

# Modelling sub-daily phytoplankton dynamics and analysing primary production controls in the lower Thames catchment, UK

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# Background

- Phytoplankton blooms in rivers **degrade water quality** and **affect ecosystem structure and functioning**
- Prediction of **phytoplankton growth at shorter time-scales** is crucial to understand **rapid phytoplankton changes** as well as for **prevention of harmful blooms**
- Very **few studies have tested models** to predict sub-daily phytoplankton dynamics, often due to a lack of high-frequency monitoring data
- **High-frequency monitoring** is now possible with the development of relatively cheaper and more robust water quality sensors

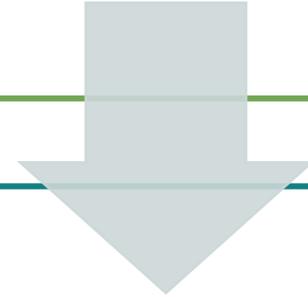
## Research questions

1. How well can models predict sub-daily phytoplankton dynamics using high-frequency monitoring data in rivers?
2. Following step 1, can we utilise these model outputs to identify physico-chemical controls on phytoplankton growth?

## 1. High-frequency data

River flows and water quality data for two years (2013-2014) were acquired for the lower River Thames from the Environment Agency (EA) and UKCEH Thames Initiative

Combination of high-frequency sensor data and weekly water quality samples were used (1) as inputs at the top site, and (2) to calibrate the model at the downstream sites



## 2. Modifying the QUESTOR model

Daily QUESTOR module modified to run at sub-daily time-steps (*QUESTOR model explained in the following slides*)

This process included residence time corrections, changes in model equations and inputs to include hourly time-step calculations

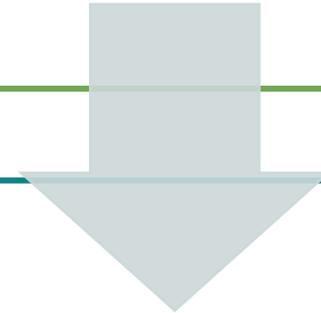
## 3. Model calibration and validation

In-stream process rates were calibrated using observed data in 2013, and the model fits were assessed for the validation run in 2014

*(Time-series of observed versus modelled determinands are shown for one site, Windsor)*

Model Goodness-of-fits were assessed using Nash-Sutcliffe Efficiency (NSE) and percentage error in mean (PBIAS)

*(Summary statistics table for all calibration sites is shown)*

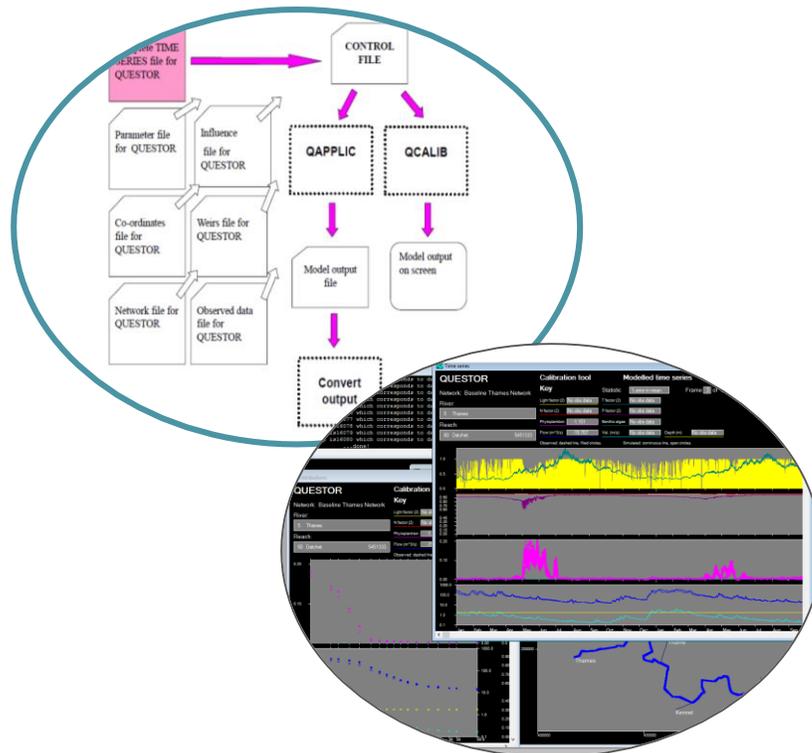


## 4. Application of model outputs

We evaluated the effect of multiple controls on phytoplankton growth including flows, water temperature and nutrients

