



# Modelling lake thermal dynamics under climate change



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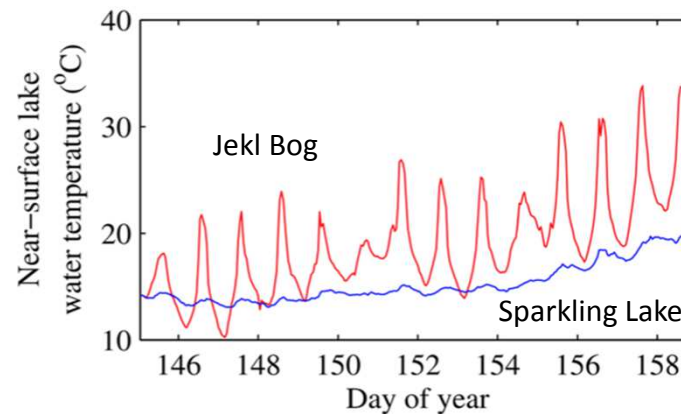
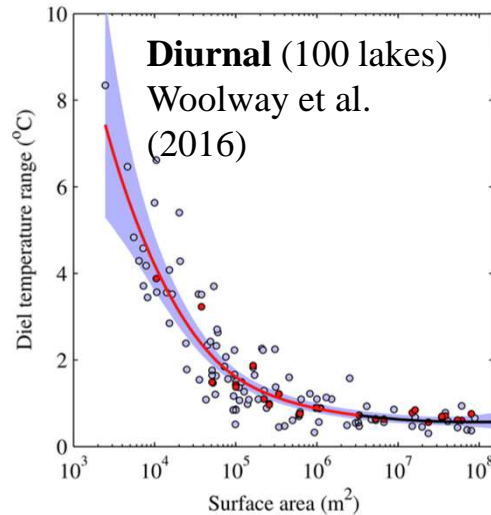
- Lake water temperature
- Why do we need lake models?
  - Example 1: Atmospheric stilling influence on thermal stratification
  - Example 2: Response of lake temperatures to a climate regime shift
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# Lake water temperature

- Lake surface temperature varies at a range of timescales:

# Lake water temperature

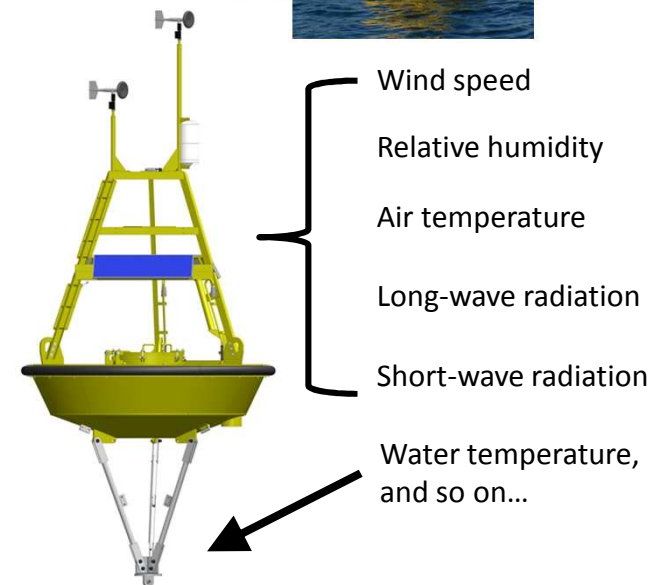
- Lake surface temperature varies at a range of timescales:



RESEARCH ARTICLE

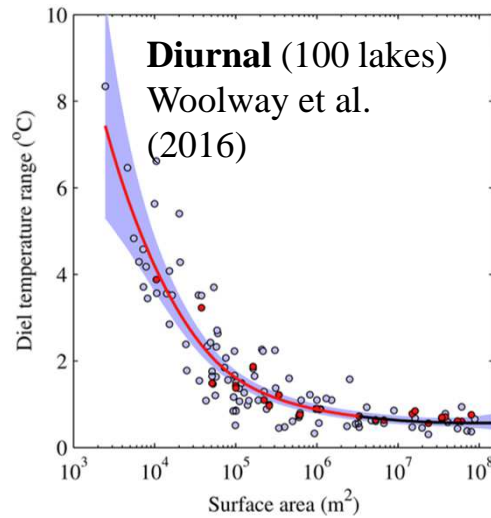
## Diel Surface Temperature Range Scales with Lake Size

R. Iestyn Woolway<sup>1,2,3\*</sup>, Ian D. Jones<sup>1</sup>, Stephen C. Maberly<sup>1</sup>, Jon R. French<sup>2</sup>, David M. Livingstone<sup>4</sup>, Donald T. Monteith<sup>1</sup>, Gavin L. Simpson<sup>5,6</sup>, Stephen J. Thackeray<sup>1</sup>, Mikkel R. Andersen<sup>7</sup>, Richard W. Battarbee<sup>2</sup>, Curtis L. DeGasperis<sup>8</sup>, Christopher D. Evans<sup>9</sup>, Elvira de Eyto<sup>10</sup>, Heidrun Feuchtmayr<sup>1</sup>, David P. Hamilton<sup>11</sup>, Martin Kernan<sup>2</sup>, Jan Krokowski<sup>12</sup>, Alon Rimmer<sup>13</sup>, Kevin C. Rose<sup>14</sup>, James A. Rusak<sup>15</sup>, David B. Ryves<sup>16</sup>, Daniel R. Scott<sup>16</sup>, Ewan M. Shilland<sup>2</sup>, Robyn L. Smyth<sup>17</sup>, Peter A. Staehr<sup>18</sup>, Rhian Thomas<sup>19</sup>, Susan Waldron<sup>20</sup>, Gesa A. Weyhenmeyer<sup>21</sup>

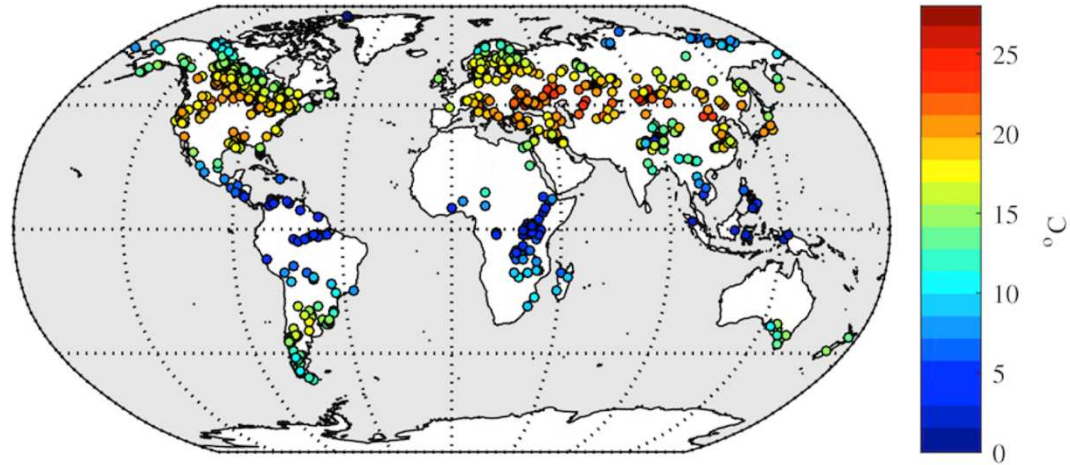


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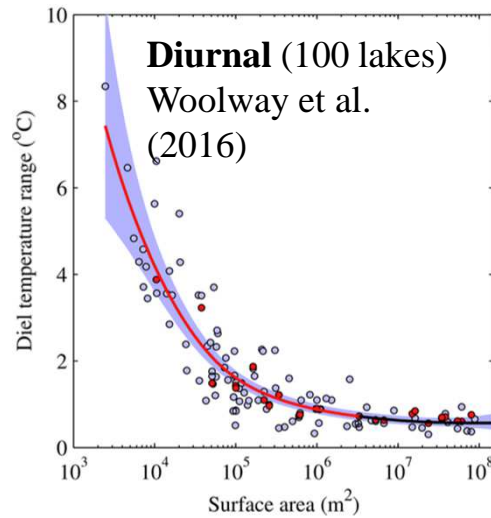
**Seasonal** (732 lakes; ARC-Lake)



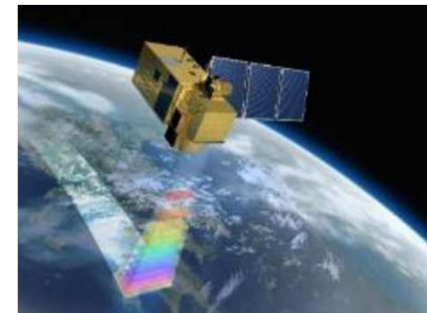
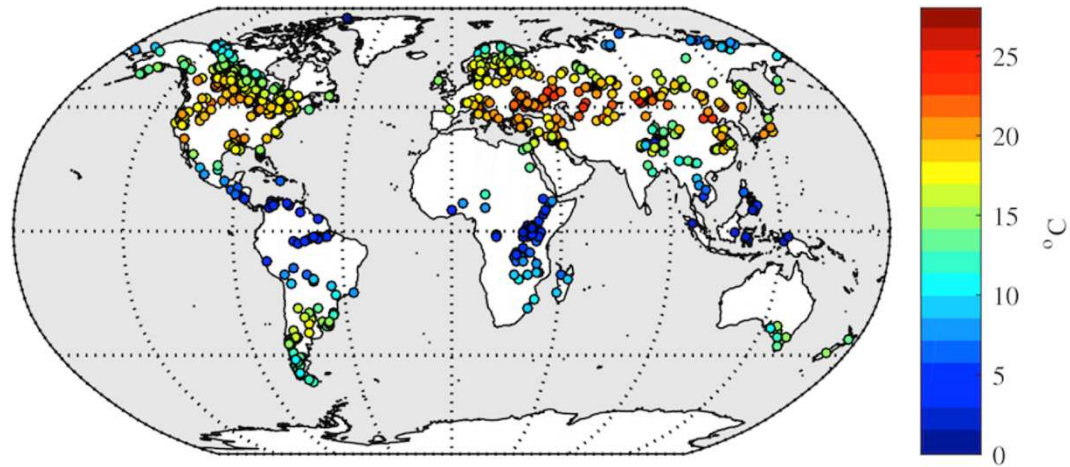


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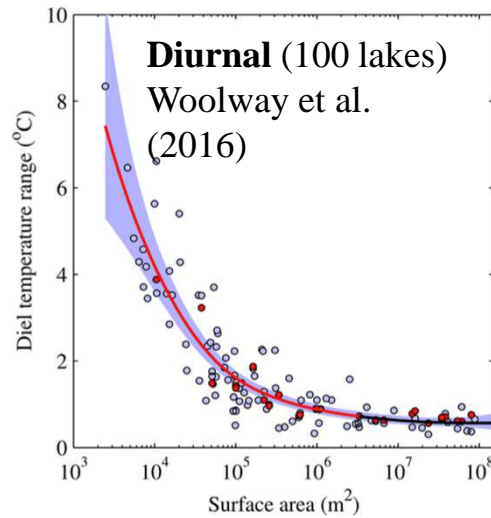


