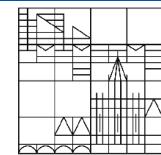




## Combining a weather generator and a one-dimensional lake model to simulate climate change effects on a deep lake

Marieke Frassl, Dirk Schlabing, Magdalena Eder, Karl-Otto Rothhaupt, Bertram Boehrer, Karsten Rinke

Universität  
Konstanz



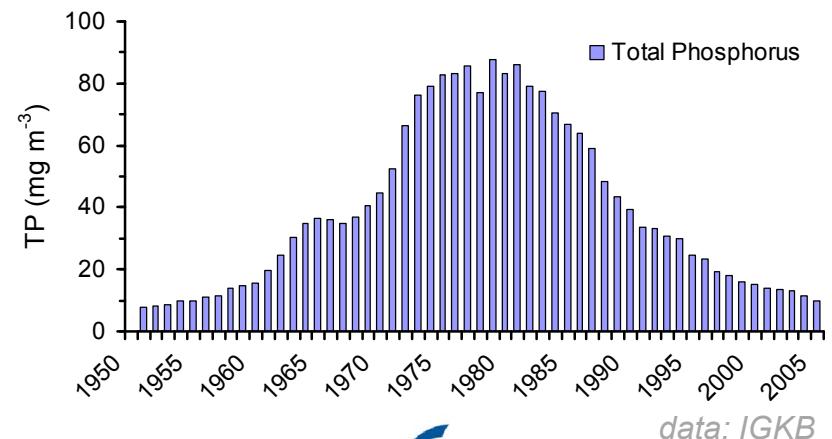
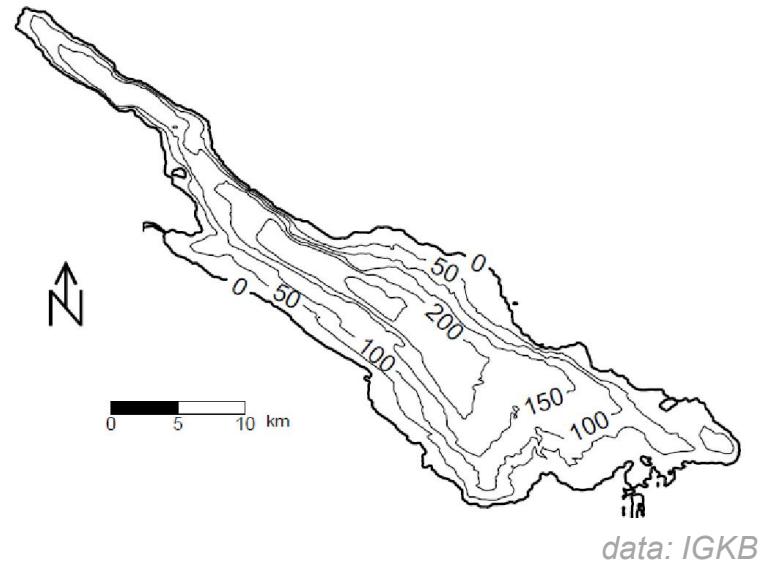
University of Stuttgart  
Germany



HELMHOLTZ  
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RESEARCH - UFZ

# Lake Constance

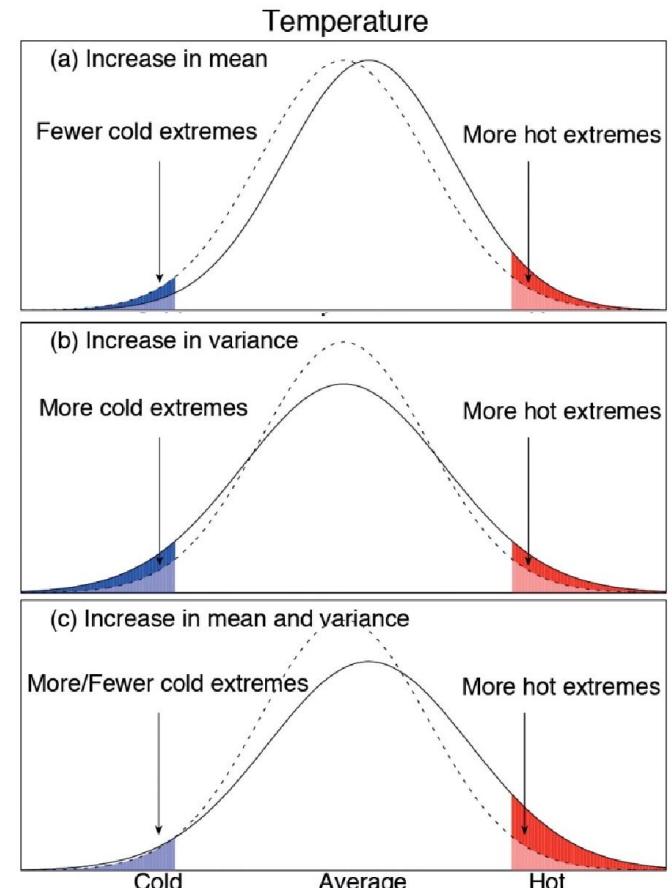
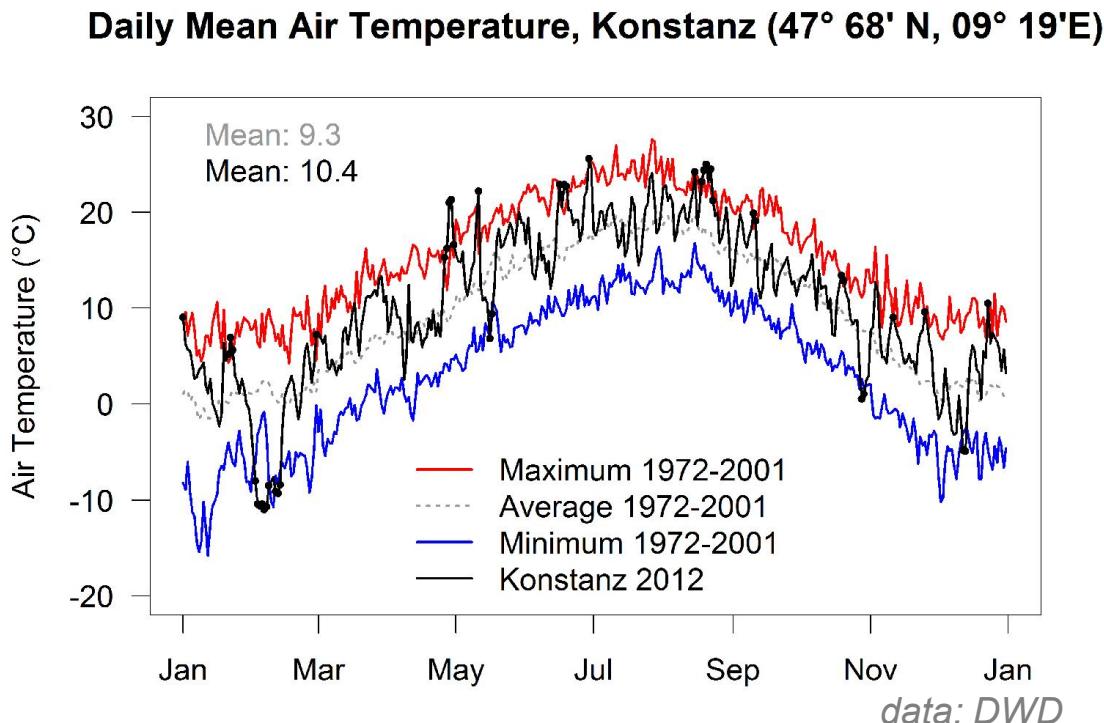
- mixing type: warm monomictic
- maximum depth: 251 m
- average depth: 100 m
- surface area: 473 km<sup>2</sup>
- residence time: 5 yr
- phosphorus concentration: < 10 µg/L
- drinking water reservoir for ca. 4 Mio people (125 Mio m<sup>3</sup>/yr)



