

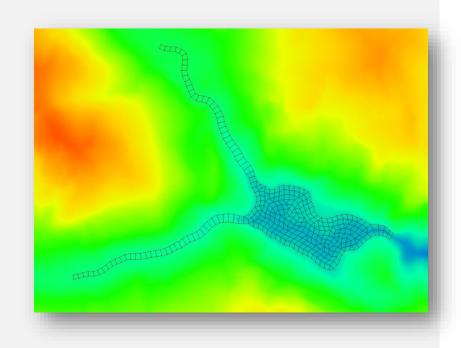
Simulation, modelling and analysis of the living water system:
Improving our beneficial return on investment

Modelling Symposium 2024 Christchurch - Workshop 1 12th March 2024

#### Workshop 1 Agenda

#### This afternoon (very roughly)

- 3:00 3:05: Introductions and intent
- 3:05 3:20: The hypothetical
- 3:20 3:30: Peer review: sediment
- 3:30 4:00: Peer review: dissolved oxygen
- 4:00 4:20: Peer review: chlorophyll a
- 4:20 onwards: Key messages and wrap







### Introductions

### Workshop 1 Introductions

#### **Michael Barry**

- · Based in Brisbane, Australia
- Undergrad degrees and PhD from the University of Western Australia
- 28 years industry experience
  - Environmental hydrodynamic and water quality modelling
  - Systems analysis
- 5 years at TUFLOW





### Workshop 1 Introductions

#### **Mitchell Smith**

- · Based in Brisbane, Australia
- Undergrad degrees from the University of QLD and University of Southern QLD
- 18 years consulting experience
  - Coastal hazards
  - Flooding
  - Environmental modelling
- 9 years at TUFLOW





### **Workshop intent**

### Workshop 1 Intent

#### Workshop

- Use a hypothetical environmental system and model to explore ways to improve beneficial return on modelling investment
- Support better management of the living water system
  - Use of model predictions beyond traditional timeseries
  - Ways and tools to engage more broadly and effectively
- Explore use of models for understanding (not just compliance)
- Ways to save time and money in the calibration process
- Materials for group use on tables





### The hypothetical

#### The premise

- A (made up) New Zealand water supply reservoir has a recurrent January phytoplankton bloom problem, with dissolved oxygen issues at depth
- A 3D hydrodynamic and water quality model has been built and 'calibrated' to assist in managing/remediating the reservoir and/or catchment from which it drains
- Michael and I are the modelling Project Managers
- You are all peer reviewers of our company's model, acting on behalf of the customer
- Goal is to approve the model for scenarios and therefore management assessment
  - Is the model "right" or "fit for purpose"?





#### The premise

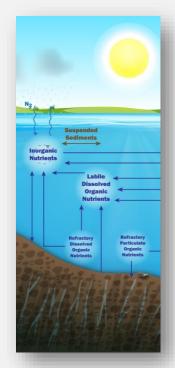
- Michael and Lare
  - Out of time
  - Out of money
- You are all peer reviewers of our model, acting on behalf of the customer
  - Peer review has been left to the 11<sup>th</sup> hour
  - No prior involvement in the modelling
  - You (rightfully!) have high standards







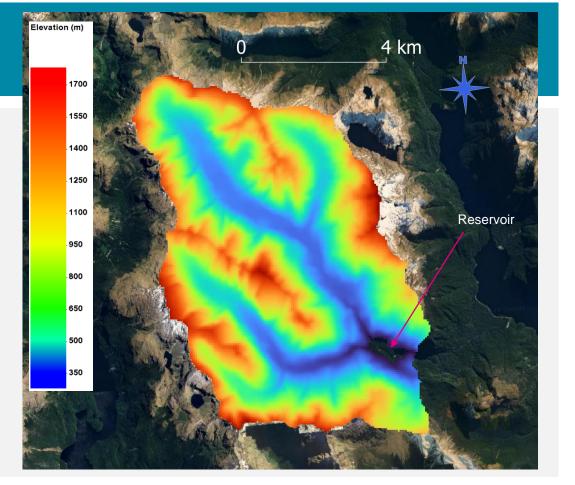
- Catchment
  - 5473 hectares
  - 2534, 2397 and 542 ha forest, agriculture and urban
  - ~700mm annual rainfall
- Reservoir
  - 200 hectare surface area
  - Maximum depth ~35m
  - One offtake and two legacy point source discharges







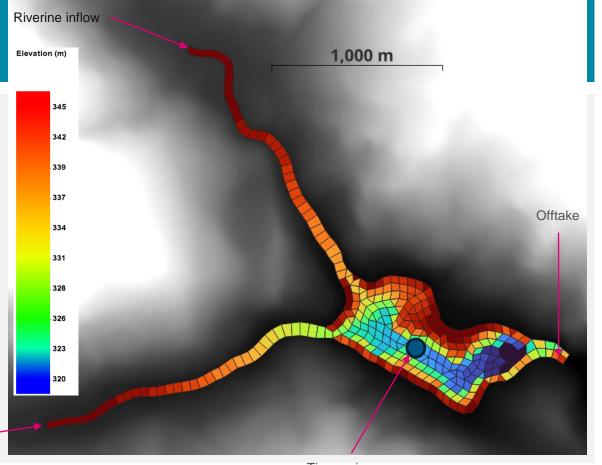
- Catchment
  - 5473 hectares total
  - 2534 ha forest,
  - 2397 ha agriculture
  - 542 ha urban
  - ~700mm annual rainfall







- Reservoir
  - 200 hectares
  - Maximum depth ~35m
  - One offtake and two legacy point source discharges