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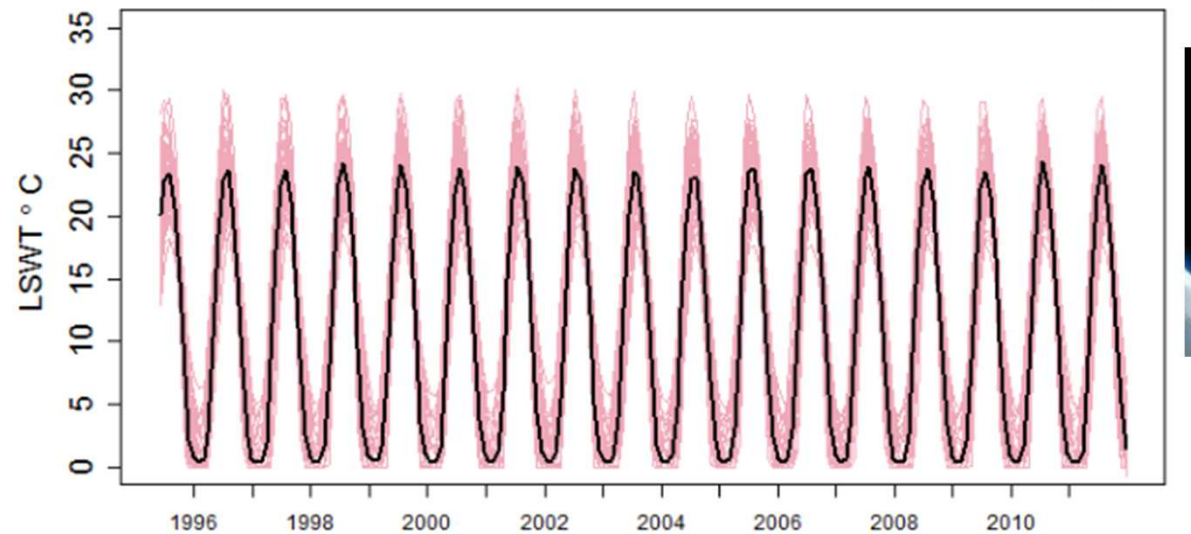
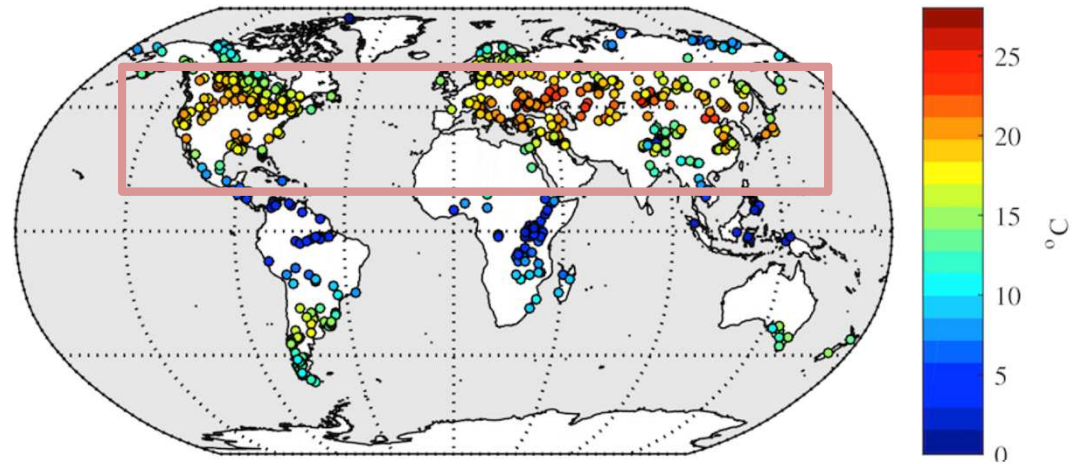


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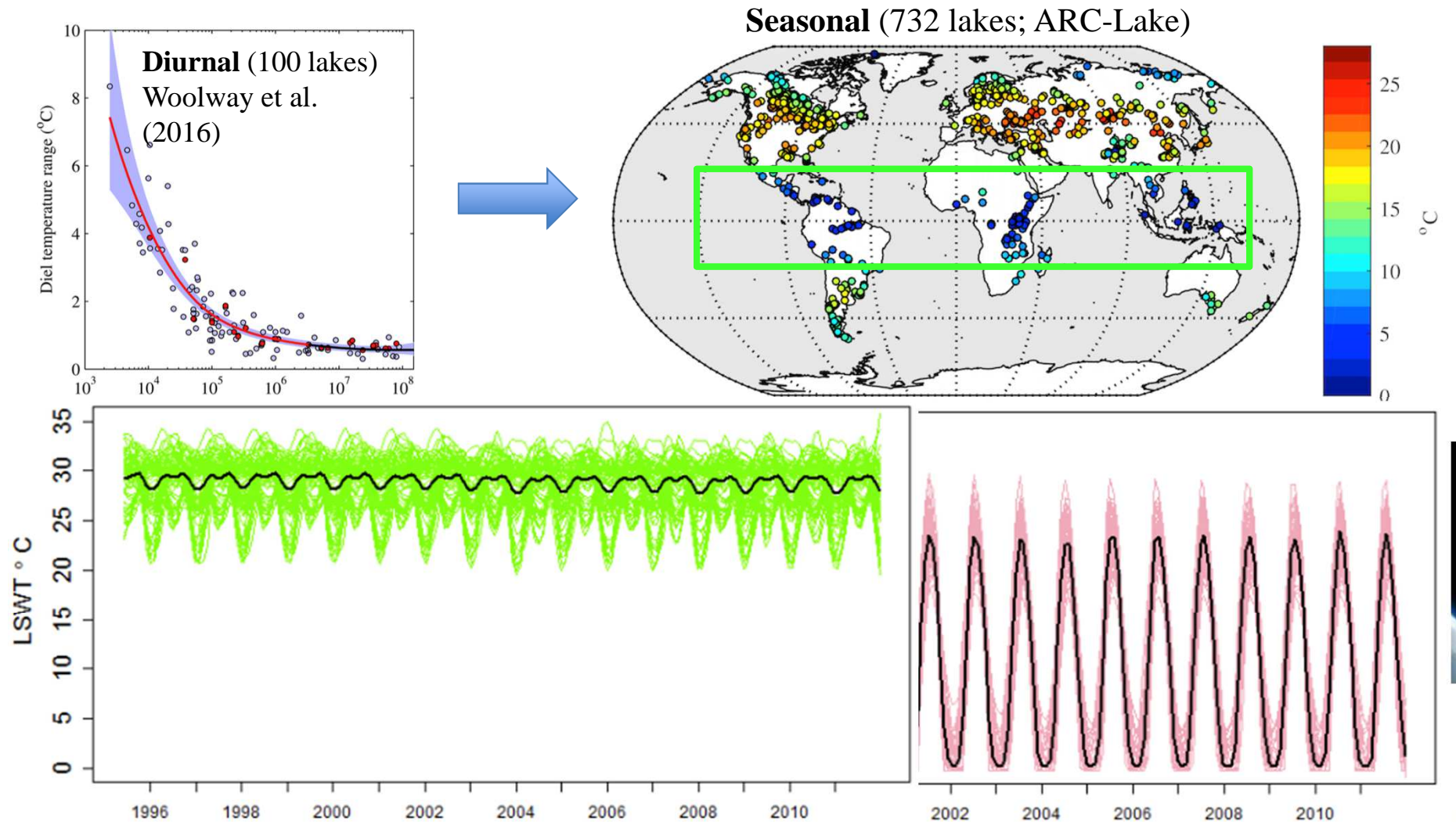


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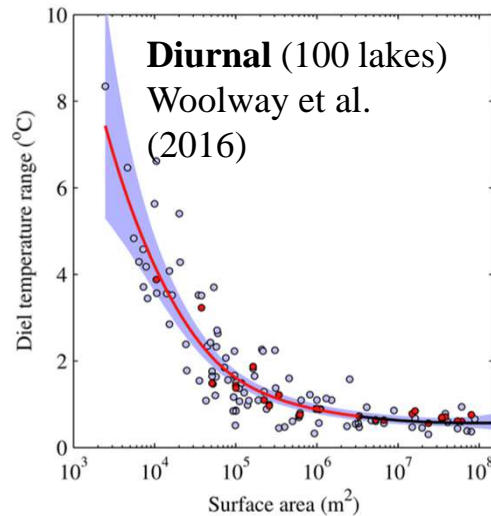
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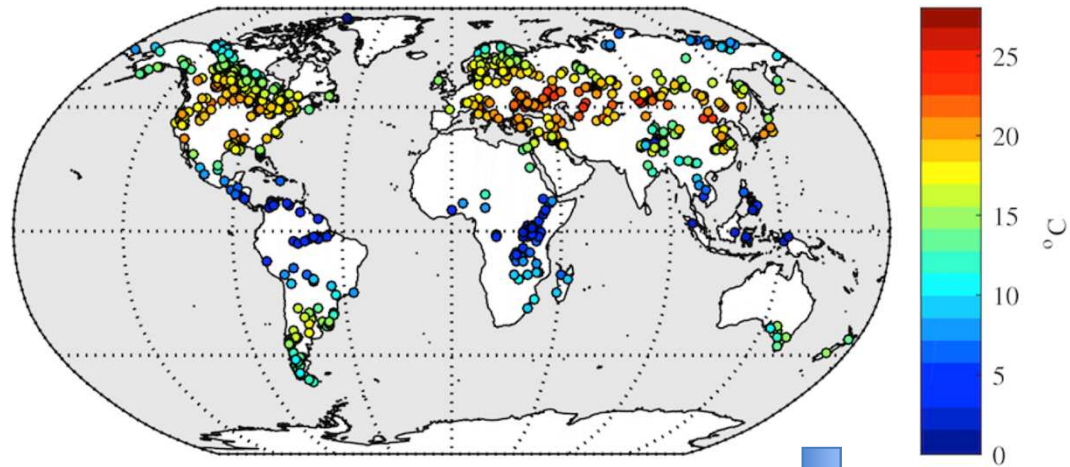