# Climate change in deep lakes

- increase in thermal stability ( $\Delta T_{\text{epi}} > \Delta T_{\text{hyp}}$ );  
*Livingstone, 2003, Climatic Change*
- earlier onset of the phytoplankton spring bloom;  
*Winder and Schindler, 2004, GCB*
- correlation between phytoplankton spring bloom  
and stratification onset;  
Ocean: *Sverdrup, 1952*  
Lake Constance: *Ollinger and Bäuerle, 1998;*  
*Peeters et al., 2007*

# Meteorological variability

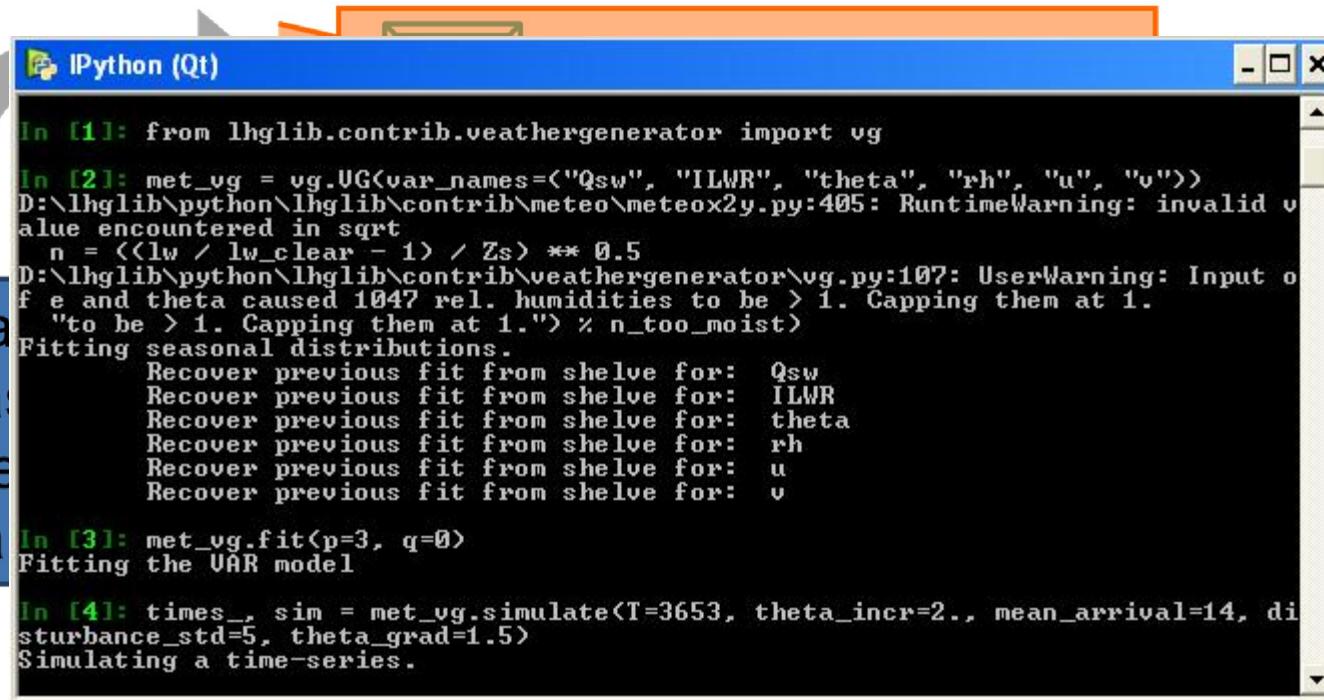


IPCC 2013

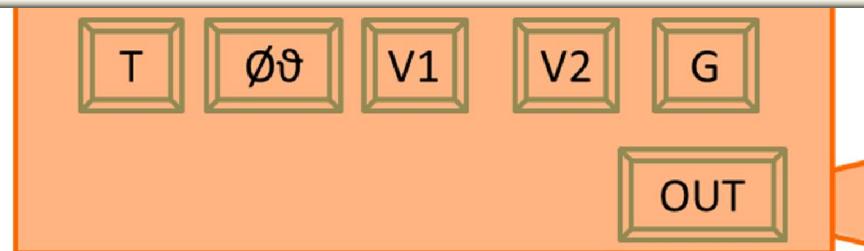
# Vector-autoregressive weather Generator VG

Data  
meas.  
mete  
data

Climate  
scenario

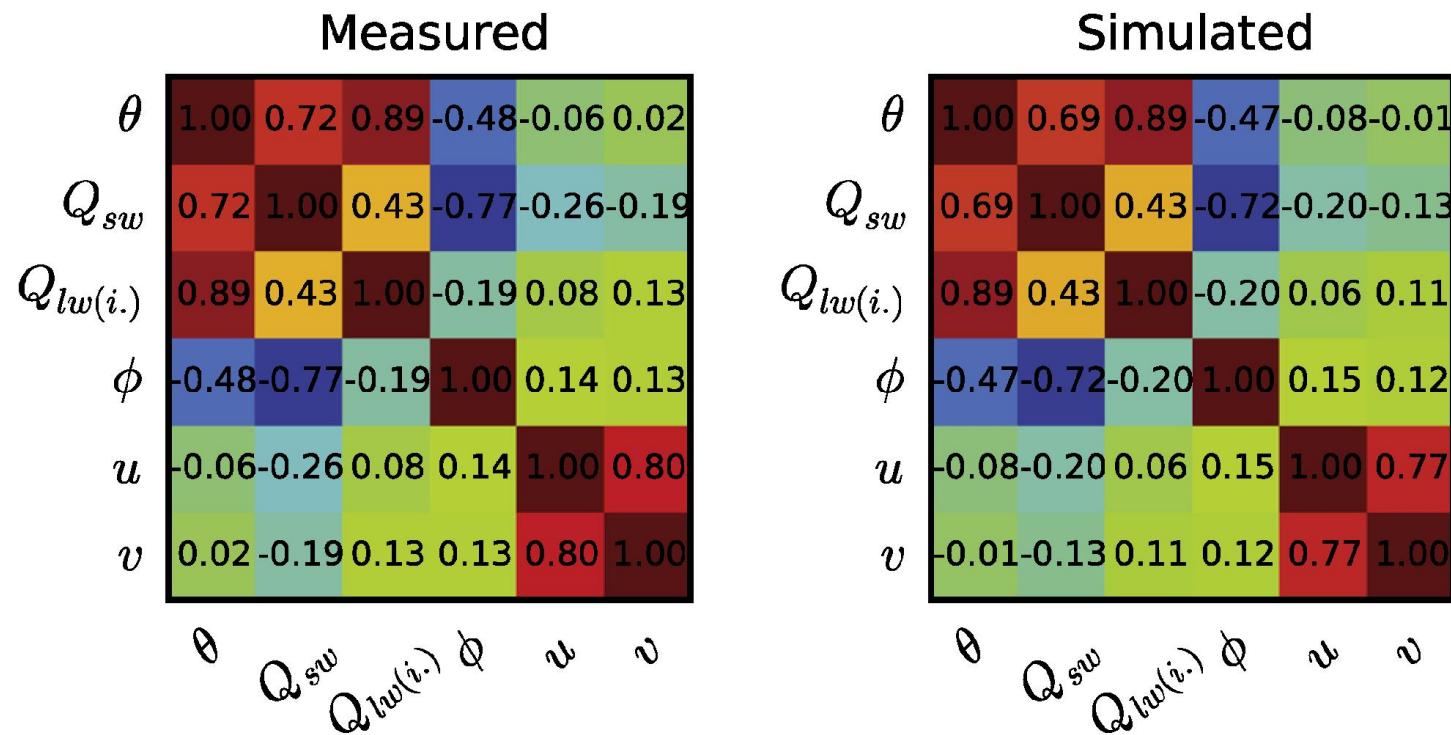


```
In [1]: from lhglb.contrib.weathergenerator import vg
In [2]: met_vg = vg.UG(var_names=<"Qsw", "ILWR", "theta", "rh", "u", "v">)
D:\lhglb\python\lhglb\contrib\meteo\meteoxy2y.py:405: RuntimeWarning: invalid value encountered in sqrt
    n = ((lw / lw_clear - 1) / Zs) ** 0.5
D:\lhglb\python\lhglb\contrib\weathergenerator\vg.py:107: UserWarning: Input of e and theta caused 1047 rel. humidities to be > 1. Capping them at 1.
    "to be > 1. Capping them at 1.") % n_too_moist)
Fitting seasonal distributions.
    Recover previous fit from shelve for: Qsw
    Recover previous fit from shelve for: ILWR
    Recover previous fit from shelve for: theta
    Recover previous fit from shelve for: rh
    Recover previous fit from shelve for: u
    Recover previous fit from shelve for: v
In [3]: met_vg.fit(p=3, q=0)
Fitting the VAR model
In [4]: times_, sim = met_vg.simulate(T=3653, theta_incr=2., mean_arrival=14, disturbance_std=5, theta_grad=1.5)
Simulating a time-series.
```