- Known issues
  - Summer (January) algal blooms
  - Low dissolved oxygen at depth
  - Sedimentation from catchments
  - Catchment is very poor in organics
  - Sludge exists at the bottom of the reservoir
  - Urbanisation has made green blooms much worse
  - Nitrates are high at the downstream water treatment plant

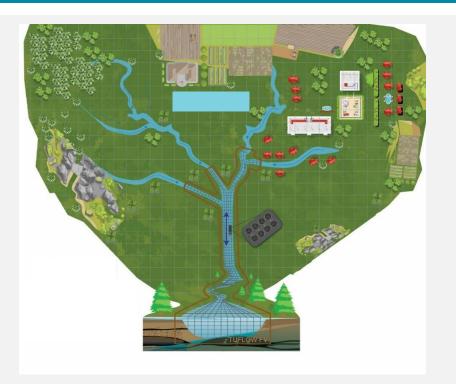






#### The system

 Build a system model to assist management







#### The modelling system

- 1 month simulation (usually would do more!)
- High spatial and temporal resolution throughout
- Seamlessly integrated catchment and receiving water quality model

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TUFLOW HPCTUFLOW Catch
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#### The model

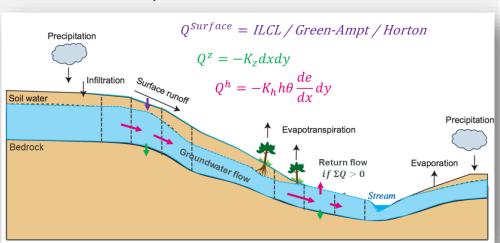
Catchment

• Fixed grid, direct rainfall, solves equations of motion to predict surface and subsurface

hydrology on a 50m cell

 Pollutant accumulation and washoff model (user parameterised) also on 50m cell

 Automatic linkage of simulated flows and loads of speciated constituents to receiving model

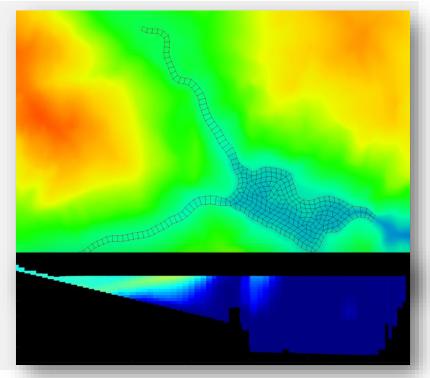






#### The model

- Receiving
  - Flexible mesh
  - 3D HD (water surface, velocity, temperature, suspended sediment), multiple vertical layers
  - 3D water quality (oxygen, inorganic and organic nutrients, one phytoplankton)
  - Would normally have higher spatial resolution in inflows – suitable for demonstration
  - ~ 25 x 3D layers at 1m vertical resolution