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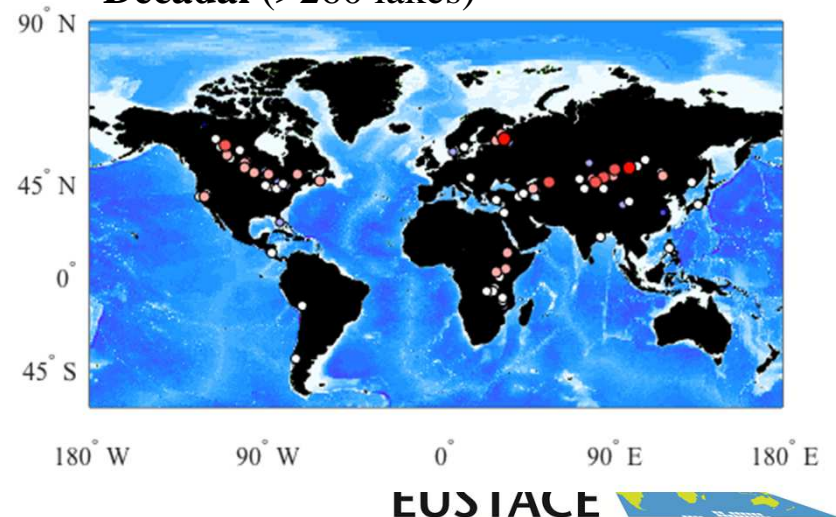
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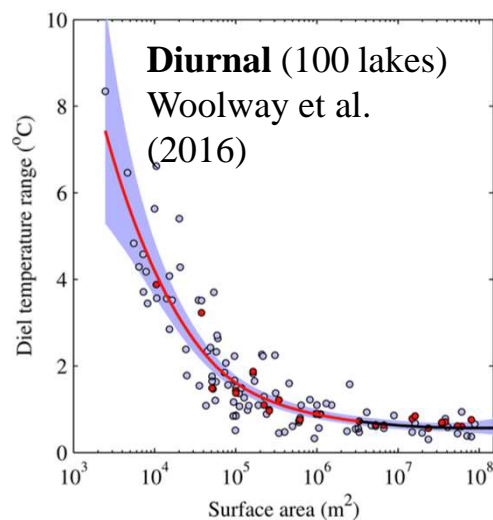


**Decadal** (>260 lakes)

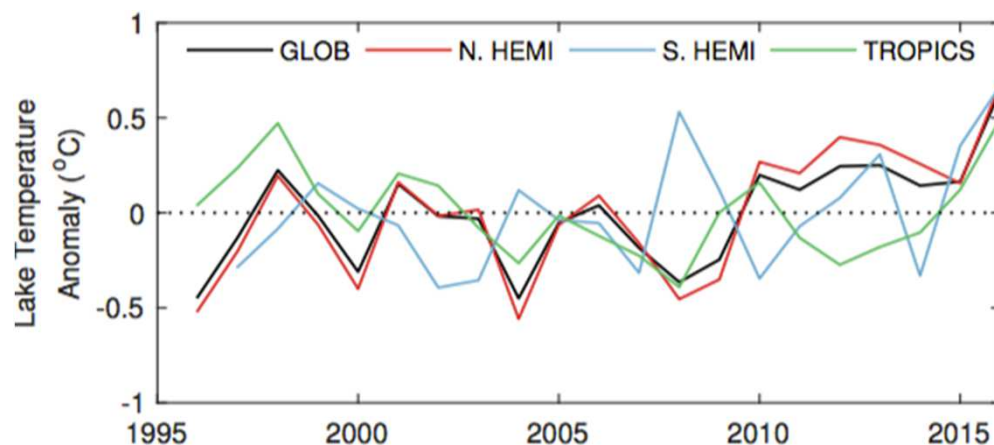
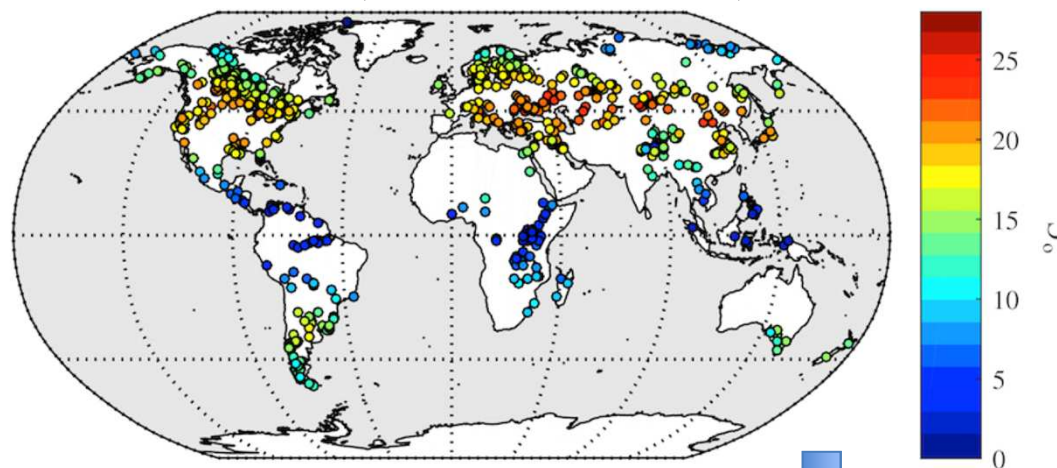


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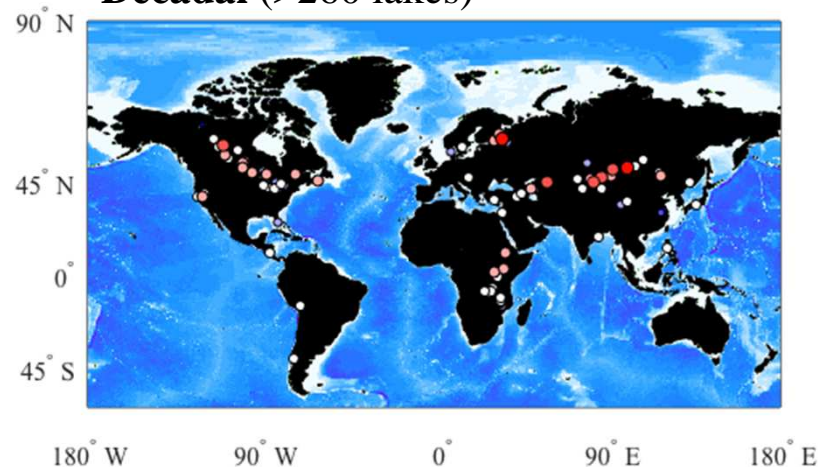
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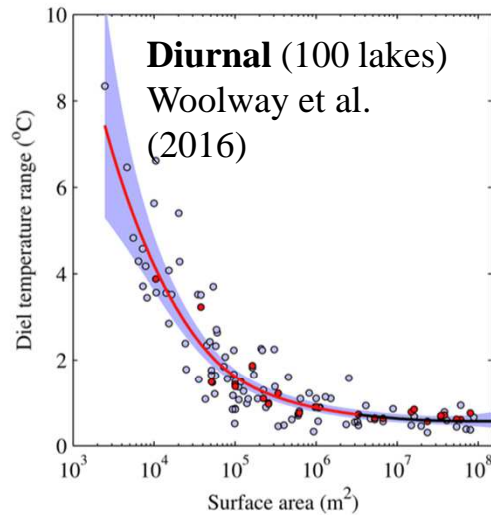
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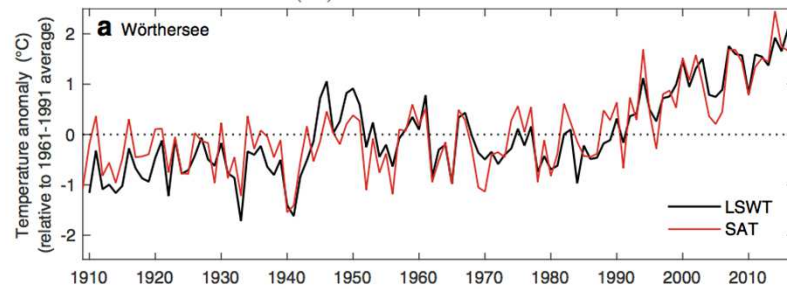
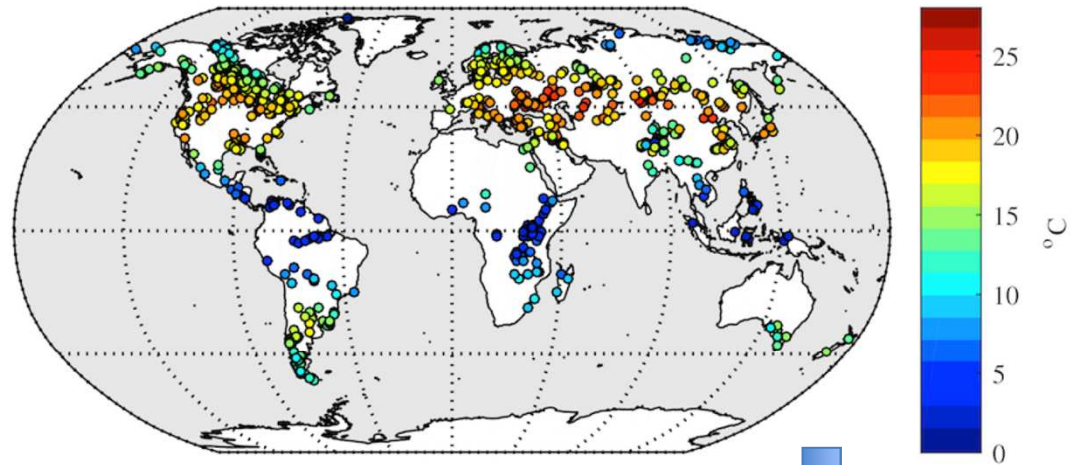
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# Lake water temperature

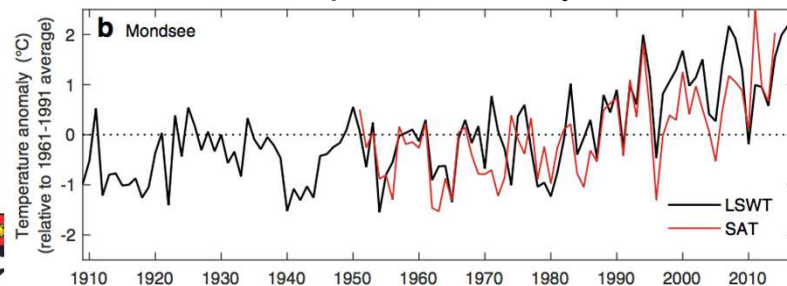
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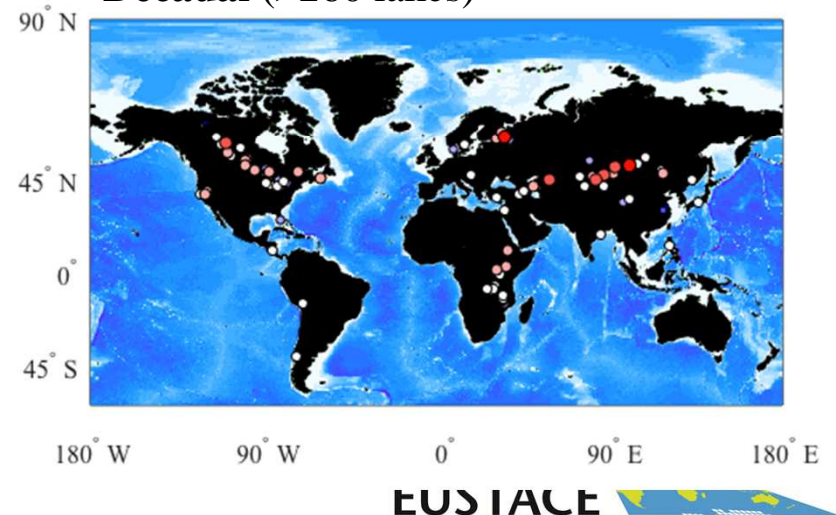
**Seasonal** (732 lakes; ARC-Lake)