*(Favourable flow and temperature conditions for phytoplankton growth are shown for top and bottom calibration sites)*

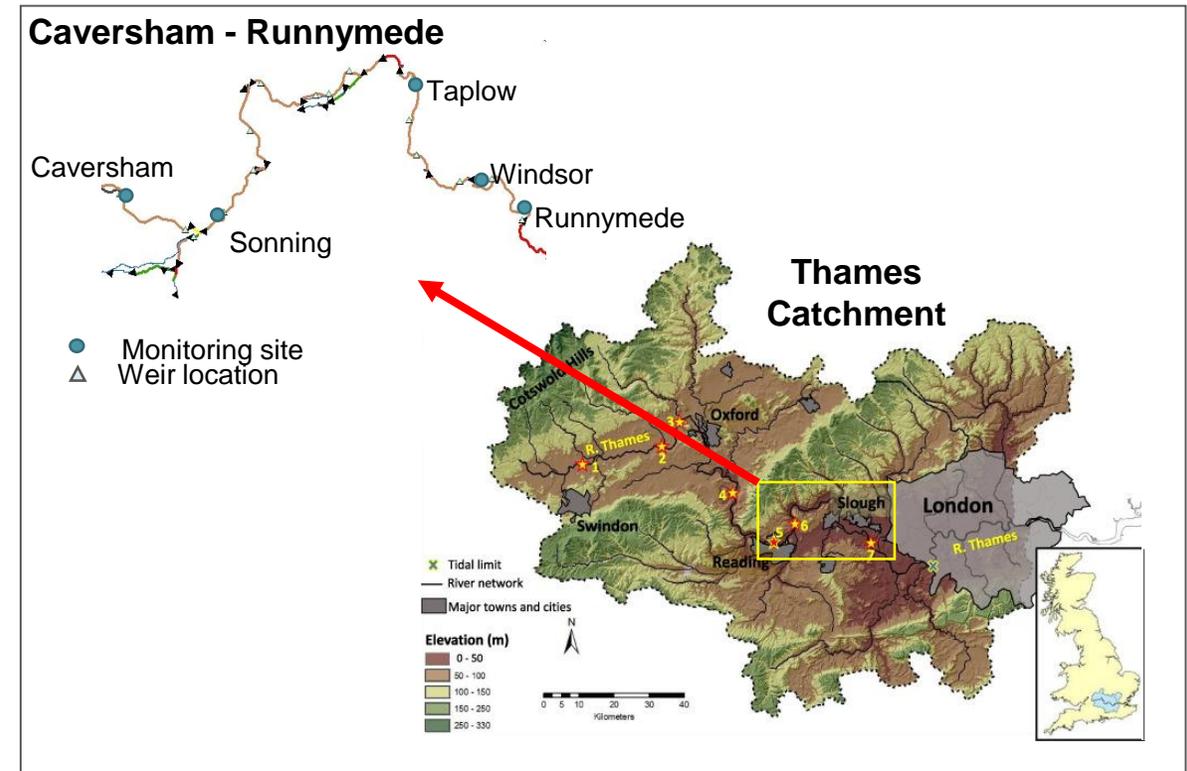
# QUESTOR (Quality Evaluation and Simulation Tool for River Systems) sub-daily model