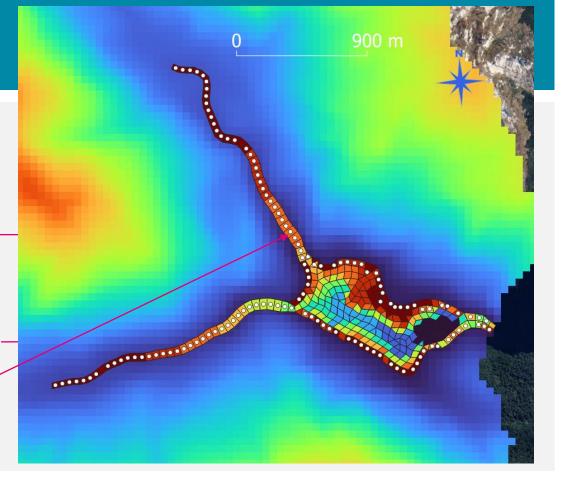


The model

**TUFLOW HPC Domain** 

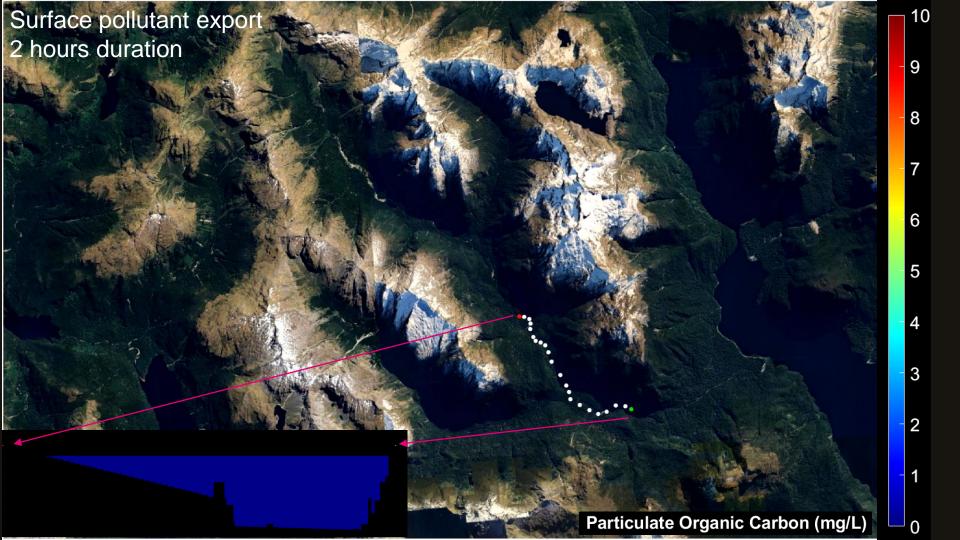
TUFLOW FV Domain

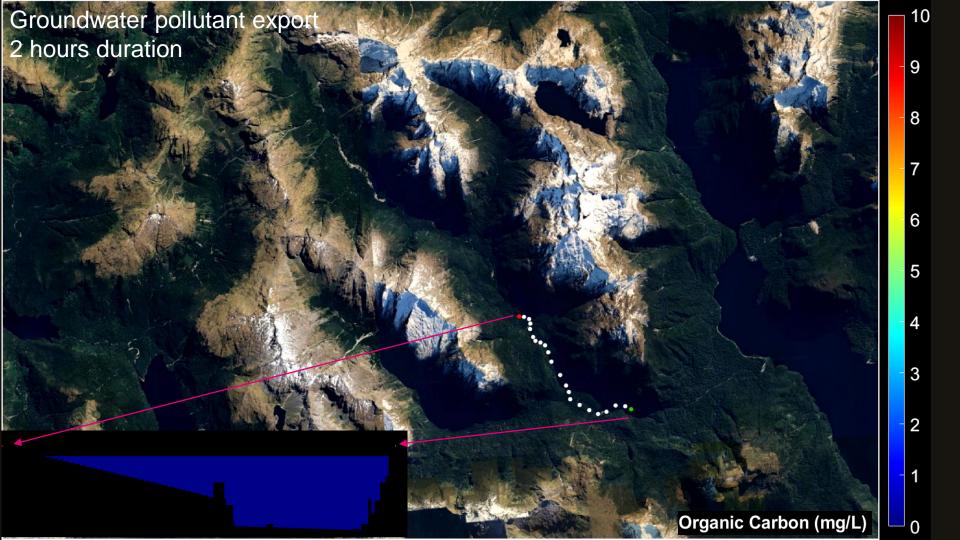
Automatically determined connection boundary points (white dots)







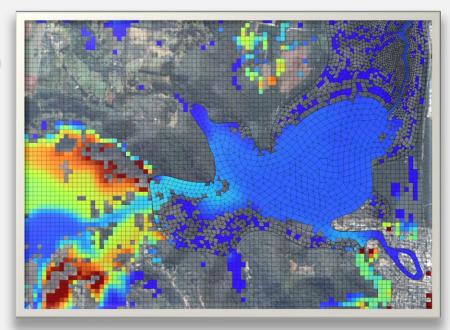






#### The model

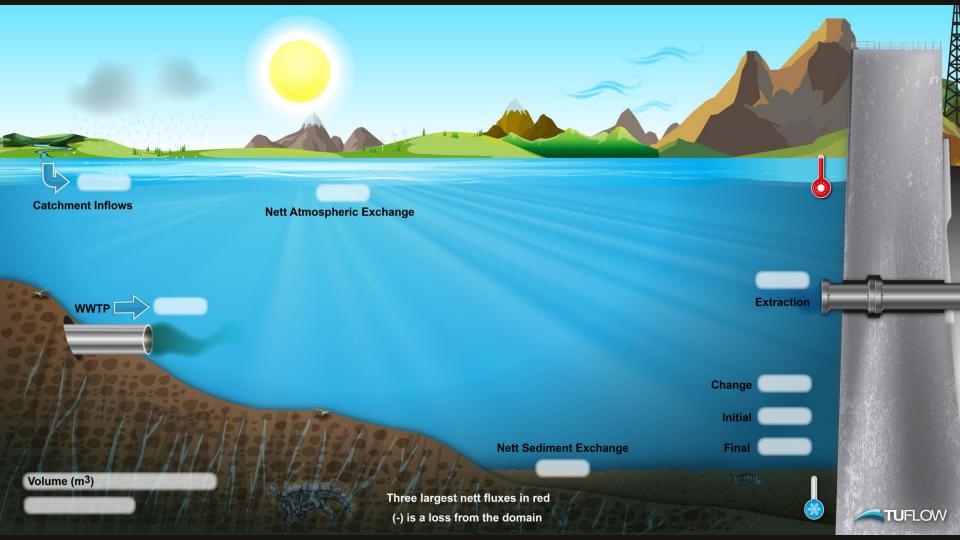
- Could look at all constituents, but focus on
  - Volume
  - Suspended sediment
  - Dissolved oxygen
  - Phytoplankton