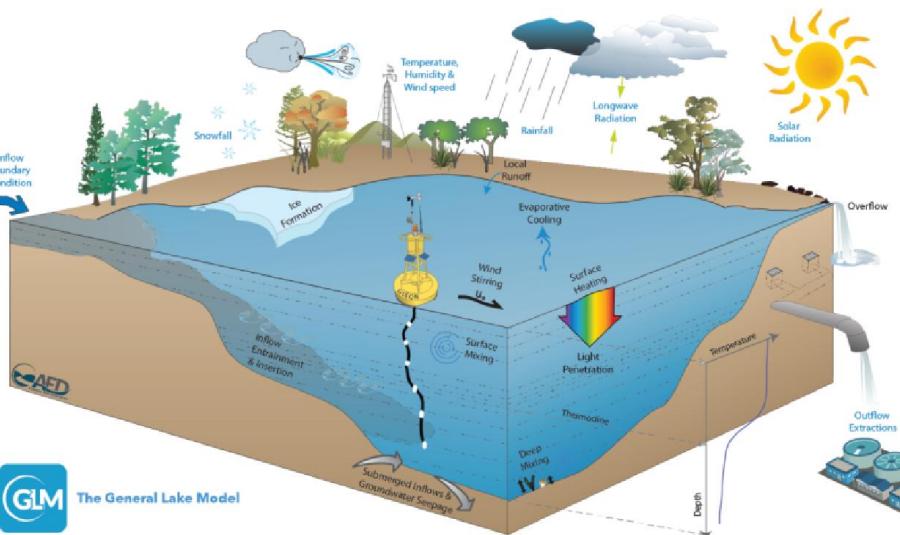
Schlabing et al. 2014, EMS  
open source: <http://bitbucket.org/iskur/vg>

