





# Ensemble Lake Modelling with *LakeEnsemblR*

brought to you by AEMON-J

Tadhg Moore<sup>1</sup>, Jorrit Mesman<sup>2,3</sup>, Johannes Feldbauer<sup>4</sup> & Robert Ladwig<sup>5</sup>

<sup>1</sup>Virginia Tech, <sup>2</sup>Univ. of Geneva, <sup>3</sup>Uppsala Univ., <sup>4</sup>TU Dresden, <sup>5</sup>UW-Madison



#### Who's who?



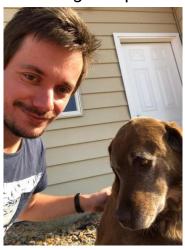
Jorrit package mastermind



Hannes coding genius



Robert living compiler



Tadhg fearless leader

#### Welcome!

- If you want to run the simulations during the workshop, you will need to install the following software on your computer. If you just want to watch, ask questions, and drive from the back seat, that's fine, too!
- Questions? Ask in the Zoom chat, raise your hand in Zoom, or join our Slack channel

#### Two paths to the workshop examples:

- (1) Clone or download files from:
  - https://github.com/gsagleon/G21.5\_GSA\_workshop/tree/master/LakeEnsemblR
    - (a) you'll need R (>= 3.5) and certain packages (instructions are online in the README)
- (2) Get the container: <a href="https://hub.docker.com/r/hydrobert/lakeensemblr-rocker">https://hub.docker.com/r/hydrobert/lakeensemblr-rocker</a> (requires docker)
  - (a) this includes Rocker, all packages, all scripts and all data:
    - docker run --rm -d -p 8000:8000 -e ROOT=TRUE -e PASSWORD=password hydrobert/lakeensemblr-rocker:latest open any web browser and type 'localhost:8000' (user: rstudio, password: password)

# Time schedule today

9:30-9:50	Introduction to LakeEnsemblR	<ul><li>Why use ensembles?</li><li>What is LakeEnsemblR?</li></ul>
9:55-11:10	Using LakeEnsemblR	<ul> <li>Standardisation of input data</li> <li>Functions</li> <li>Visualising output &amp; calibration</li> <li>Apply it to YOUR lake! (or on OUR examples)</li> </ul>
11:15-11:30	Future plans LakeEnsemblR	<ul> <li>Adding more models</li> <li>Creating a static WQ model</li> <li>Potential applications</li> </ul>

### The current state in lake modeling

lots of different 1D hydrodynamic lake models

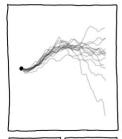






- (some) require compilation and additional instructions before running
- people chose the model that lab/supervisor is using
- ensemble modeling is state-of-the-art → quantifies uncertainty & identifies shortcomings

IN AN *ENSEMBLE MODEL*, FORECASTERS RUN MANY DIFFERENT VERSIONS OF A WEATHER MODEL WITH SLIGHTLY DIFFERENT INITIAL CONDITIONS. THIS HELPS ACCOUNT FOR UNCERTAINTY AND SHOWS FORECASTERS A SPREAD OF POSSIBLE OUTCOMES.



#### MEMBERS IN A TYPICAL ENSEMBLE:

- A UNIVERSE WHERE...
  ...RAIN 15 0.5% MORE LIKELY IN SOME AREAS
- ... WIND SPEEDS ARE SLIGHTLY LOWER
- ... PRESSURE LEVELS ARE RANDOMLY TWEAKED
- ...DOGG RUN SLIGHTLY FASTER
- ... THERE'S ONE EXTRA CLOUD IN THE BAHAMAS
- ...GERMANY WON WWII
- ... SNAKES ARE WIDE INSTEAD OF LONG
- ...WILL SMITH TOOK THE LEAD IN THE MATRIX
  INSTEAD OF WILD WILD WEST
- ... SWIMMING POOLS ARE CARBONATED
- ...SLICED BREAD, AFTER BEING BANNED IN JANUARY 1943, WAS NEVER RE-LEGALIZED

Received: 16 December 2019 Revised: 24 February 2020 Accepted: 3 March 2020

OVERVIEW



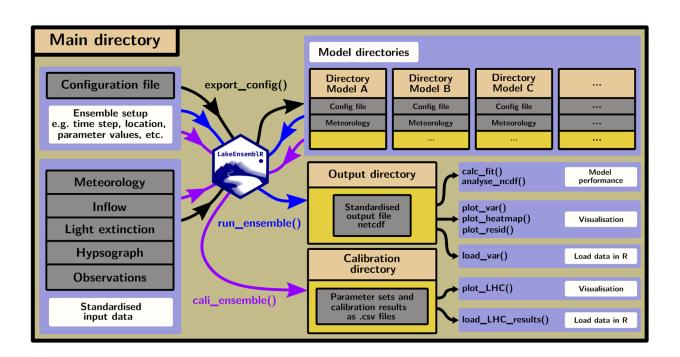
#### Ensemble flood forecasting: Current status and future opportunities