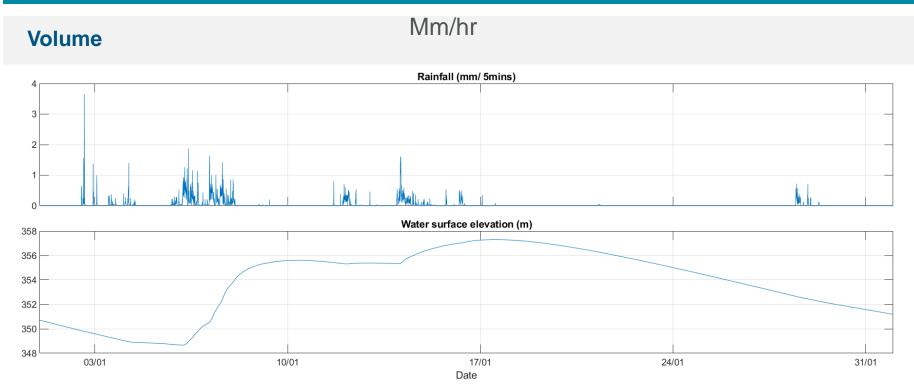






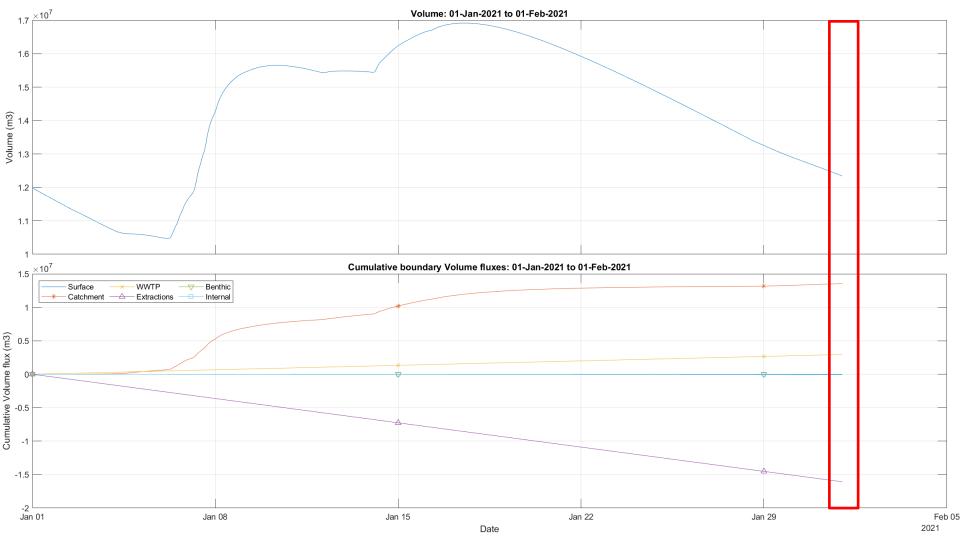
# The hypothetical: Volume

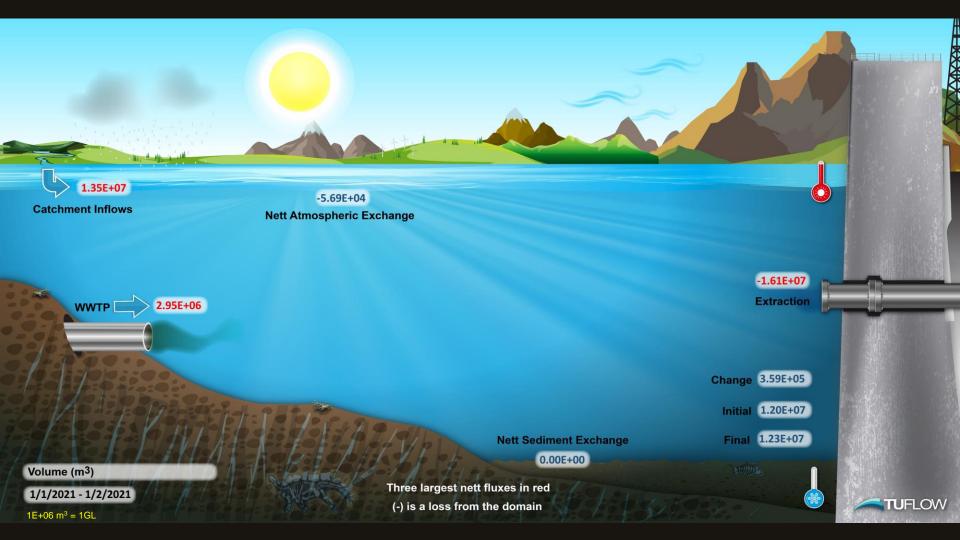






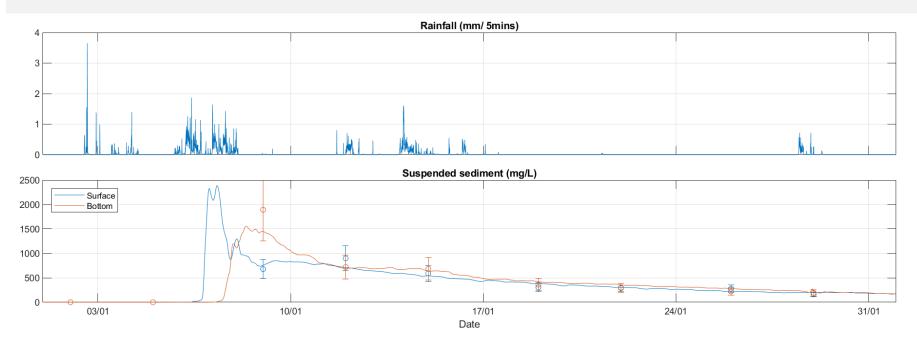






# The review: Suspended sediment

#### **Sediment concentration timeseries**







#### **Sediment concentration stats**

- Prediction / calibration of concentrations
- Moriasi et al. 2015 and others
  - Very good
  - Good
  - Satisfactory
  - Not satisfactory

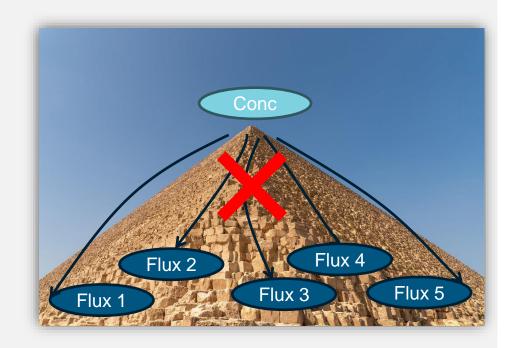
Metric	Value
R	0.98
R2	0.96
NSE	0.92
IOA	0.98
RMSE	122
MAE	69
PBIAS	4.5