# Correlation structure of meteorological variables

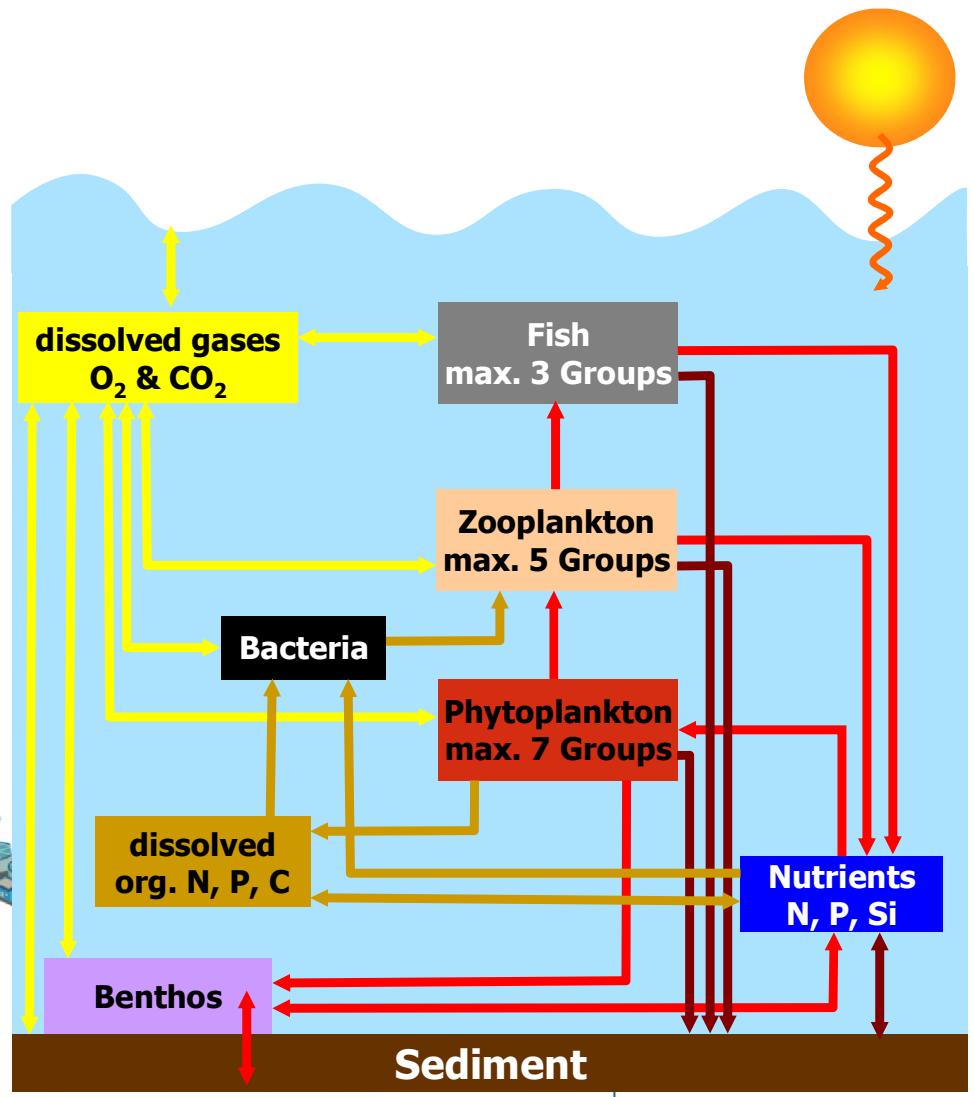


# Hydrophysical lake model

## The general lake model (GLM)

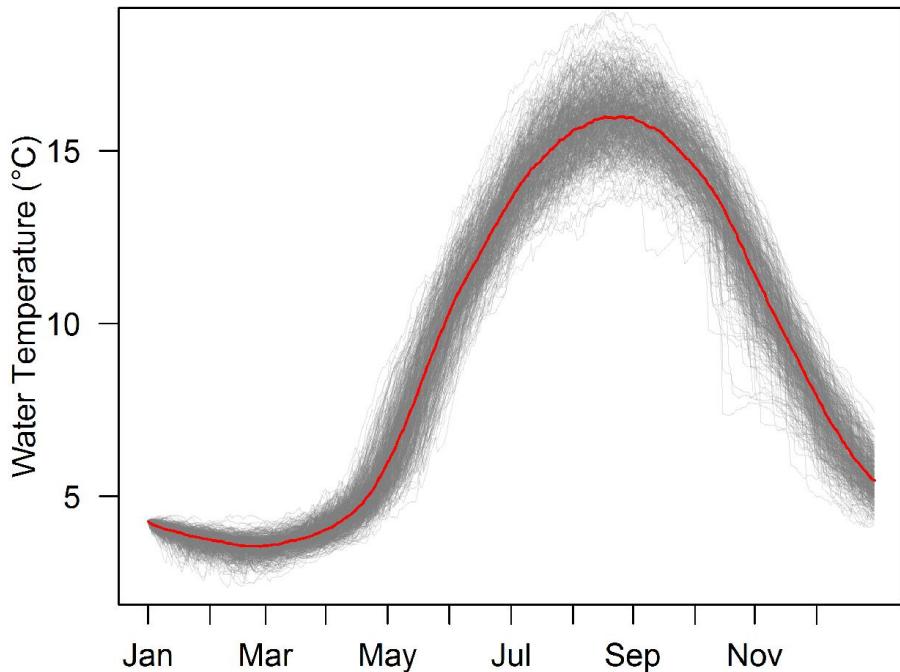


# Ecological lake model

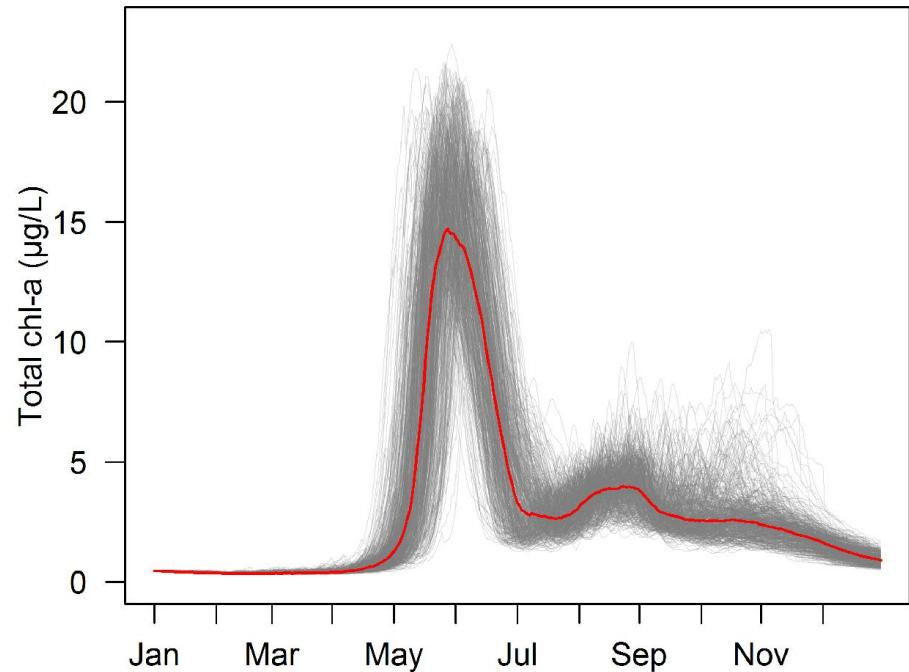


# Base Scenario (500 realisations)

Mean Water Temperature 0-20 m

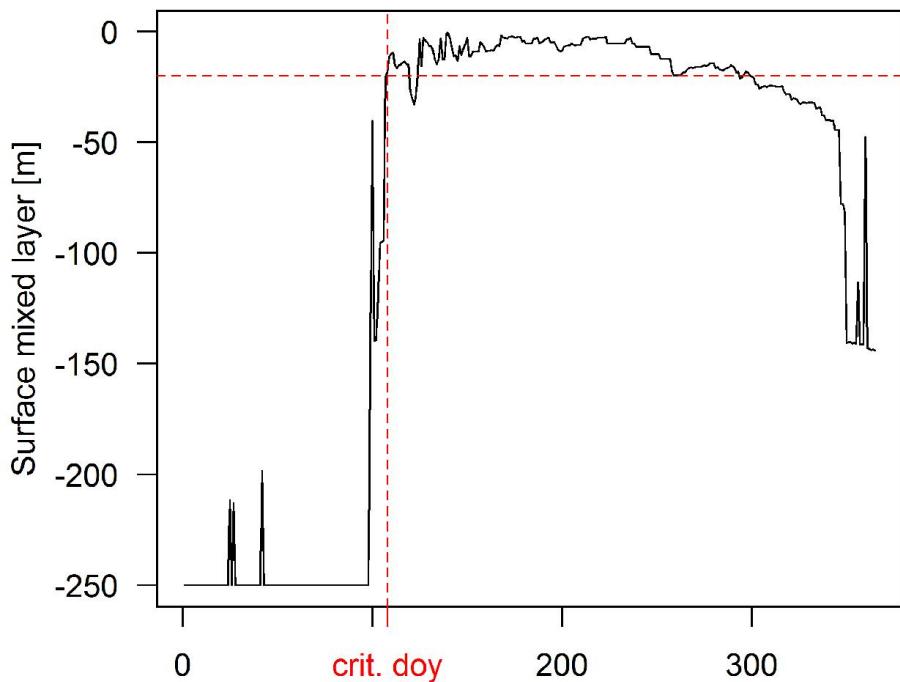