**100 years** (Woolway et al., 2017)



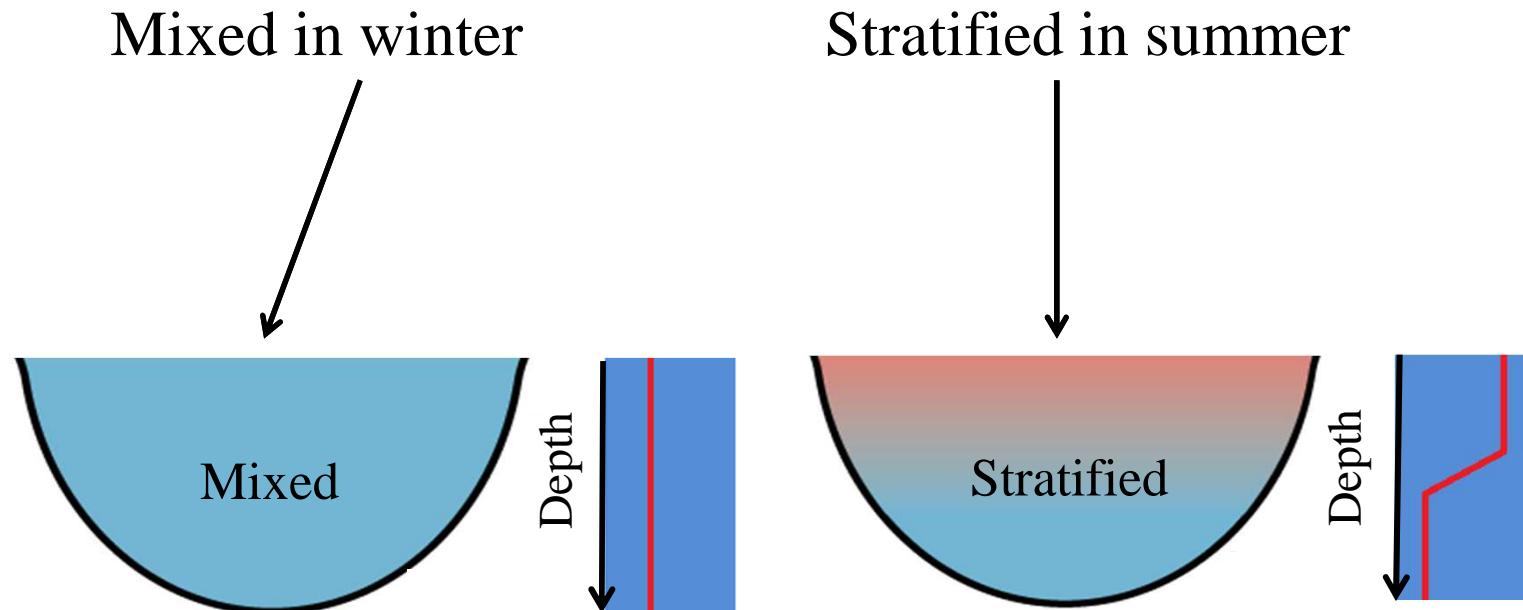
**Decadal** (>260 lakes)





# Lake water temperature

- Lake temperature also varies with depth.
- The temperature structure is one of the most fundamental characteristics of a lake as it determines the physical environment of the ecosystem

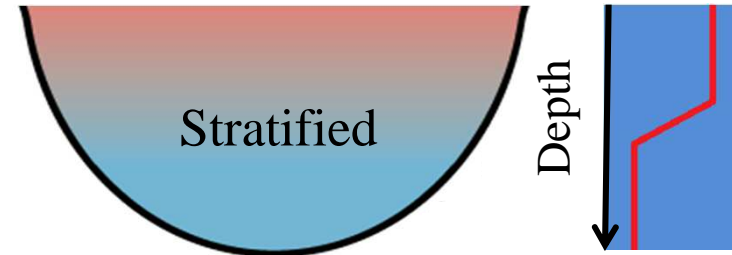
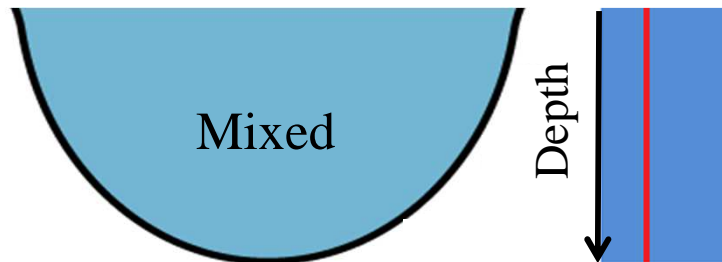
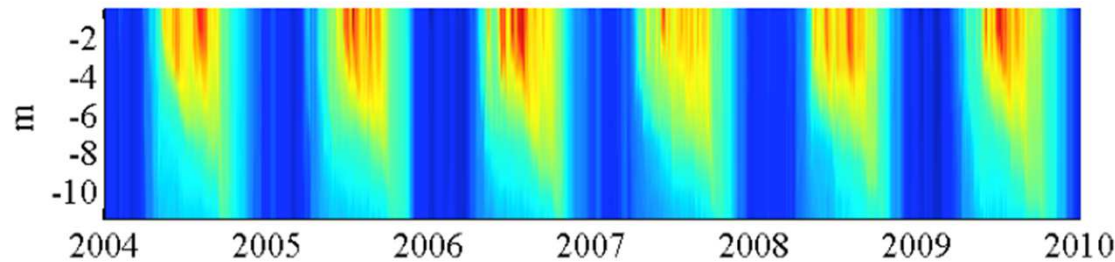


# Lake water temperature

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Esthwaite Water, UK.





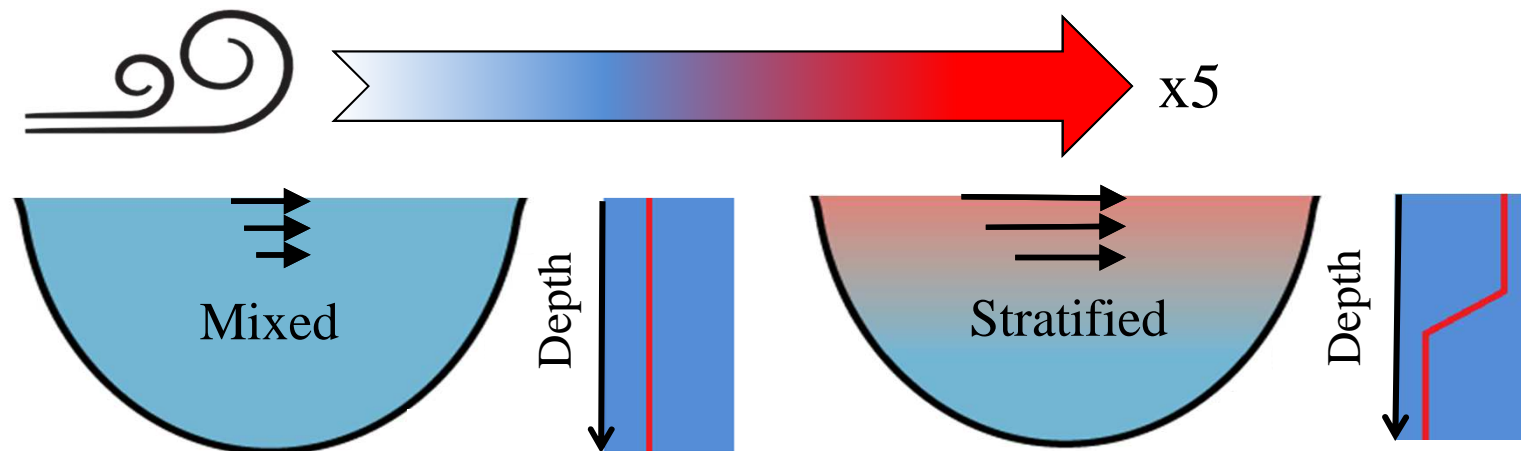
# Lake water temperature

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Woolway and Simpson (2017), **Energy input and dissipation in a temperate lake during the spring transition**, *Ocean Dynamics*,

doi:10.1007/s10236-017-1072-1

Efficiency of wind energy transfer to a lake increases by a factor of 5 between mixed and stratified regimes



# Why do we need lake models?

If we have data, why do we need lake models? Some examples:

1. Lake models can be used to disentangle the multiple factors which influence the role of climate change on lake thermal dynamics.
2. Models can be used to predict lake temperatures when measurements are not available.
3. Can be used to validate theories of lake temperature response to climatic warming

Here are 2 examples of the value of lake models for understanding the influence of climate change on lakes.

## Example 1: Atmospheric Stilling leads to prolonged thermal stratification

Woolway et al., (2017a), **Atmospheric stilling leads to prolonged thermal stratification in a large shallow polymictic lake**, *Clim. Change*, doi:10.1007/s10584-017-1909-0

## Example 2: Response of lake temperatures to a climate regime shift

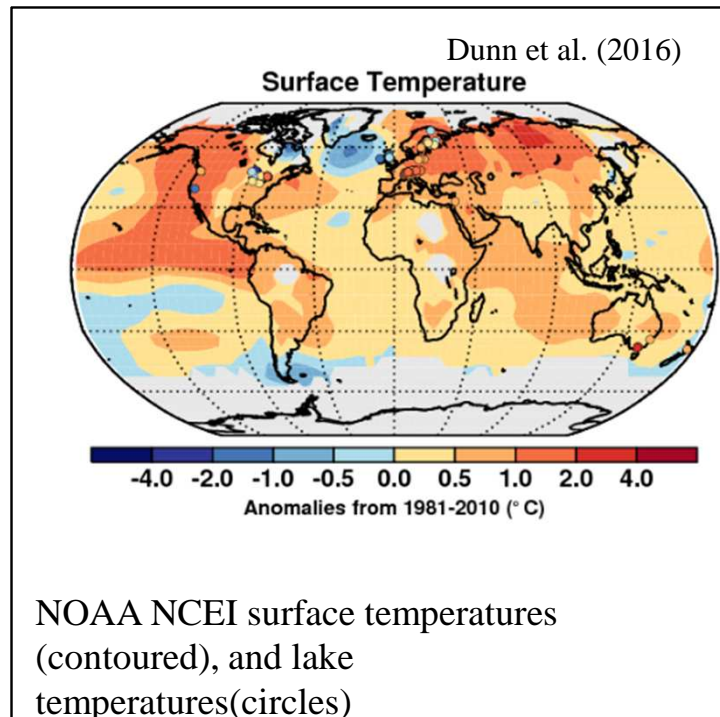
Woolway et al., (2017b), **Warming of Central European lakes and their response to the 1980s climate regime shift**,