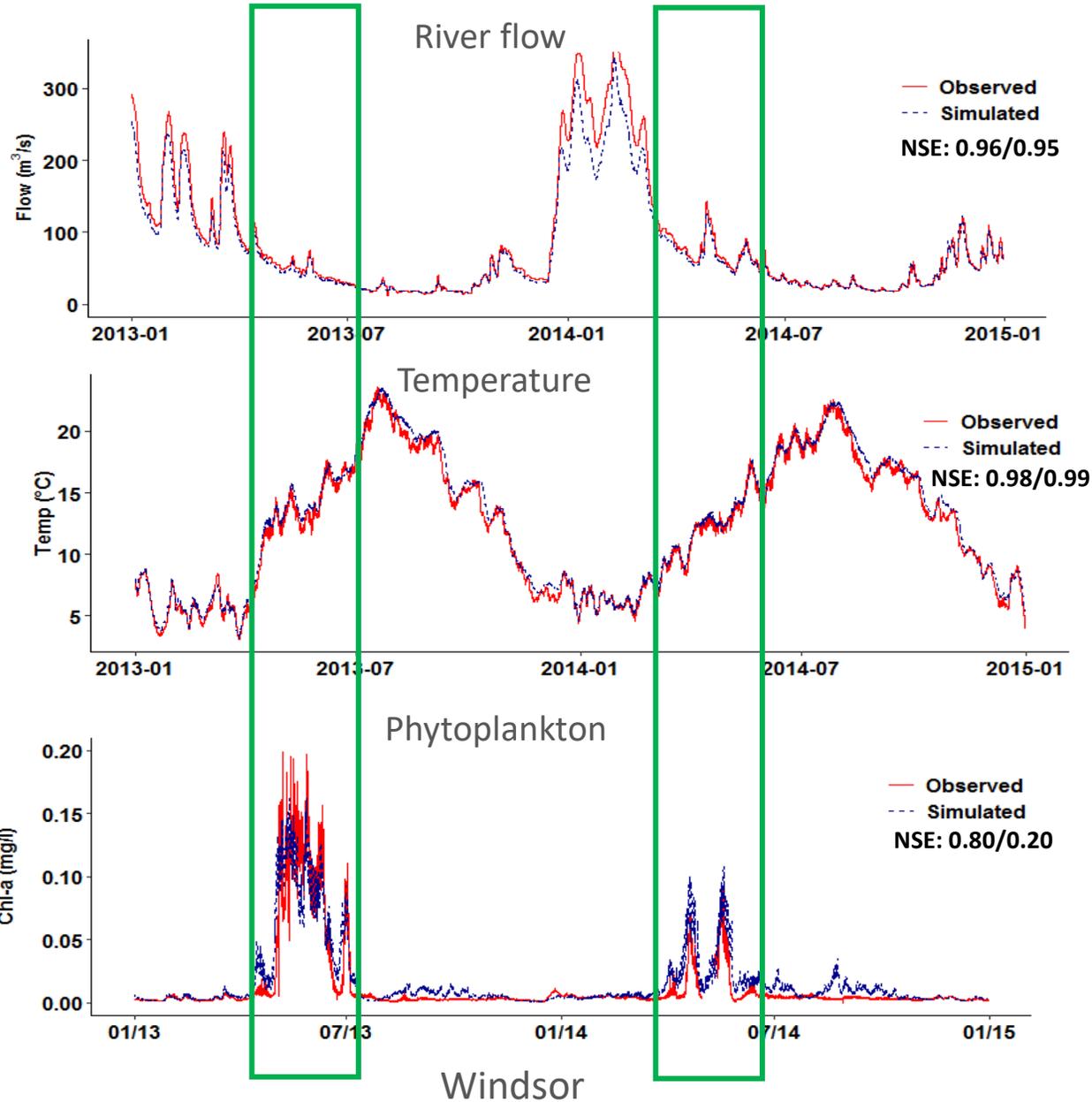
- QUESTOR is an in-stream, mechanistic water quality model that allows users to represent rivers as a network of reaches
- Simulates dynamic solute transport within the river network using 1D, ordinary differential equations with a mass-balance approach
- Equations characterise major processes affecting model determinands, but include empirical coefficients which need to be calibrated
- *S. hantzschii* version (SH module, Waylett et al. (2013)) of daily time-steps QUESTOR model is modified to simulate hourly variations in river water quality (<https://doi.org/10.1016/j.jhydrol.2013.05.027>)