Wenyan Wu<sup>1</sup> ○ | Rebecca Emerton<sup>2</sup> | Qingyun Duan<sup>3</sup> | Andrew W. Wood<sup>4</sup> | Fredrik Wetterhall<sup>5</sup> | David E. Robertson<sup>6</sup>

comic from xkcd.com; Wu et al. 2019

#### LakeEnsemblR

- open-source and open access R package (GNU 2.0 license)
- models: R-packages that contain executables for macOS, Windows & Linux
- standardized workflow



#### LakeEnsemblR

Models:







SIMSTRAT

**MyLake** 

Two-layer representation

Numerical weather predictions 1D energy balance approach

Ecosystem modeling

1D k-ε
turbulence
model
Lake
turbulence
studies

1D k-ɛ turbulence model Lake turbulence studies

1D heat equation

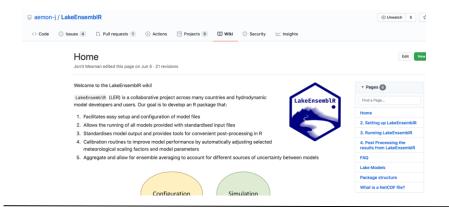
Ecosystem modeling

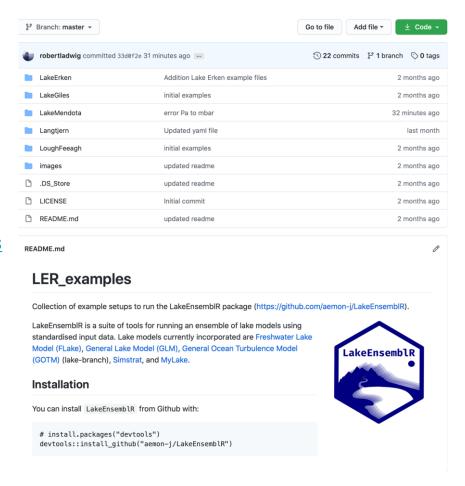
- Calibration:
  - Latin Hypercube Sampling
  - Markov-Chain Monte Carlo
  - Different algorithms for constrained optimization using the FME package

FME: Soetaert & Petzoldt 2010

# LakeEnsemblR: support

- walk-through: vignette in R and wiki <u>https://github.com/aemon-</u>
   j/LakeEnsemblR/wiki
- example configuration files:<a href="https://github.com/aemon-j/LER\_examples">https://github.com/aemon-j/LER\_examples</a>





# Funding

- J.F. was funded by the European Social Fund and co-financed by tax funds based on the budget approved by the members of the Saxon State Parliament.
- T.N.M. was funded by: the WATEXR project which is part of ERA4CS, an ERA-NET initiated by JPI Climate, and funded by MINECO (ES), FORMAS (SE), BMBF (DE), EPA (IE), RCN (NO), and IFD (DK), with co-funding by the European Union (Grant number: 690462) and also by NSF grants DEB-1926050 and DBI-1933016.
- J.P.M. was funded by the European Union's Horizon 2020 Research and Innovation Programme under the Marie Skłodowska-Curie grant agreement no. 722518 (MANTEL ITN).
- R.L. was funded through a National Science Foundation ABI development grant (#DBI 1759865).









This project has received funding from the European Union's Horizon 2020 research and innovation programme under the Marie Skłodowska-Curie grant agreement No 722518.



## Time for the workshop

#### Workshop materials:

- Clone or download files from:

https://github.com/gsagleon/G21.5\_GSA\_workshop/tree/master/LakeEnsemblR

- you'll need R (>= 3.5) and certain packages (instructions are online in the README)
- Get the docker here: <a href="https://hub.docker.com/r/hydrobert/lakeensemblr-rocker">https://hub.docker.com/r/hydrobert/lakeensemblr-rocker</a> (requires docker)
  - this includes Rocker, all packages, all scripts and all data, just do

docker run --rm -d -p 8000:8000 -e ROOT=TRUE -e PASSWORD=password hydrobert/lakeensemblr-rocker:latest open any web browser and type 'localhost:8000' (user: rstudio, password: password)

- Four files (pdf, html, Rmd, R)
  - You only need one of them; pick what you prefer



# Try it out!



## LakeEnsemblR: planned features for 2021

additional models (implementation already in progress):

- air2water
- ALBM

- LakeEnsemblR water quality
  - → working group meeting at this GLEON conference!
    - one-way coupling of WQ model to LER output
    - quantify effect of hydrodynamic differences on aquatic ecosystem response



```
require(devtools)
devtools::install_github("GLEON/rLakeAnalyzer")
devtools::install_github("USGS-R/glmtools", ref = "ggplot_overhaul")
devtools::install_github("GLEON/GLM3r", ref = "GLMv.3.1.0a3")
devtools::install_github("aemon-j/FLakeR", ref = "inflow")
devtools::install_github("aemon-j/GOTMr")
devtools::install_github("aemon-j/gotmtools")
devtools::install_github("aemon-j/SimstratR")
devtools::install_github("aemon-j/MyLakeR")
```

Questions, issues, problems & feedback?

Join the official AEMON-J slack



Thanks for joining!

**LakeEnsemblR team**: F. Olsson, R. Pilla, T. Shatwell, J. Venkiteswaran, A. Delany, H. Dugan, K. Rose & J. Read