*Clim. Change*, doi:10.1007/s10584-017-1966-4

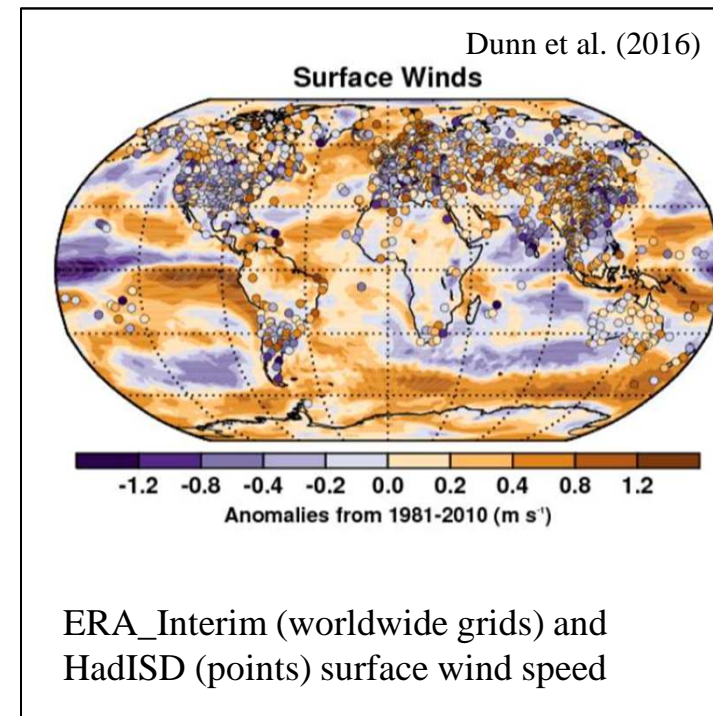
# Example 1: Atmospheric stilling leads to prolonged thermal stratification

**Atmospheric stilling leads to prolonged thermal stratification in a large shallow polymictic lake**

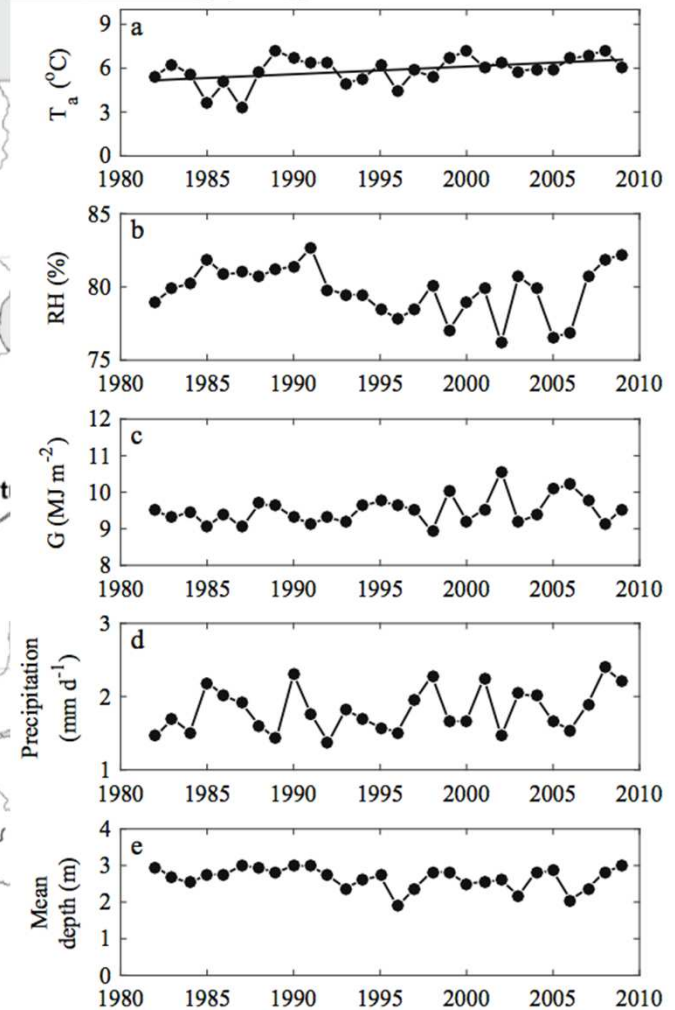
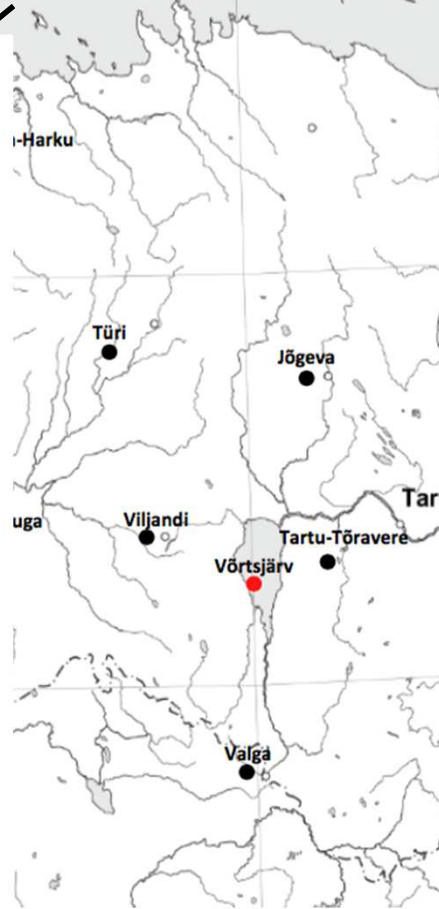
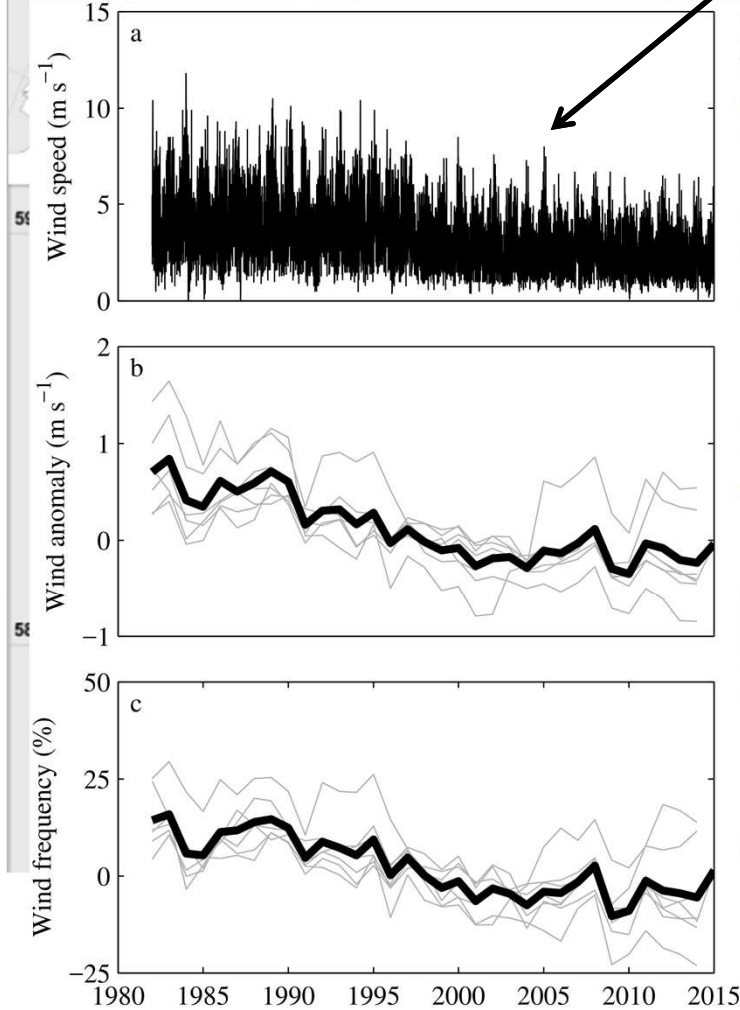
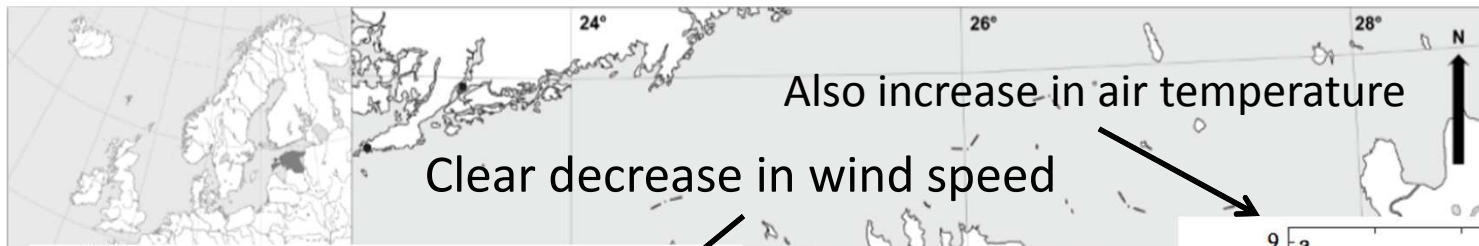
R. Iestyn Woolway<sup>1</sup> • Pille Meinson<sup>2</sup> • Peeter Nöges<sup>2</sup> •  
Ian D. Jones<sup>3</sup> • Alo Laas<sup>2</sup>



**Strengthening of lake stratification:  
a matter of increasing temperature  
or weakening wind?**



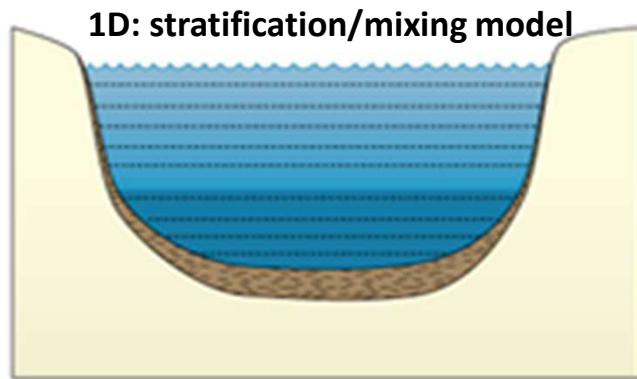




Frequency of winds  $> 3 \text{ m/s}$



# Example 1: Atmospheric stilling leads to prolonged thermal stratification



- One-dimensional lake model capable of simulating the vertical temperature structure of lakes.
- Flexible vertical grid structure
- Study site: Lake Vortsjarv, Estonia
- Mean depth: 2.8 m
- Lake area: 270 km<sup>2</sup>

Input data (2 sources)

- Solar radiation
- Air temperature
- Wind speed
- Relative humidity
- Precipitation
- Lake bathymetry