Mean Total Chl-a Conc. 0-20 m

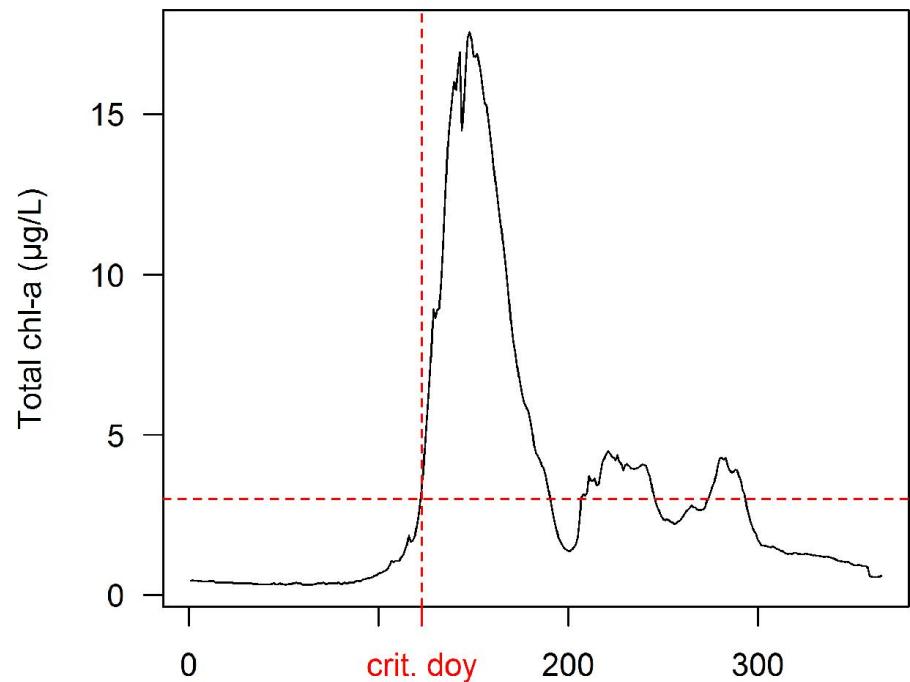


# Stratification and bloom onset

Surface mixed layer depth



Mean Total Chl-a Conc. 0-20 m

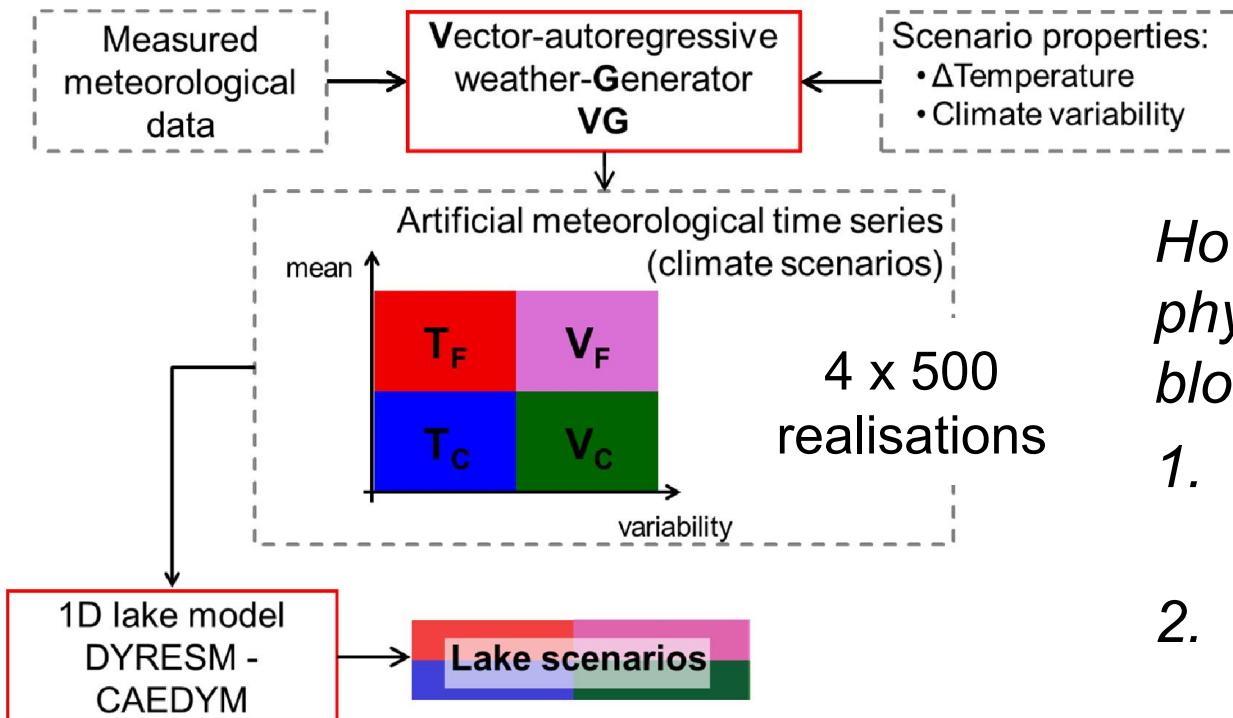


# Use of a weather generator for simulating climate change effects on ecosystems: A case study on Lake Constance

D. Schlabing, M.A. Frassl, M.M. Eder, K. Rinke and A. Bárdossy