# Study area

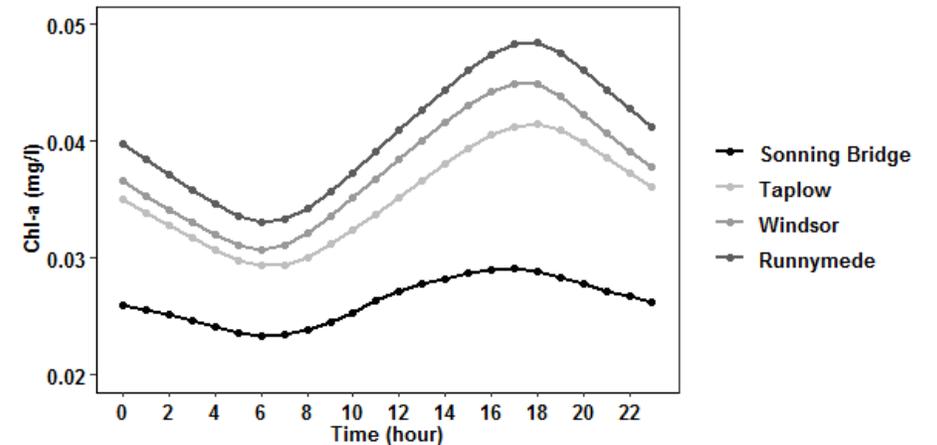
- River Thames is **highly impacted** from flow regulation through locks and weirs, abstractions, loading of pollutants from runoff and sewage discharges
- We implement the QUESTOR sub-daily model for a **62 km long stretch** of the lower Thames for a period of two years (2013-2014)
- The model simulates hourly variation and transport of in-stream **river flows, water temperature, nutrients and phytoplankton biomass**



# Comparing model outputs with observations



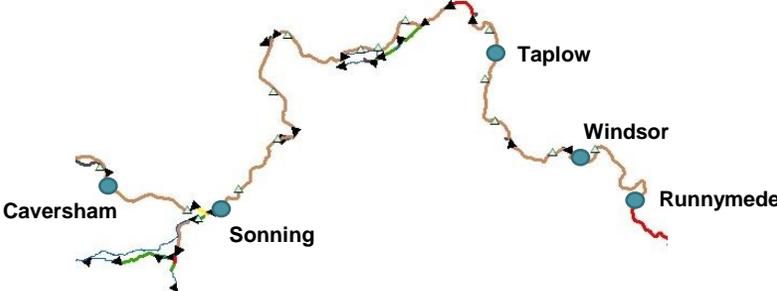
- Seasonality of flows, water temperature, and phytoplankton successfully simulated
- Phytoplankton blooms occur between April and July
- Model successfully captures the timing of blooms and crashes



Diurnal trend of modelled phytoplankton averaged over growing period (April-July)

# Model performance: summary statistics

Model performance judged by Nash-Sutcliffe Efficiency (NSE) and percentage error in mean (PBIAS) for calibration (2013) and validation (2014) periods at four downstream sites



Period	Determinand	Sonning		Taplow		Windsor		Runnymede	
		NSE (-)	PBIAS (%)	NSE (-)	PBIAS (%)	NSE (-)	PBIAS (%)	NSE (-)	PBIAS (%)
Calibration (2013) / Validation (2014)	Flow					0.96/ <b>0.95</b>	-9.88/ <b>11.58</b>		
	Temperature	0.99/ <b>0.98</b>	-2.14/ <b>-3.87</b>	0.98/ <b>0.98</b>	3.80/ <b>3.61</b>	0.98/ <b>0.99</b>	3.52/ <b>2.35</b>	0.99/ <b>0.99</b>	1.58/ <b>-0.9</b>
	Chlorophyll-a	0.81/ <b>0.78</b>	-19.9/ <b>-20.06</b>	0.87/ <b>-0.19</b>	26.16/ <b>60.93</b>	0.80/ <b>0.20</b>	12.71/ <b>76.73</b>	0.73/ <b>0.77</b>	-34.64/ <b>-16.58</b>
	Nitrate	0.21/ <b>-0.07</b>	-4.17/ <b>-5.97</b>					0.31/ <b>0.46</b>	1.74/ <b>1.55</b>
	SRP	0.77/ <b>0.80</b>	2.92/ <b>5.47</b>					0.75/ <b>0.71</b>	16.24/ <b>16.11</b>