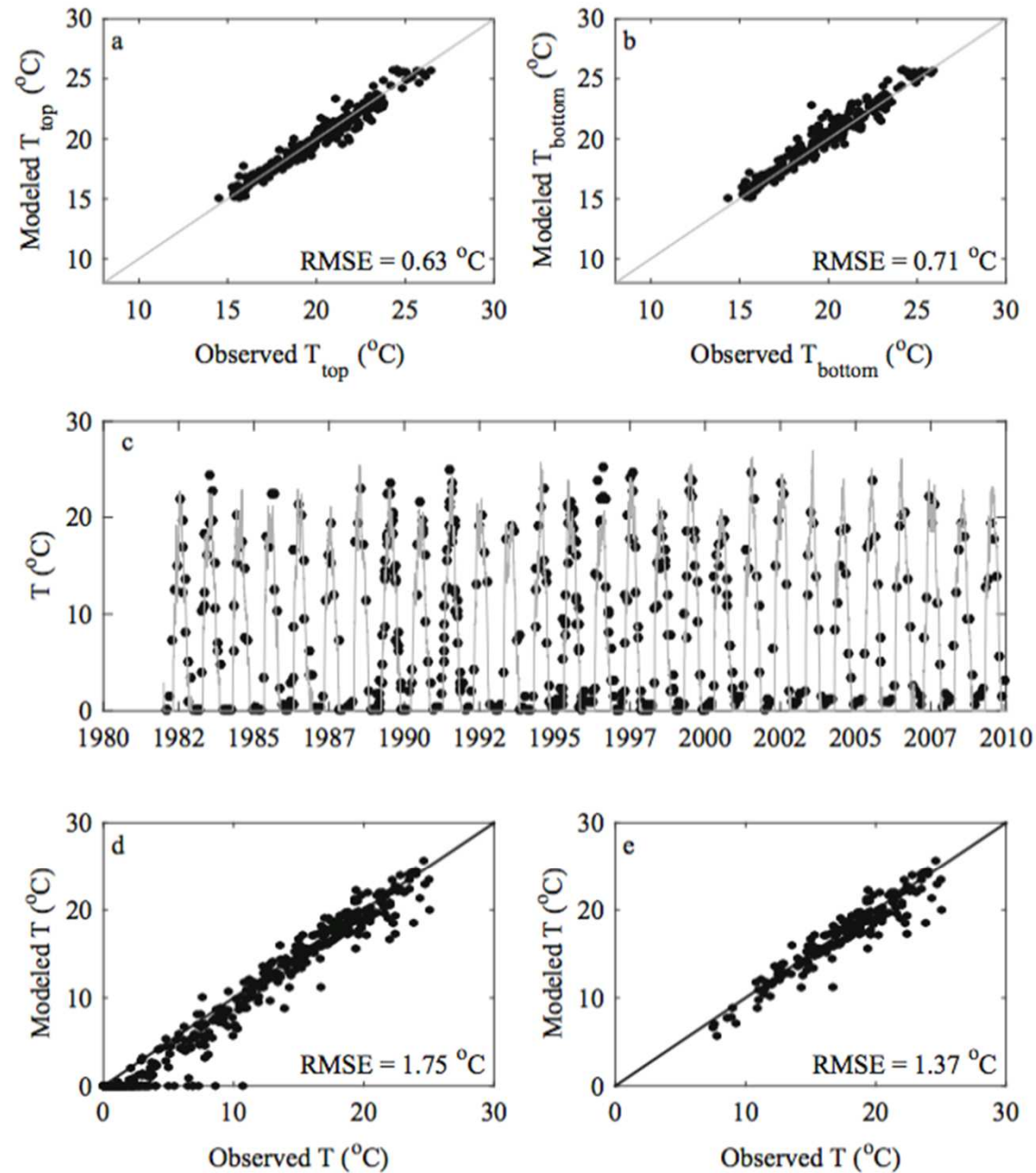
Lake station (3 years)



Land station (28 years)



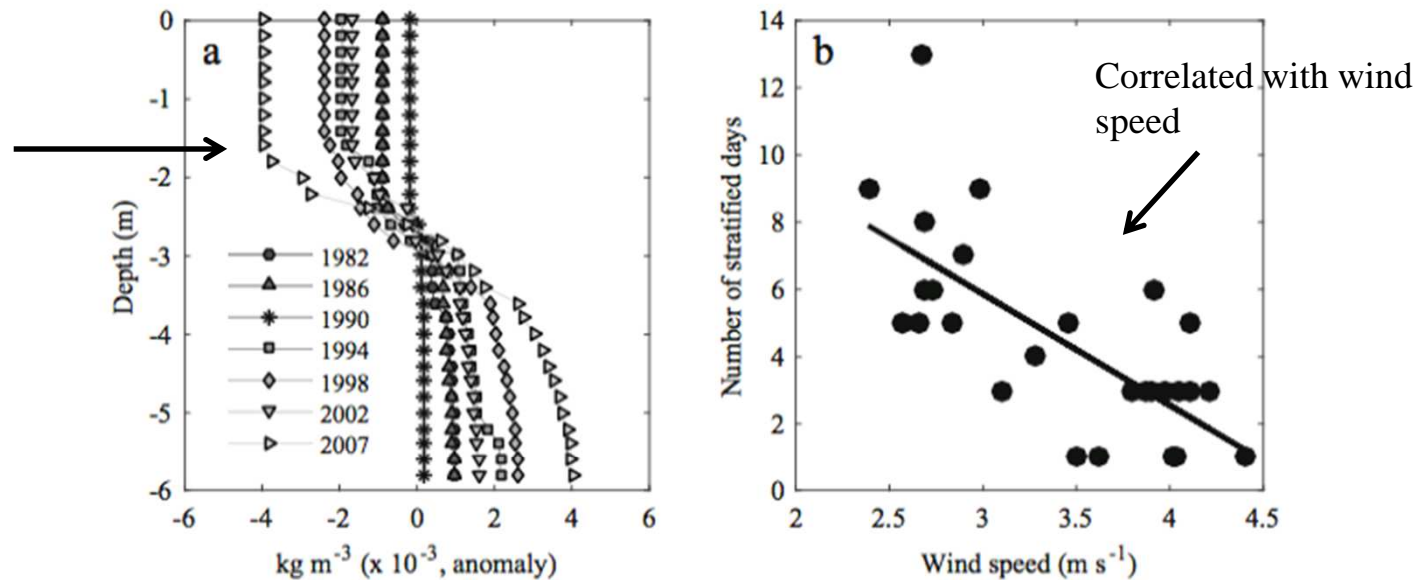
## Modelling lake surface temperatures: 1982-2010



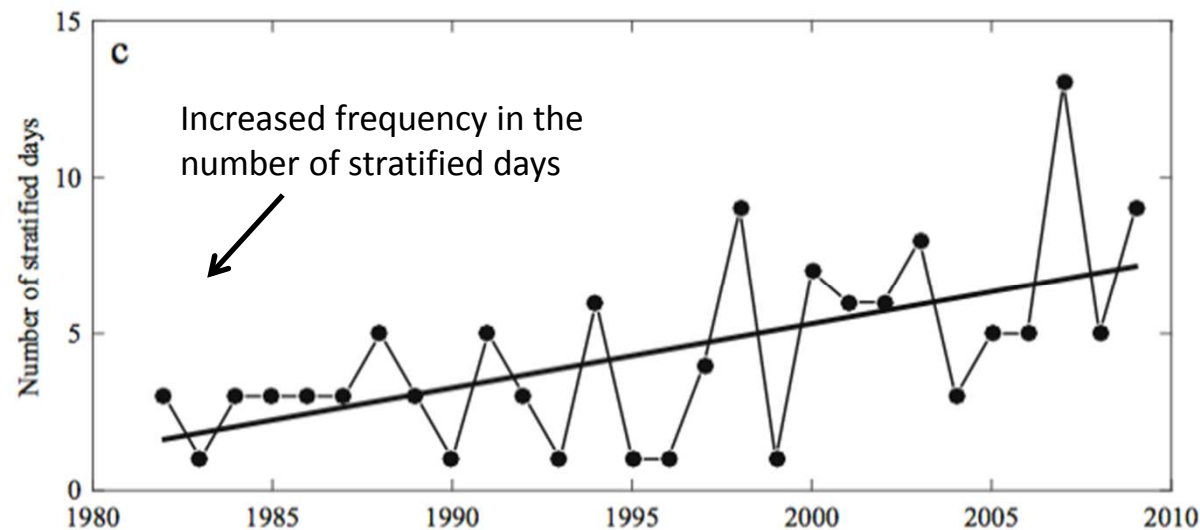
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stratification in a large  
shallow polymictic lake,**  
*Clim. Change*,  
doi:10.1007/s10584-017-  
1909-0

**Fig. 3** Comparison of modelled and observed **a** surface and **b** bottom water temperatures for 2013–2015. **c** Comparison of long-term modelled (grey line) and observed (black dots) lake surface water temperature, showing a comparison **d** throughout the year and **e** during spring/summer (MJJA)

Clear changes in the vertical temperature in recent years. Why?



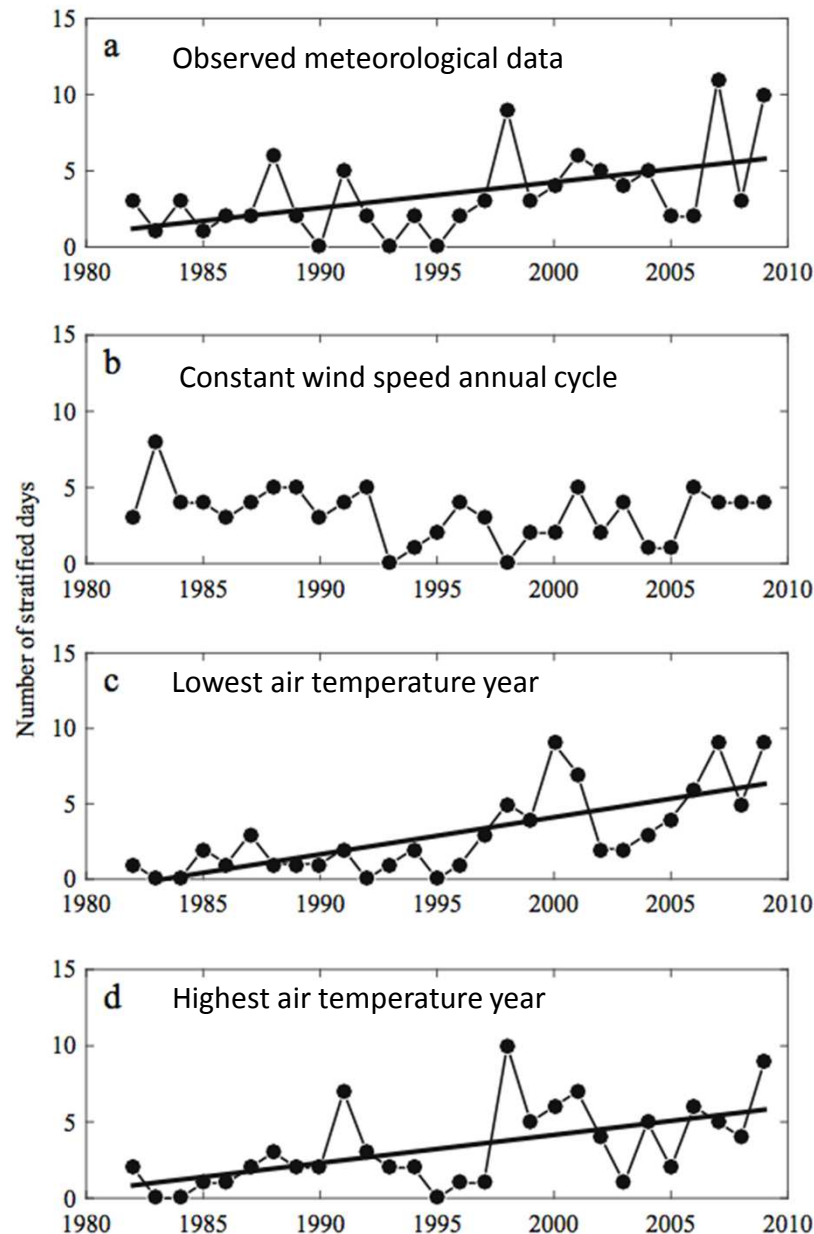
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**Fig. 4** **a** Simulated water column density profiles averaged for 4 months during spring/summer (MJJA) for selected example years. Shown are the density profile anomalies relative to the 1982 to 2010 average density profile. **b** Relationship between the average wind speeds measured at Tartu-Tõravere meteorological station and the simulated number of stratified days from model runs with observed meteorological data. **c** Time series of the simulated number of stratified days from model runs with observed meteorological data