Environmental Modelling & Software,

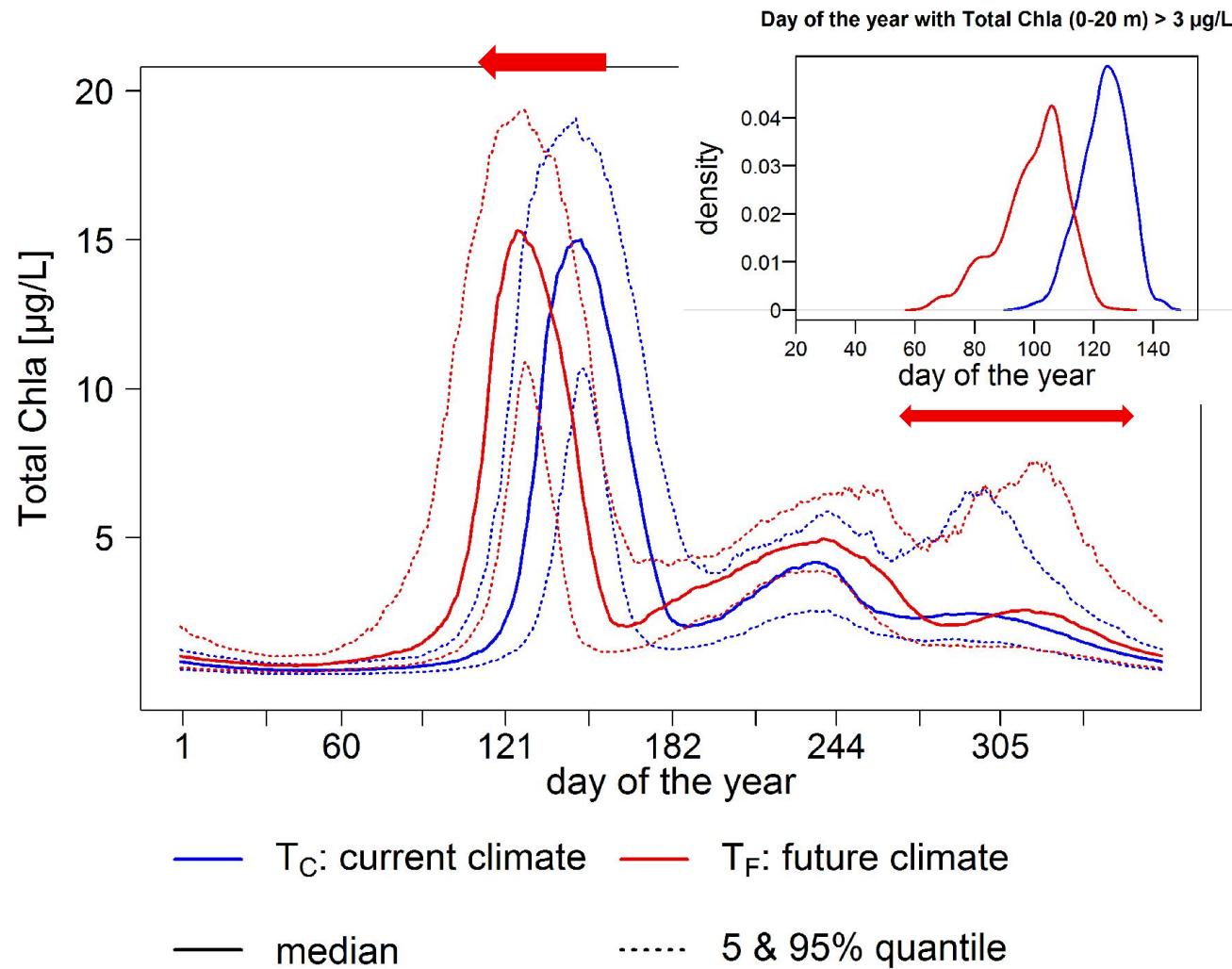
doi: 10.1016/j.envsoft.2014.06.028



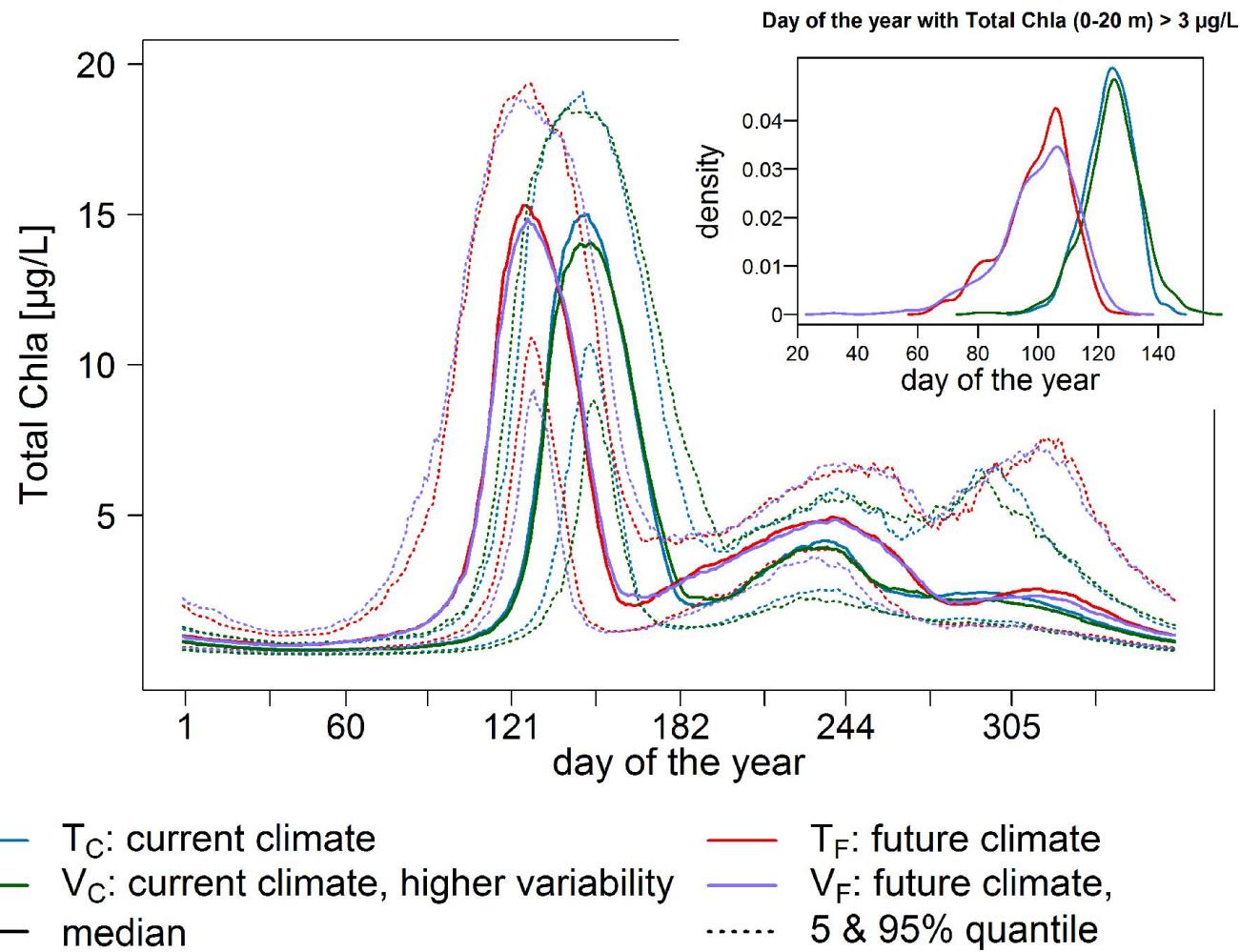
*How sensitive is the phytoplankton spring bloom to*

- 1. a change in mean air temperature*
- 2. an increased climate variability*
- 3. a combination of both*

