R package LakeEnsemblR: Basic Use and Sample Applications

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1 Included models

LakeEnsemblR currently includes the following models: GLM (Hipsey et al. (2019)), FLake (Mironov et al. (2010)), GOTM (Burchard et al. (2006)), Simstrat (Goudsmit et al. (2002)), and MyLake (Saloranta and Andersen (2007)).

2 Setting up LakeEnsemblR

2.1 Introduction

A key part of developing LakeEnsemblR was to develop a standardised format for model input data. This involved standard variable naming which includes units.

2.2 DateTime formatting

This package uses international standard format for date and time (ISO 8601), which is YYYY-mm-dd HH:MM:SS. For example: 2020-04-03 09:00:00.

2.3 Time Zones

Currently this is not accounted for so the timezone used in input is the timezone of output data. It is on the list of things to do.

2.4 Hypsograph data

The data needs to be a comma separated values (.csv) file where 0m is the surface and all depths are reported as positive. Area needs to be in meters squared. The column names *must* be Depth_meter and Area_meterSquared

Example of data:

```
Depth_meter,Area_meterSquared
0,3931000
1,3688025
2,3445050
3,3336093.492
4,3225992.455
5,3133491.11
6,3029720
```

2.5 Temperature Profile data

The data needs to be a comma separated values (.csv) file where the datetime column is in the format YYYY-mm-dd HH:MM:SS. Depths are positive and relative to the water surface. Water temperature is in degrees Celsius. The column names *must* be datetime, Depth_meter and Water_Temperature_celsius

Example of data:

```
datetime, Depth_meter, Water_Temperature_celsius 2004-01-05 00:00:00,0.9,6.97 2004-01-05 00:00:00,2.5,6.71 2004-01-05 00:00:00,5,6.73 2004-01-05 00:00:00,8,6.76 ...
```

2.6 Meteorological data

The data needs to be a comma separated values (.csv) file where the datetime column is in the format YYYY-mm-dd HH:MM:SS. See table 1 for the list of variables, units and column names.

Table 1. Description of meteorological variables used within LakeEnsemblR with units and required column names.

Description	Units Column Name	Status
Downwelling	W/m2Longwave_Radiation	
longwave		temperature, cloud cover and relative humidity/dewpoint
radaiation		temperature
Downwelling	W/m2Shortwave_Radiation	n_ Hoqwired lling_wattPerMeterSquared
shortwave		
radaiation		

Description	Units	s Column Name Status
Cloud cover	-	Cloud_Cover_decimalfraotioprovided, it is calculated internally from air temperature, short-wave radiation, latitude, longitude, elevation and relative humidity/dewpoint temperature
Air temperature	$^{\circ}\mathrm{C}$	Air_Temperature_celsRequired
Relative humidity	%	Relative_Humidity_p&facent provided, it is calculated internally from air temperature and dewpoint temperature
Dewpoint temperature	$^{\circ}\mathrm{C}$	Dewpoint_Temperaturle next spins vided, it is calculated internally from air temperature and relative humidity
Wind speed at 10m	m/s	$\underline{\mathrm{Ten_Meter_Elevation}}\underline{\mathrm{E}}\underline{\mathrm{M}}\underline{\mathrm{iend}}\underline{\mathrm{w}}\underline{\mathrm{Specsp}}\underline{\mathrm{e}}\underline{\mathrm{e}}\underline{\mathrm{r}}\underline{\mathrm{e}}\underline{\mathrm{e}}\underline{\mathrm{r}}\underline{\mathrm{F}}\underline{\mathrm{d}}\underline{\mathrm{c}}\underline{\mathrm{w}}\underline{\mathrm{w}}\underline{\mathrm{e}}\underline{\mathrm{c}}\underline{\mathrm{t}}\underline{\mathrm{r}}\underline{\mathrm{s}}\underline{\mathrm{d}}\underline{\mathrm{c}}\underline{\mathrm{w}}\underline{\mathrm{w}}\underline{\mathrm{e}}\underline{\mathrm{c}}\underline{\mathrm{t}}\underline{\mathrm{r}}\underline{\mathrm{s}}\underline{\mathrm{d}}\underline{\mathrm{c}}\underline{\mathrm{w}}\underline{\mathrm{w}}\underline{\mathrm{e}}\underline{\mathrm{c}}\underline{\mathrm{t}}\underline{\mathrm{r}}\underline{\mathrm{s}}\underline{\mathrm{d}}\underline{\mathrm{c}}\underline{\mathrm{w}}\underline{\mathrm{w}}\underline{\mathrm{e}}\underline{\mathrm{c}}\underline{\mathrm{r}}\underline{\mathrm{s}}\underline{\mathrm{d}}\underline{\mathrm{c}}\underline{\mathrm{w}}\underline{\mathrm{w}}\underline{\mathrm{e}}\underline{\mathrm{c}}\underline{\mathrm{v}}\underline{\mathrm{e}}\underline{\mathrm{r}}\underline{\mathrm{e}}\underline{\mathrm{e}}\underline{\mathrm{e}}\underline{\mathrm{e}}\underline{\mathrm{w}}\underline{\mathrm{e}}}\underline{\mathrm{e}}\underline$
Wind direction at 10m	$^{\circ}\mathrm{C}$	$\label{thm:continuity} Ten_Meter_Elevation \underline{NW} in \emph{chull} in $
Wind u-vector at 10m	m/s	Ten_Meter_Uwind_v&cittdner_naetralRepreselvourdu and v vectors is required
Wind v-vector at 10m	m/s	Ten_Meter_Vwind_v&citchernweitedRepresedomdu and v vectors is required
Precipitation	m/s	Precipitation_meterPeNSutcentrulctly required but is important for mass budgets in some models
Rainfall	m/s	Rainfall_meterPerSecdnequired
Snowfall	m/da	ay Snowfall_meterPerDay If not provided, it is calculated internally from rain when air temperature $<0~{\rm degC}$
Sea level pressure	Pa	Sea_Level_BarometricNottresquiredpascal
Surface level pressure	Pa	Surface_Level_BaromRuninlerlessure_pascal
Vapour pressure	mbar	Vapor_Pressure_milli B anot provided, it is calculated internally from air temperature and relative humidity/dewpoint temperature