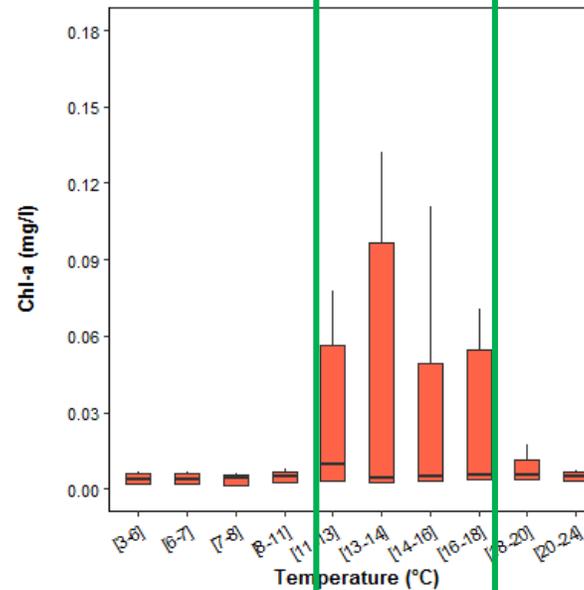
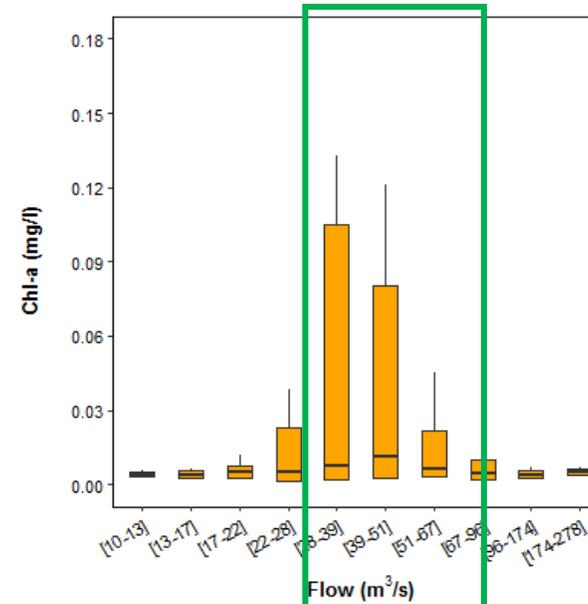
# Phytoplankton growth controls

- High **chlorophyll levels (>0.03 mg/l)** only observed within specific flow and temperature bounds
- High phytoplankton levels observed **between 21-63 m<sup>3</sup>/s**
- As the model assumes optimum **temperature**, high phytoplankton levels are simulated between **11-18° C**, which can be validated by observations
- High chlorophyll concentrations coinciding with low SRP levels and low flows suggest **phosphorus uptake by phytoplankton biomass** (figure not shown here)