# Mean Chlorophyll Concentration 0-20 m

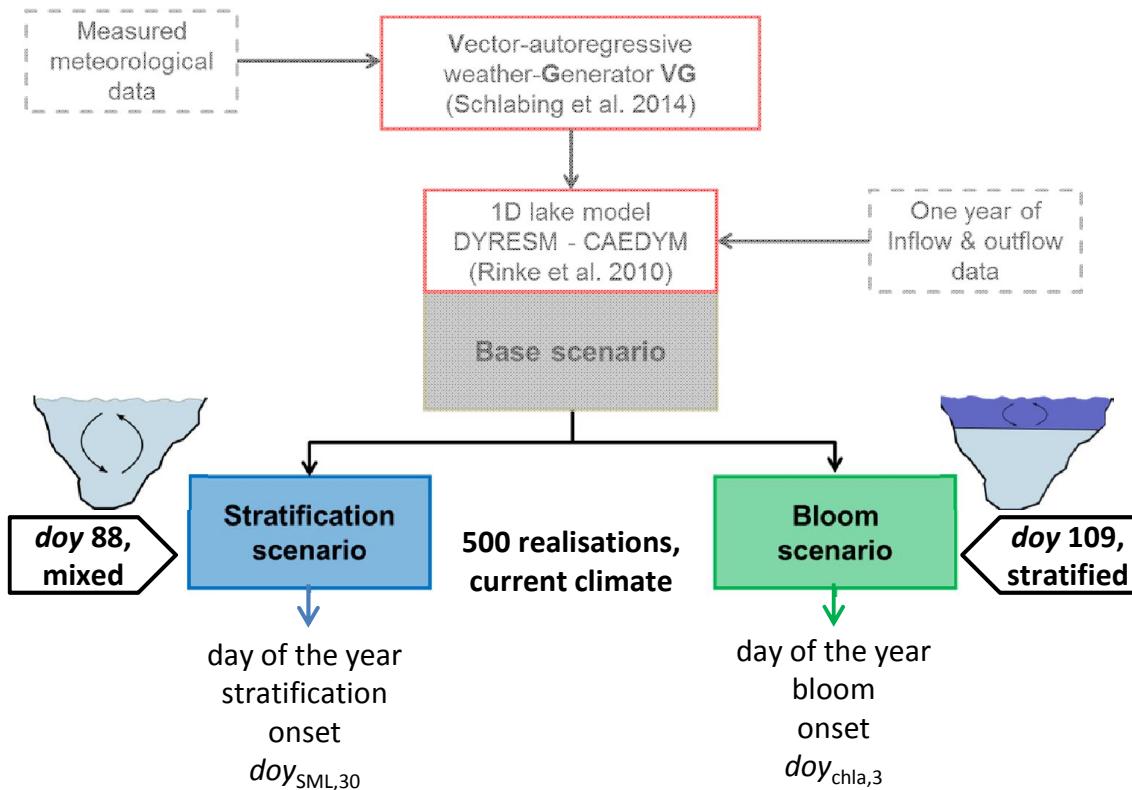


# Mean Chlorophyll Concentration 0-20 m



# Meteorological control of lake ecosystems: The (un)importance of air temperature

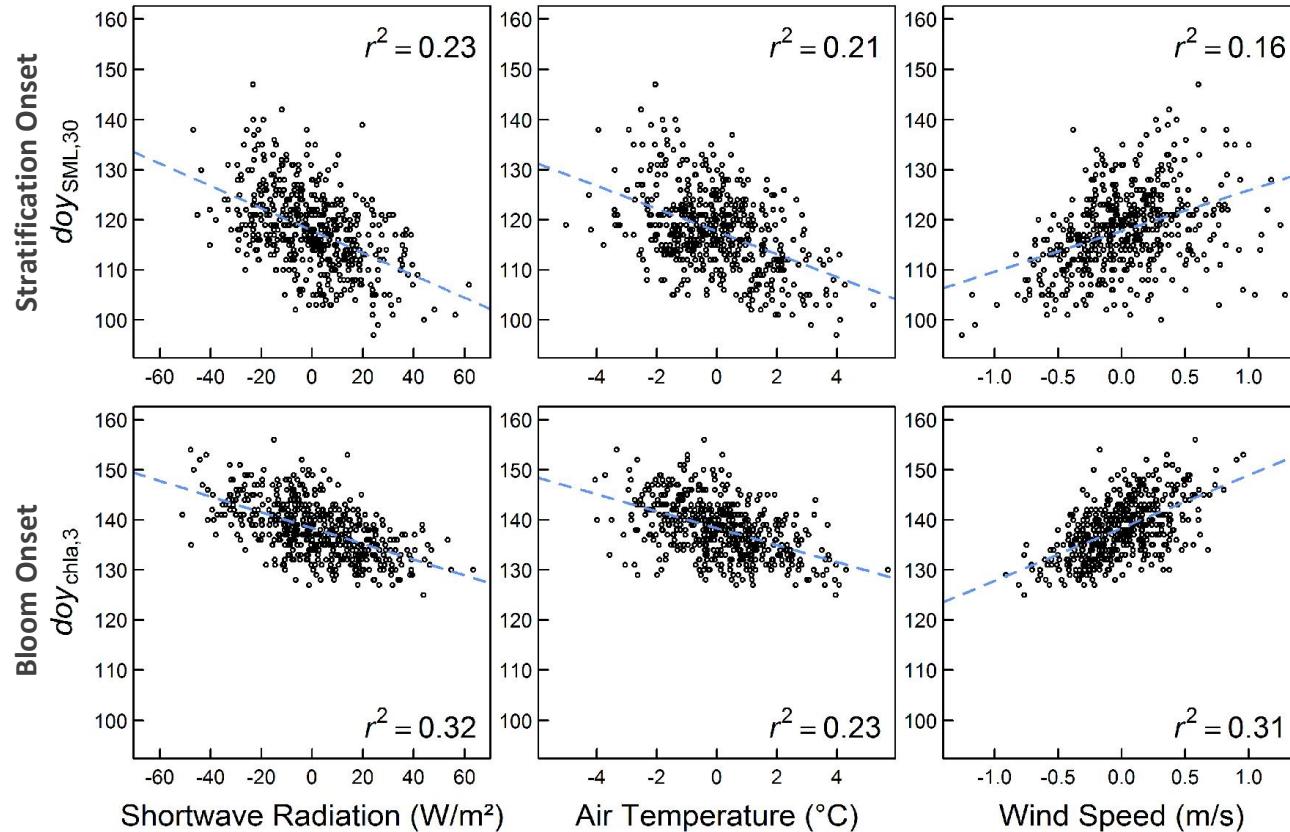
M.A. Frassl, D. Schlabing, M.M. Eder, K.-O. Rothhaupt and K. Rinke  
(submitted)



*What is the relative importance of different meteorological variables for the timing of stratification and the phytoplankton spring bloom?*

*What are the relevant time scales for stratification and spring bloom onset?*

# Relevant meteorological variables



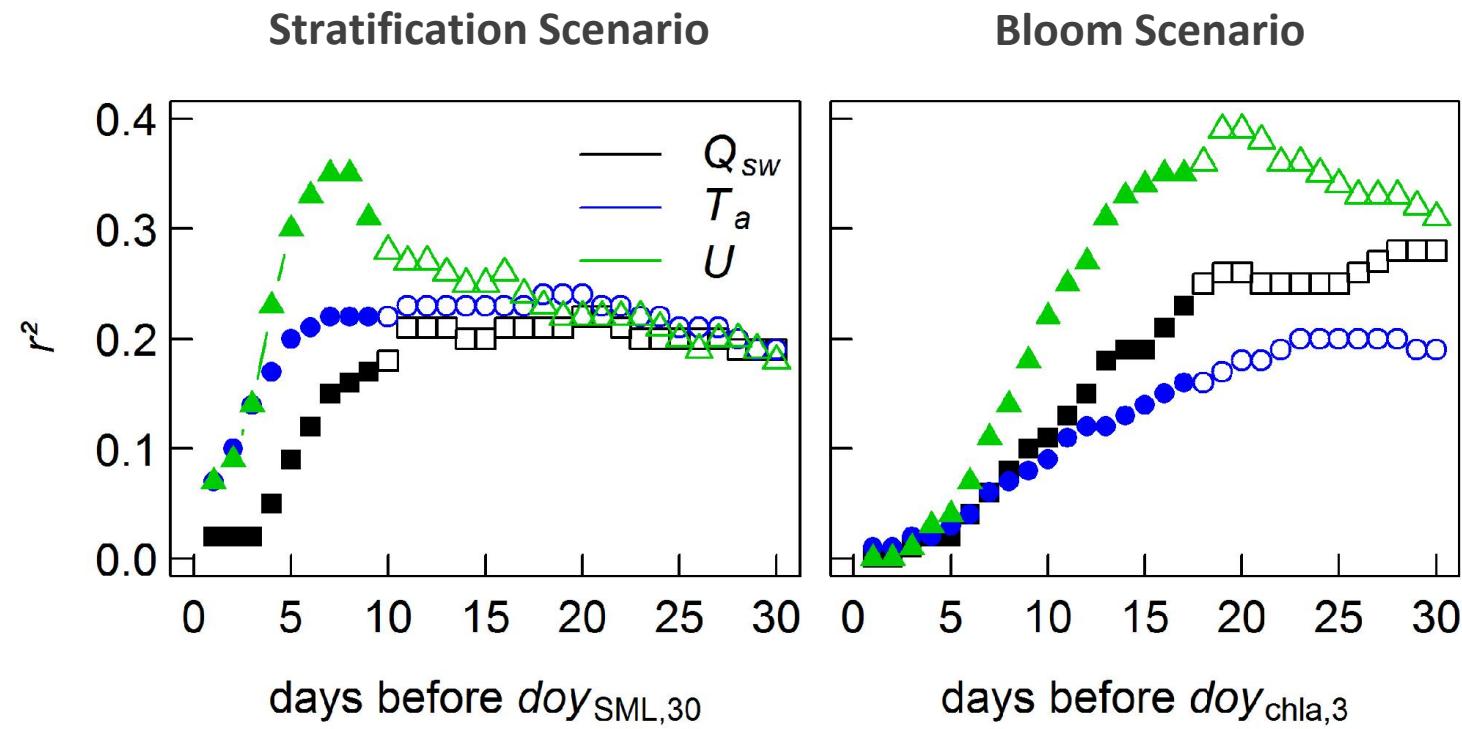
Stratification onset:

$$doy_{SML,30} = 117.68 - 0.14 \overline{Q_{SW}} - 1.68 \bar{T} + 7.07 \bar{U}, r^2 = 0.436, RI_{QSW} = 0.144, RI_{AT} = 0.155, RI_U = 0.137$$

Bloom onset:

$$doy_{chl_a,3} = 138.55 - 0.11 \overline{Q_{SW}} - 0.95 \bar{T} + 8.92 \bar{U}, r^2 = 0.607, RI_{QSW} = 0.232, RI_{AT} = 0.109, RI_U = 0.266$$

# Relevant time scales



Stratification onset:

$$doy_{SML,30} = 118.44 - 0.11 \bar{Q}_{SW}_{20} - 1.62 \bar{T}_{18} + 7.79 \bar{U}_7, r^2 = 0.672, RI_{QSW} = 0.119, RI_{AT} = 0.207, RI_U = 0.346$$