2.7 LakeEnsemblR YAML configuration file

There is an example yaml configuration provided in the example dataset in the package or you can download a copy from GitHub here.

You will need to update each of the required variables in the location block to reflect your own site.

location:

```
name: Feeagh  # station name used in output [default=GOTM site]
latitude: 53.9  # latitude [degrees North; min=-90.0; max=90.0; default
longitude: -9.5  # longitude [degrees East; min=-360.0; max=360.0; defau
elevation: 15  # elevation of lake surface above sea level [m]
depth: 46.8  # maximum water depth [m; min=0.0; default=100.0]
hypsograph: LakeEnsemblR_bathymetry_standard.csv  # hypsograph [default=]
init_depth: 46.8  # initial height of lake surface relative to the bottom
```

Then input the filepaths to the bathymetry, meteorlogical and water temperature profile observations file. For first time users we would recommend to set up a folder with just these three files plus the LakeEnsemblR yaml configuration file.

Now you should be ready to run LakeEnsemblR on your site.

3 Running LakeEnsemblR

Once you have your hypsograph, water temperature observations and meteorological files prepared tunning LakeEnsemblR is relatively straightforward.

3.1 Example model run

```
# Install packages - Ensure all packages are up to date - parallel development ongoing
#install.packages('devtools')
devtools::install_github('GLEON/GLM3r')
devtools::install_github('USGS-R/glmtools', ref = 'ggplot_overhaul')
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/LakeEnsemblR')
devtools::install_github('aemon-j/MyLakeR')
# Load libraries
library(gotmtools)
library(LakeEnsemblR)
# Set working directory
setwd('example') # Change working directory to example folder
# Set models & config file
model <- c('GLM', 'FLake', 'GOTM', 'Simstrat', 'MyLake')</pre>
config_file <- 'Feeagh_master_config.yaml'</pre>
# 1. Example - creates directories with all model setup
export_config(config_file = config_file, model = model, folder = '.')
# 2. Create meteo driver files
export_meteo(config_file = config_file, model = model)
# 3. Create initial conditions
start_date <- get_yaml_value(file = config_file, label = "time", key = "start")
export_init_cond(config_file = config_file,
                 model = model,
                 date = start_date,
                 print = TRUE)
# 4. Run ensemble lake models
wtemp_list <- run_ensemble(config_file = config_file,</pre>
                           model = c('FLake', 'GLM', 'GOTM', 'Simstrat', 'MyLake'),
                           return_list = TRUE)
```

3.2 Post-processing

```
# Load libraries for post-processing
library(ggpubr)
library(ggplot2)
## Plot model output using gotmtools/ggplot2
# Extract names of all the variables in netCDF
ens_out <- 'output/ensemble_output.nc'</pre>
vars <- gotmtools::list_vars(ens_out)</pre>
vars # Print variables
plist <- list() # Initialize empty list for storing plots of each variable
for(i in 1:5){
 p1 <- gotmtools::plot_vari(ncdf = ens_out,</pre>
                             var = vars[i],
                             incl_time = FALSE,
                             limits = c(0,25),
                             zlab = 'degC')
  p1 <- p1 + scale_y_reverse() + #Reverse y-axis
    coord_cartesian(ylim = c(45,0))+ # ggplot2 v3.3 is sensitive to order of ylim
    ggtitle(vars[i]) + # Add title using variable name
    xlab('')+ # Remove x-label
    theme_bw(base_size = 18) # Increase font size of plots
  plist[[i]] <- p1
# Plot all model simulations
# install.packages('ggpubr')
g1 <- ggpubr::ggarrange(plotlist = plist, ncol = 1, common.legend = TRUE, legend = 'right')
ggsave('output/model_ensemble_watertemp.png', g1, dpi = 300, width = 384, height = 300, units = 'mm')
```

References

Burchard, Hans, Karsten Bolding, Wilfried Kühn, Andreas Meister, Thomas Neumann, and Lars Umlauf. 2006. "Description of a Flexible and Extendable Physical–Biogeochemical Model System for the Water Column." *Journal of Marine Systems*, Workshop on Future Directions in Modelling Physical-Biological Interactions (WKFDPBI), 61 (3): 180–211. https://doi.org/10.1016/j.jmarsys.2005.04.011.

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Mironov, Dmitrii, Erdmann Heise, Ekaterina Kourzeneva, Bodo Ritter, Natalia Schneider, and Arkady Terzhevik. 2010. "Implementation of the Lake Parameterisation Scheme FLake into the Numerical Weather Prediction Model COSMO" 15: 13. https://helda.helsinki.fi/handle/10138/233087.

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