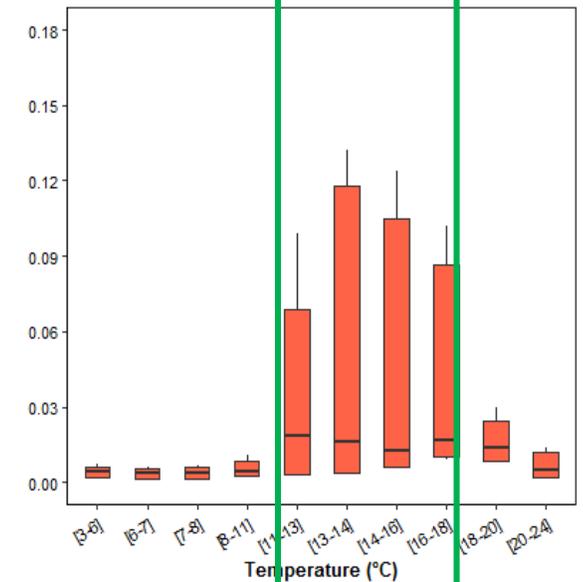
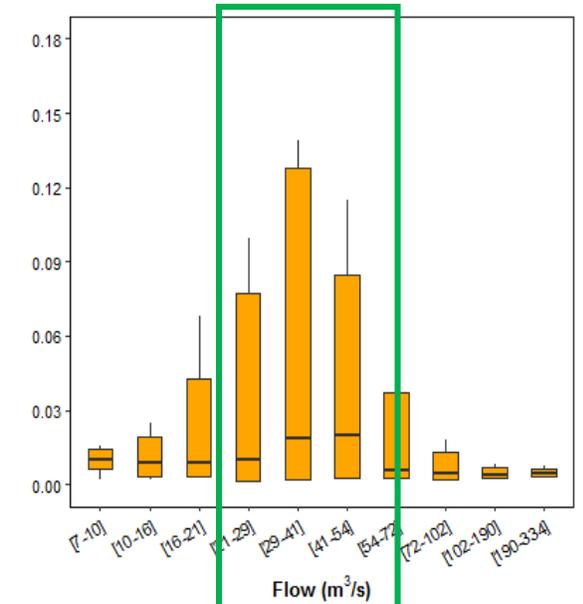
Simulated flow and temperature bounds are comparable to the observed bounds

Variable	Observed bounds		Modelled bounds		
	Caversham*	Windsor	Sonning	Windsor	Runnymede
Flow (m <sup>3</sup> /s)	<30	32-68	28-51	30-63	21-54
Temp (°C)	9-19	10-17	11-18	11-18	11-18

(\* from Bowes et al. 2016)



Sonning

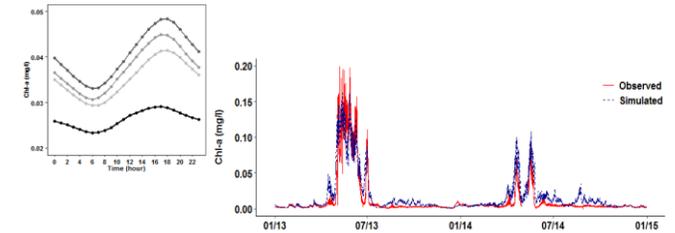


Runnymede

# Conclusion

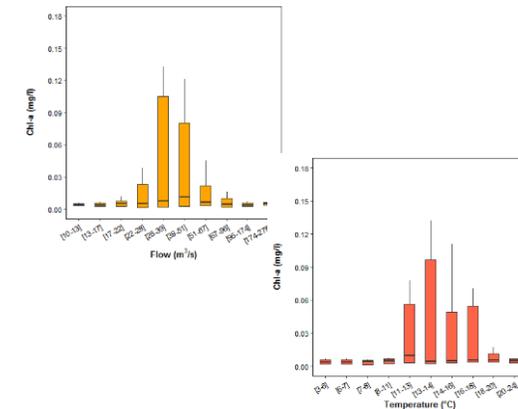
## How well can we predict sub-daily phytoplankton dynamics using high-frequency monitoring data in rivers?

- QUESTOR sub-daily model satisfactorily captures diurnal variation of phytoplankton dynamics (NSE>0.7), the magnitude and timing of bloom events, and crucial predictors for water quality management
- This is the first hourly scale phytoplankton modelling study for the River Thames, and one of the first model testing of hourly response at such a wide temporal (2 year) and spatial (> 50 km) extent



## Can we utilise model outputs to identify physico-chemical controls on phytoplankton growth?

- Flow and temperature bounds (21-63 m<sup>3</sup>/s and 11-18° C, respectively) identified within which high concentrations of chlorophyll (>0.03 mg/l) occur
- Physical controls are the main limiting factors in the lower Thames, with some nutrient limitation from phosphorus depletion in summer
- Environmental thresholds identified here can be used for preventing algal growth from developing into a major bloom



# Thank you

## Acknowledgements

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