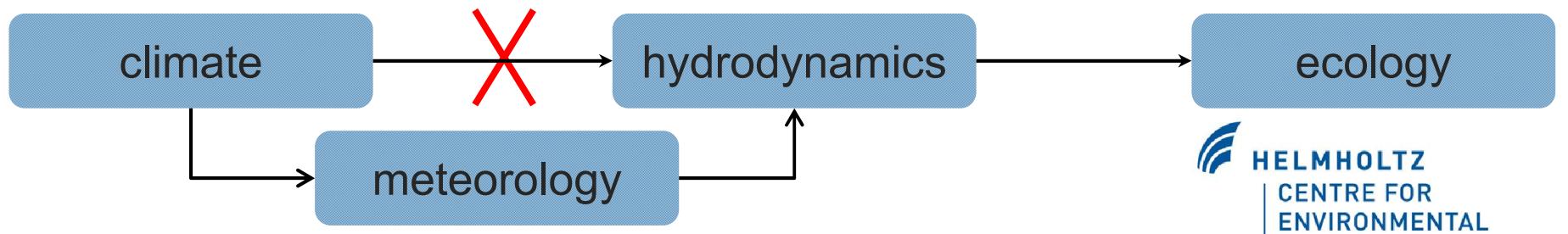
Bloom onset:

$$doy_{chla,3} = 138.58 - 0.11 \bar{Q}_{SW}_{28} - 0.91 \bar{T}_{23} + 9.67 \bar{U}_{19}, r^2 = 0.702, RI_{QSW} = 0.217, RI_{AT} = 0.112, RI_U = 0.373$$

# Summary – Weather generator

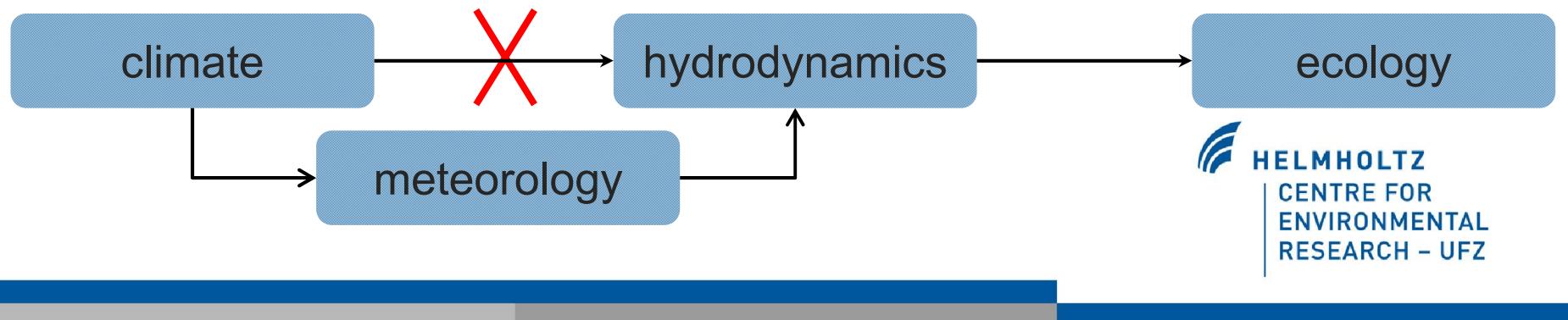
**The coupling of statistical (VG) and mechanistic (DYCD) model is a powerful approach:**

- process understanding by hand-tailored scenarios (e.g. mean vs. variability)
- VG enables a probabilistic approach
- analysing extreme events

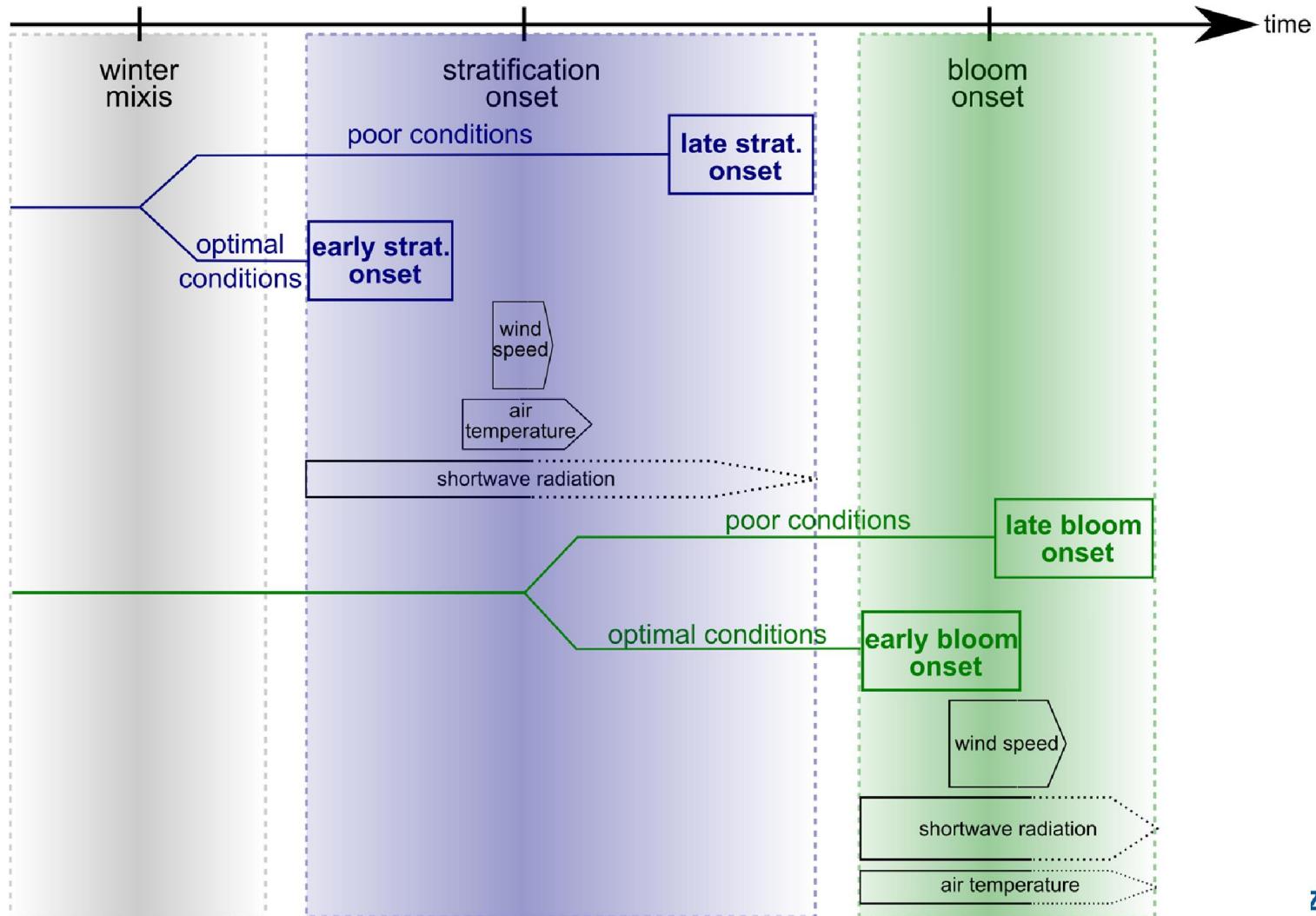


# Summary – Lake Ecosystem

- Phytoplankton spring bloom timing depends on the interaction between meteorological variables.
- Increased variability showed only a slight effect.
- Meteorological variables acted at different time scales.
- Wind had the largest influence on the timing.



# Summary – Lake Ecosystem



# Acknowledgement

## Data and Model:

- German Weather Service (DWD)
- Institute for Lake Research (ISF) and Internationale Gewässerschutzkommission für den Bodensee (IGKB)
- Limnological Institute, University of Konstanz
- Centre for Water Research (CWR)

## Funding:



International Max Planck  
Research School  
for Organismal Biology