#### **Sediment**

- Solutions
  - Where in the catchment do we work?
  - Integrated model allows us to look at fluxes (what we are really trying to fix)

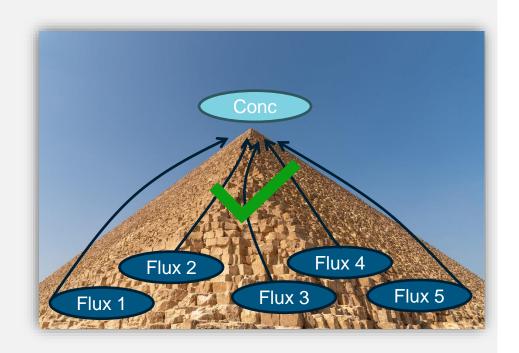






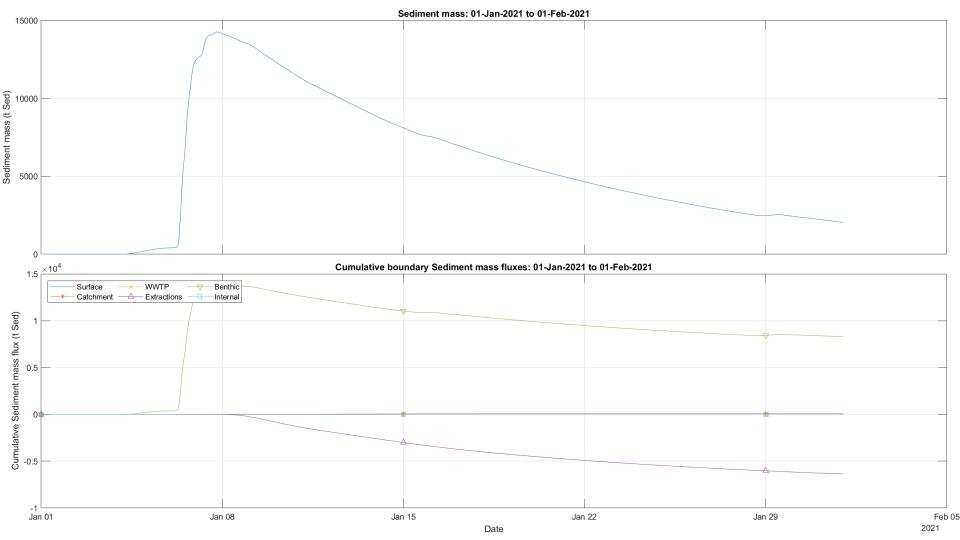
#### **Sediment**

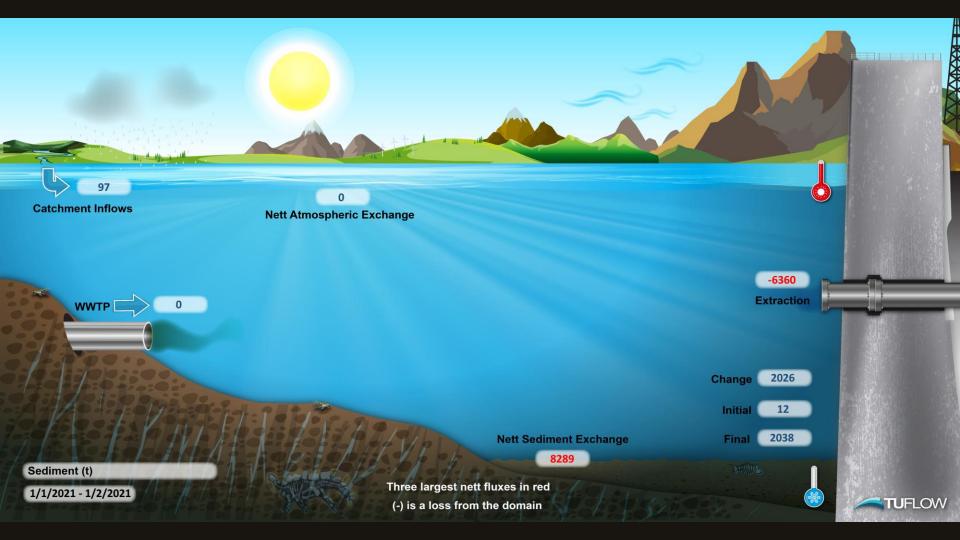
- Solutions
  - Where in the catchment do we work?
  - Integrated model allows us to look at fluxes (what we are really trying to fix)
  - Examine standing mass and fluxes





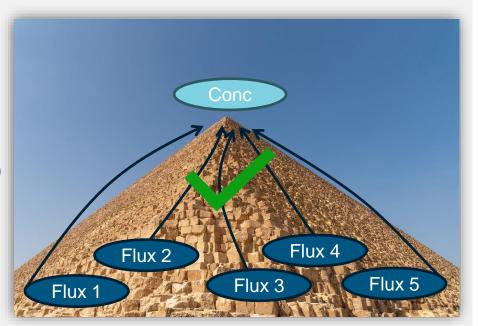






#### **Sediment**

- Solutions
  - Where in the catchment do we work?
  - The rivers!
  - Wasteful scenarios (avoiding disbenefits)
  - Wasteful calibration time
- Sources
  - Ongoing delivery from catchments?
  - Bank erosion? Scour?