# Modelling sensitivity analysis

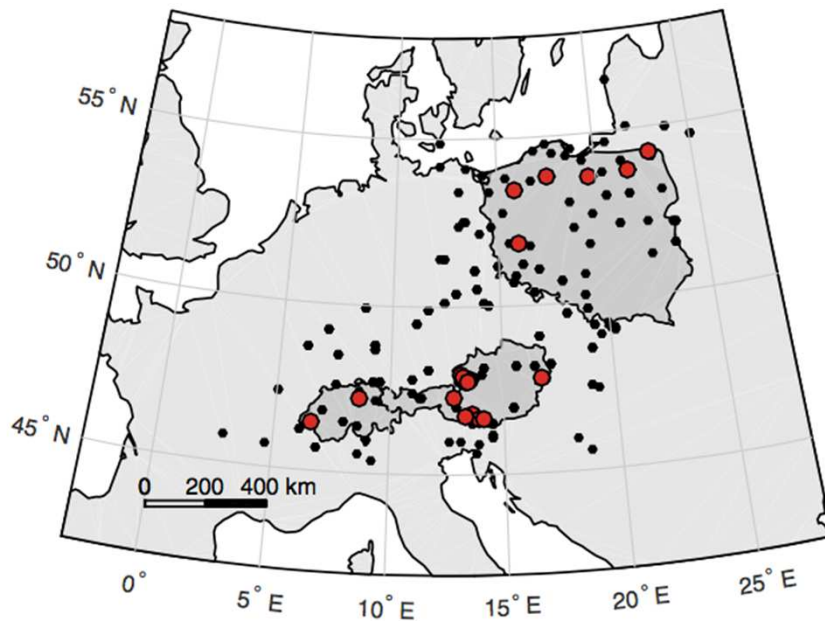


The only time our model showed no increase in the number of stratified days per year was in the model run with a constant wind speed

Woolway et al., (2017a),  
**Atmospheric stilling leads to prolonged thermal stratification in a large shallow polymictic lake,**  
*Clim. Change,*  
 doi:10.1007/s10584-017-1909-0

**Fig. 5** Comparisons of the number of stratified days from model runs with **a** constant 1982 air temperature annual cycle; **b** constant 1982 wind speed annual cycle; **c** constant 1987 air temperature annual cycle; and **d** constant 2009 air temperature annual cycle. Linear regressions of the statistically significant ( $p < 0.05$ ) relationships are shown

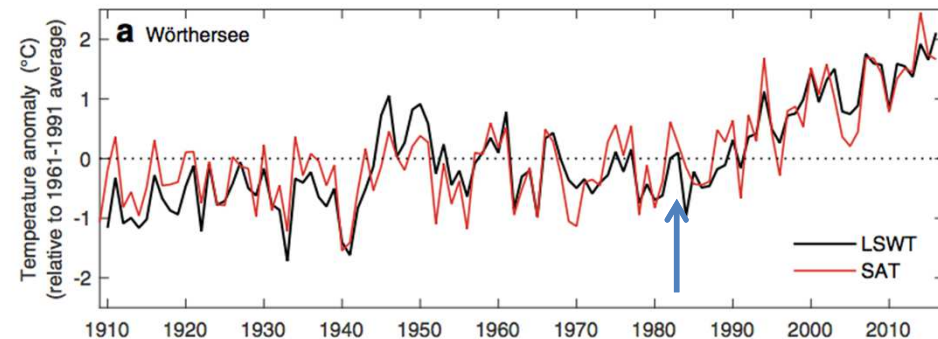
# Example 2: Response of lake temperatures to a climate regime shift



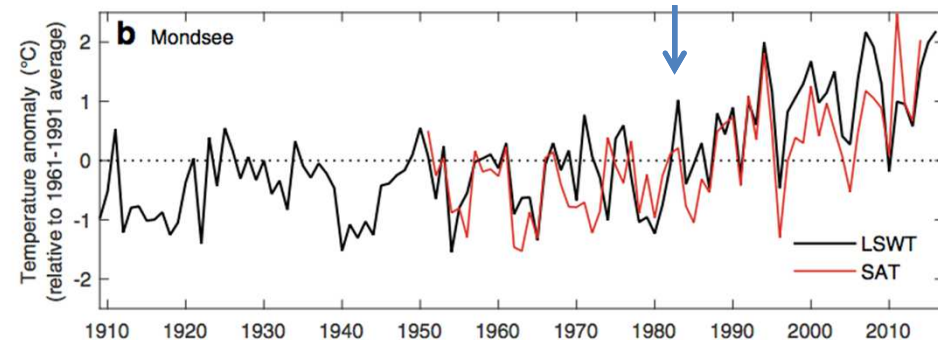
20 lakes in Central Europe

## Warming of Central European lakes and their response to the 1980s climate regime shift

R. Iestyn Woolway<sup>1</sup> · Martin T. Dokulil<sup>2</sup> ·  
Włodzimierz Marszelewski<sup>3</sup> · Martin Schmid<sup>4</sup> ·  
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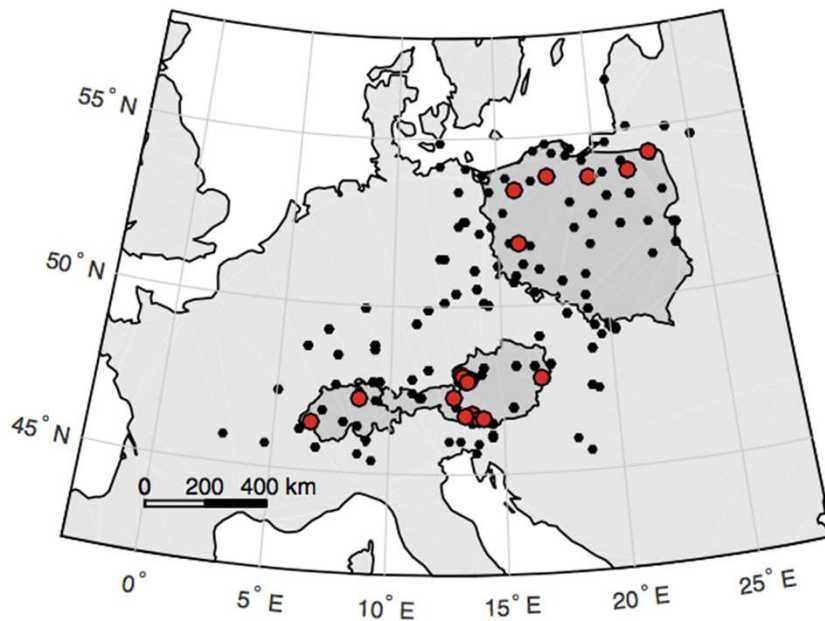


## Rapid increase in LSWT during the 1980s





# Example 2: Response of lake temperatures to a climate regime shift

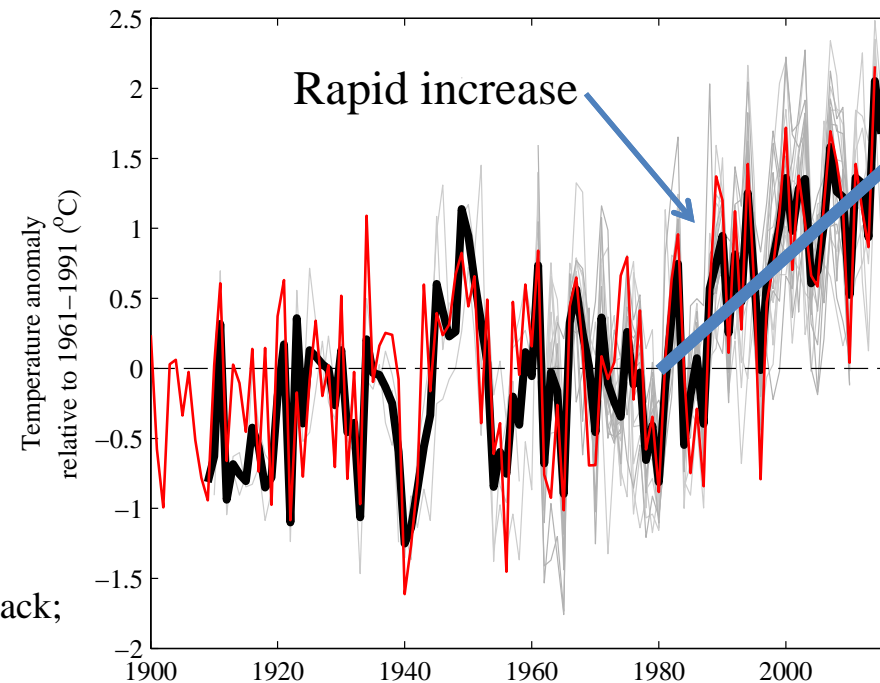


20 lakes in Central Europe

$T_{\text{air}}$  in red; regional average  $T_w$  in black;  
Individual  $T_w$  in grey.

