Use version control (git/GitHub), no more "really_true_final_2EH5b.doc"
8. Pick a license, any license

What's next?