# The review: Dissolved oxygen

- Prediction / calibration of concentrations
- Four modellers
  - Richie
  - Phoenix
  - Rod
  - Beth





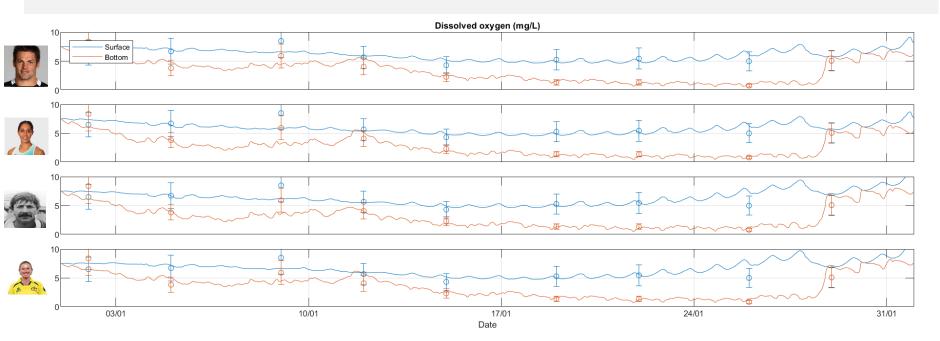








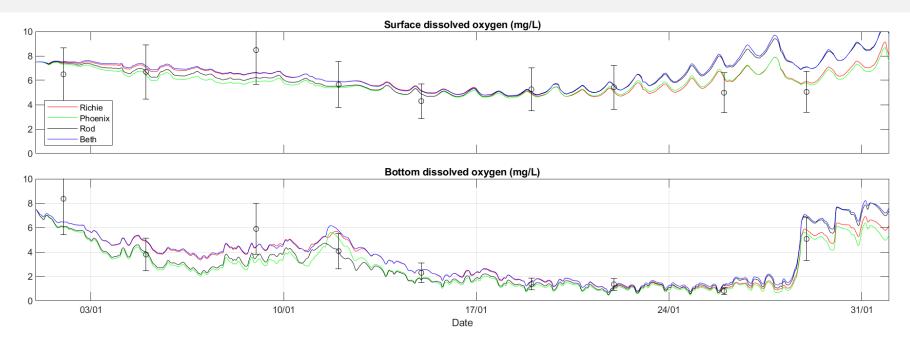
#### **Dissolved oxygen concentration timeseries**







#### **Dissolved oxygen concentration timeseries**







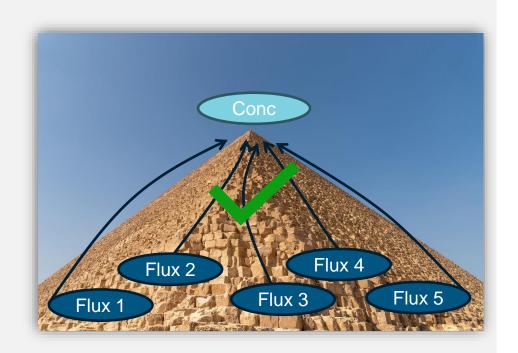
- Prediction / calibration of concentrations
- Moriasi 2015
  - Very good
  - Good
  - Satisfactory
  - Not satisfactory

Metric	Richie	Phoenix	Rod	Beth
R	0.89	0.85	0.81	0.83
$R^2$	0.79	0.72	0.66	0.69
NSE	0.78	0.70	0.63	0.65
IOA	0.93	0.91	0.90	0.90
RMSE	1.0	1.2	1.3	1.3
MAE	0.8	0.8	0.9	1.0
PBIAS	-2.8	5.4	-0.4	-8.8