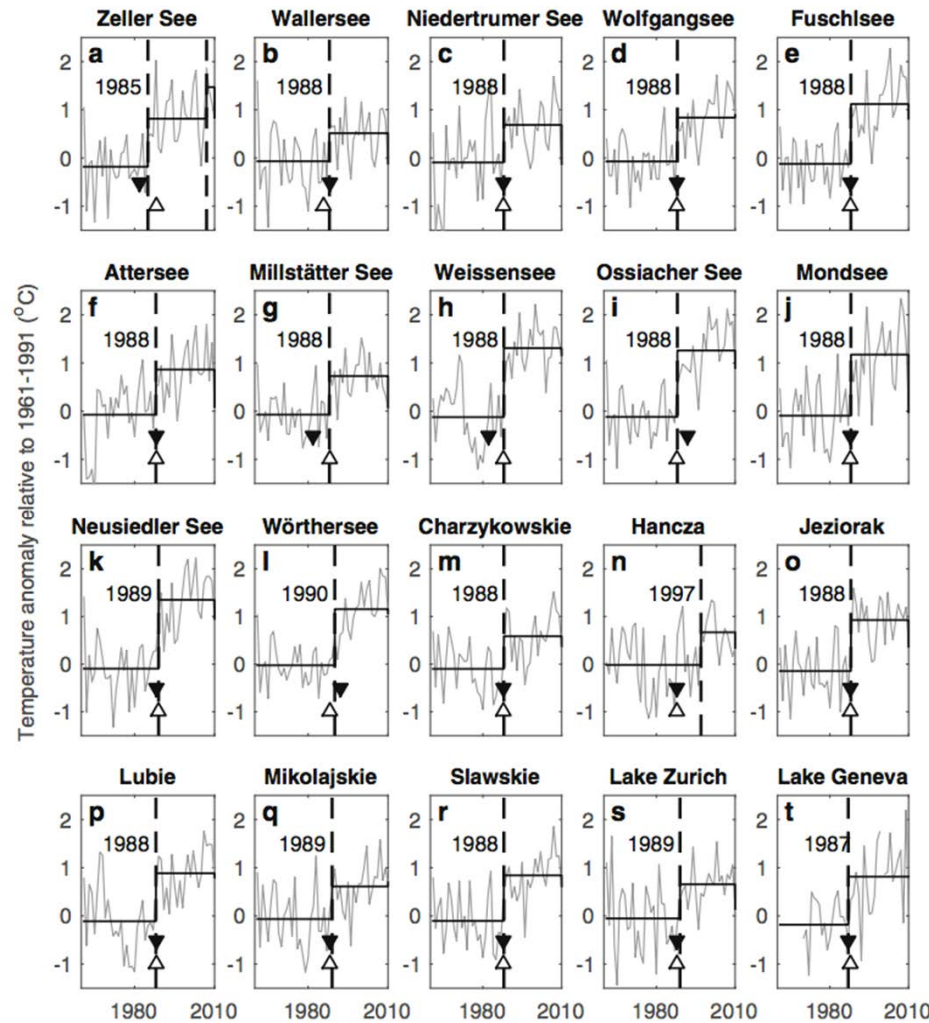
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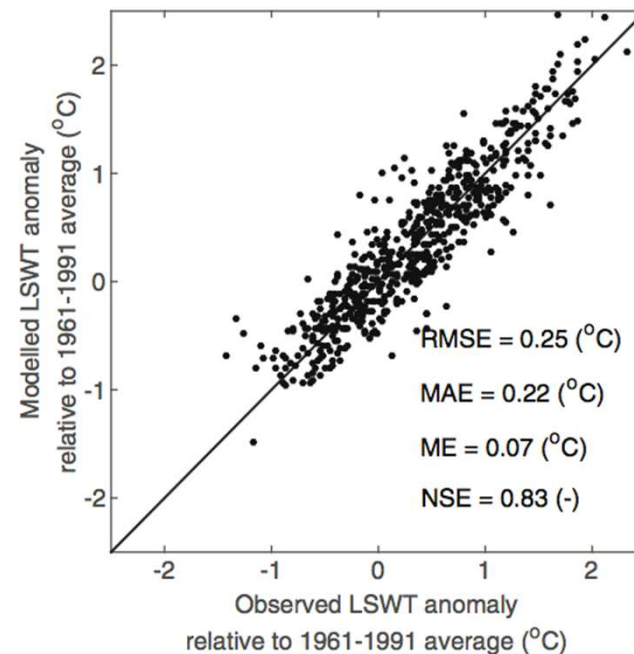
Can the Freshwater Lake Model, FLake, predict the 1980s regime shift?

# Example 2: Response of lake temperatures to a climate regime shift



Most lakes experienced an increase in LSWT during the 1980s

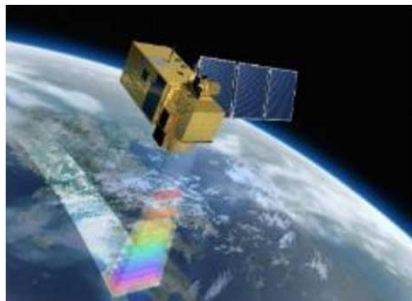
Using the FLake model, we showed that the regime shift could also be modelled from reanalysis data, thus not a result of lake specific changes.



# Modelling lakes globally - Datasets



High-resolution lake monitoring buoys



Satellite observations



Hydrological yearbooks of in situ measurements

WATER TEMP

DATE	Jan	Feb	Mar	Apr	May	June	July	Aug	Sept	Oct	Nov	Dec
1	34.0	32.0	32.0	32.0	32.0	41.5	52.0	57.0	61.0	53.0	47.0	41.0
2	34.0	32.0	32.0	32.0	32.0	44.0	51.0	58.0	61.0	55.0	49.0	41.0
3	35.0	32.0	32.0	32.0	32.0	44.0	51.0	58.0	61.0	55.0	49.0	40.0
4	35.0	32.0	32.0	32.0	32.0	45.0	48.0	58.0	61.0	55.0	49.0	40.0
5	35.0	32.0	32.0	32.0	32.0	46.0	47.0	59.0	61.0	55.0	49.0	40.0
6	35.0	32.0	32.0	32.0	32.0	47.0	47.0	59.0	61.0	55.0	49.0	40.0
7	35.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
8	35.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
9	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
10	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
11	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
12	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
13	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
14	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
15	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
16	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
17	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
18	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
19	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0
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31	34.0	32.0	32.0	32.0	32.0	48.0	48.0	60.0	61.0	55.0	49.0	40.0



Land-based weather stations

Climate reanalysis data



CECMWF



Lake bathymetry information

CMIP5

Climate projections

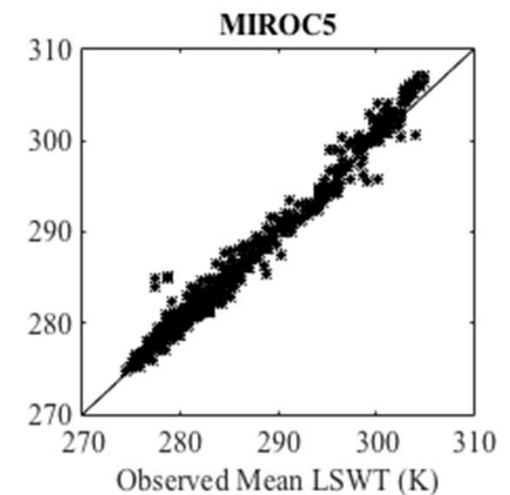
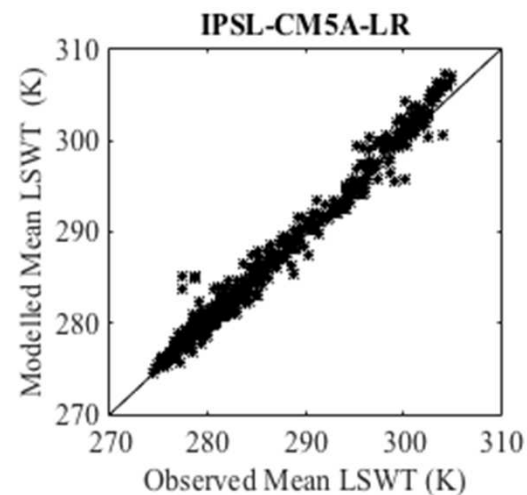
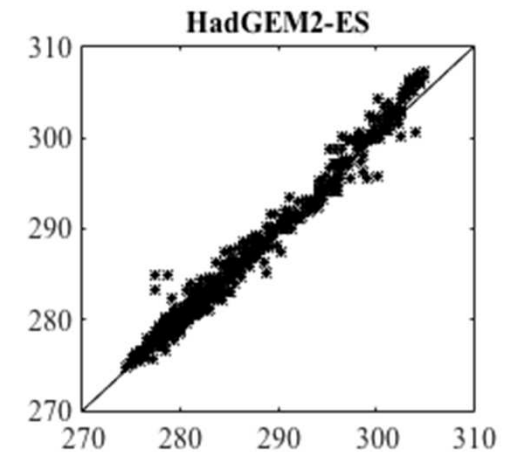
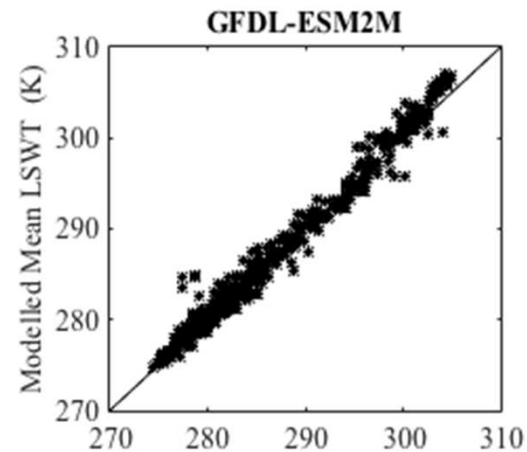




# Modelling lakes globally – Results



- ARC-Lake v3, 732 lakes
- Lake average data
- Data reconstructed twice a month
- Dates from June 1995 to Dec 2011
- Over-lake meteorological data from 4 climate projection models

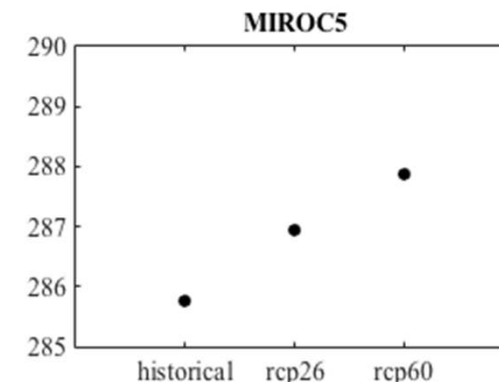
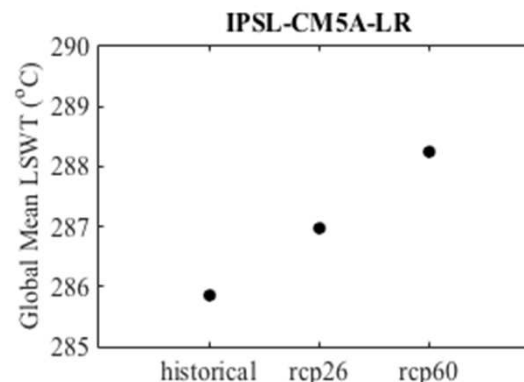
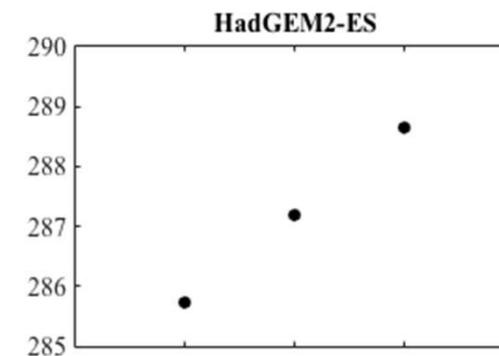
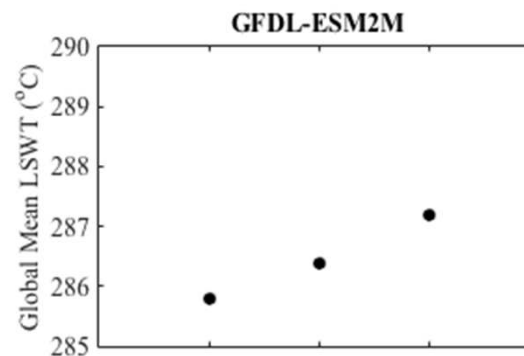


Modelled accurately during historic period

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Representative Concentration Pathway (RCP) scenarios by 2100 (RCP 2.6 = best case; RCP 6.0 = one of worst cases) – these consider how much greenhouse gases will be released in future.



# Acknowledgements



# Thank you