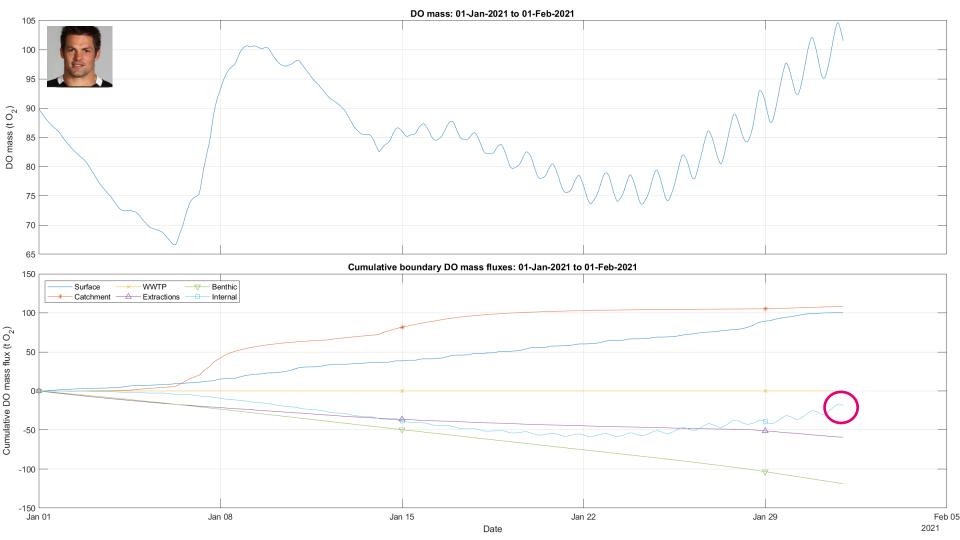


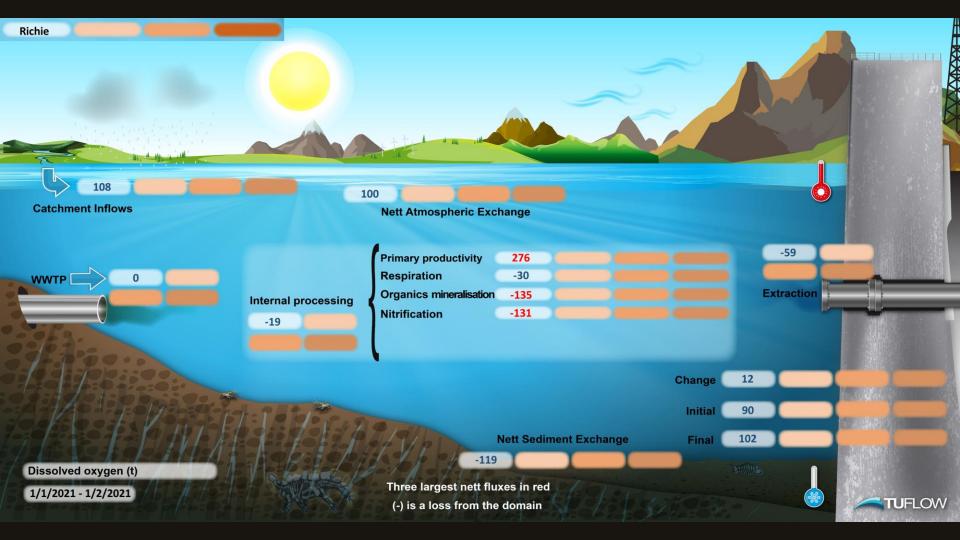
- But how to these concentrations come about?
  - TUFLOW FV WQ module reports diagnostics: fluxes of every mass in every process
  - Let's have a look at dissolved oxygen!





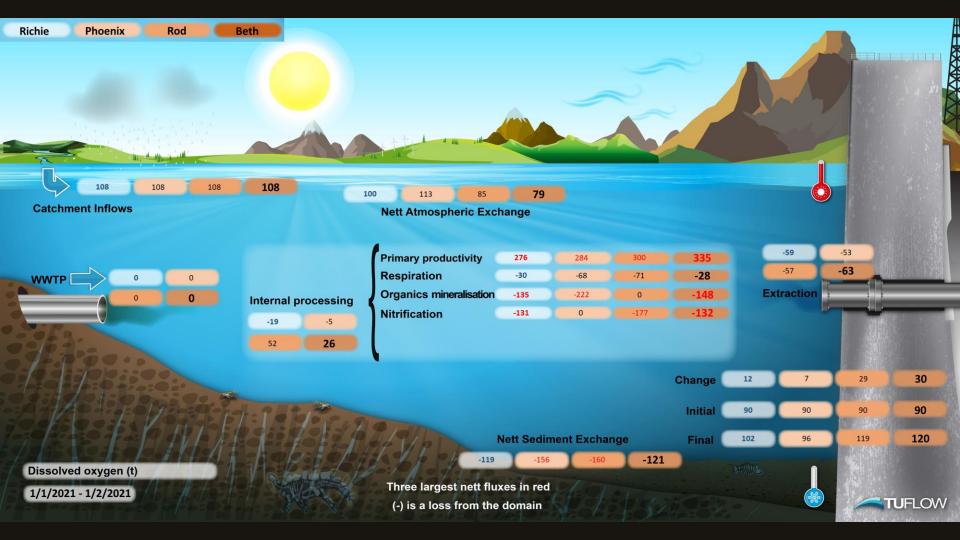






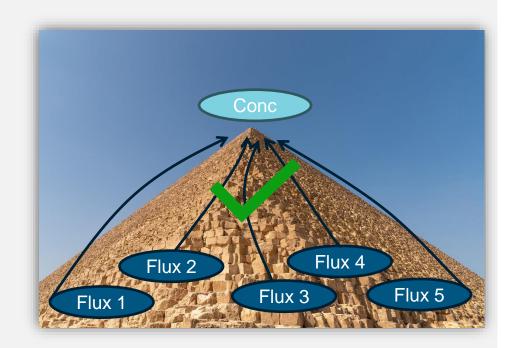






- Solutions
  - Our modellers have the right answers for the wrong reasons!
  - So what do we do?
- Engage and understand via flux diagnostics discussion to understand
  - Managers and decision makers
  - Traditional owners



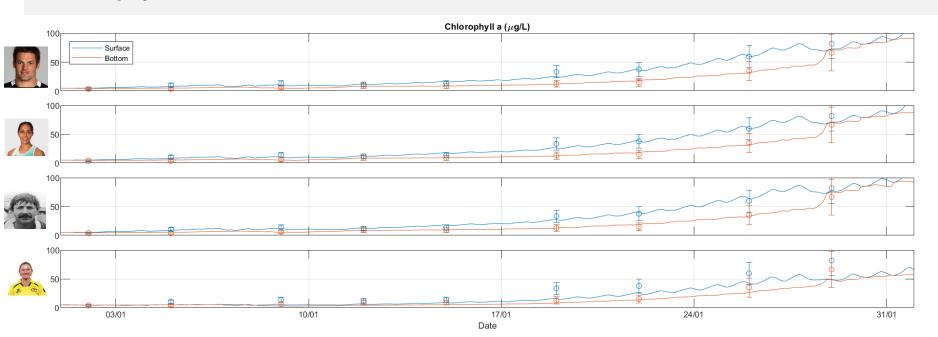






# The review: Chlorophyll a

#### Chlorophyll a







#### Chlorophyll a

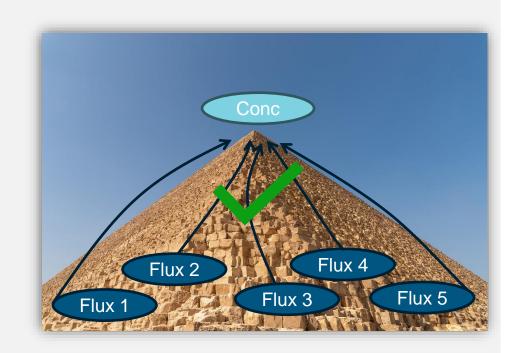
- Prediction / calibration of concentrations
- Moriasi 2015
  - Very good
  - Good
  - Satisfactory
  - Not satisfactory

Metric	Richie	Phoenix	Rod	Beth
R	0.99	0.99	0.98	0.98
$R^2$	0.98	0.98	0.97	0.96
NSE	0.97	0.97	0.98	0.77
IOA	0.99	0.99	0.99	0.91
RMSE	3.5	3.6	3.5	11.6
MAE	2.4	2.4	2.5	8.3
PBIAS	2.5	2.3	-3.0	34



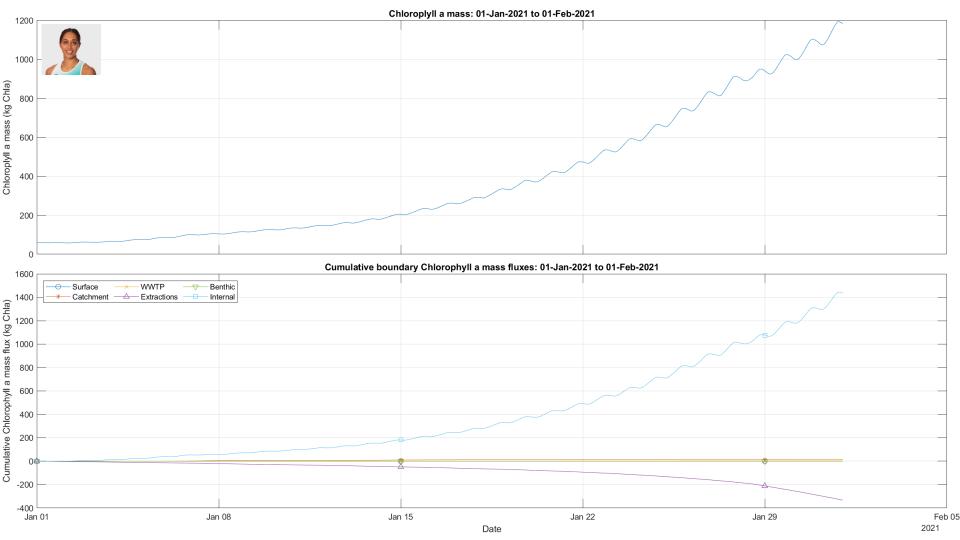


- But how to these concentrations come about?
  - TUFLOW FV WQ module reports diagnostics: fluxes of every mass in every process
  - Let's have a look at chlorophyll a!





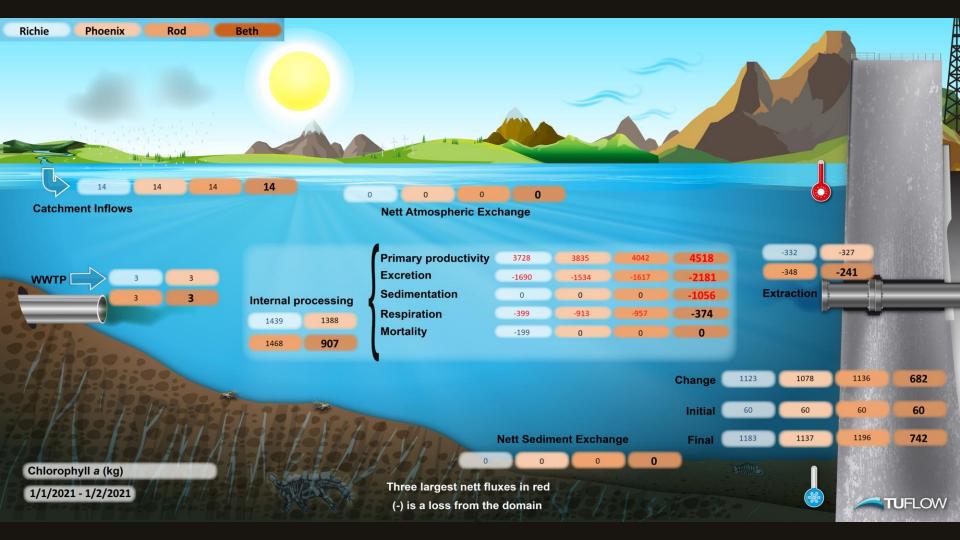






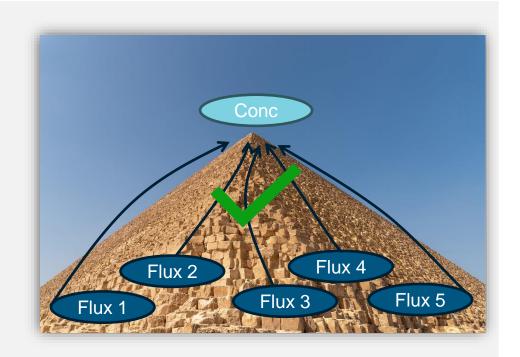






#### Chlorophyll a

- Solutions
  - Our modellers have good enough answers for the wrong reasons!
  - Which one is more correct, if any?
- As with DO
  - Time to engage
  - Managers and decision makers
  - Traditional owners







### The verdict

### Workshop 1 The verdict

#### Declan

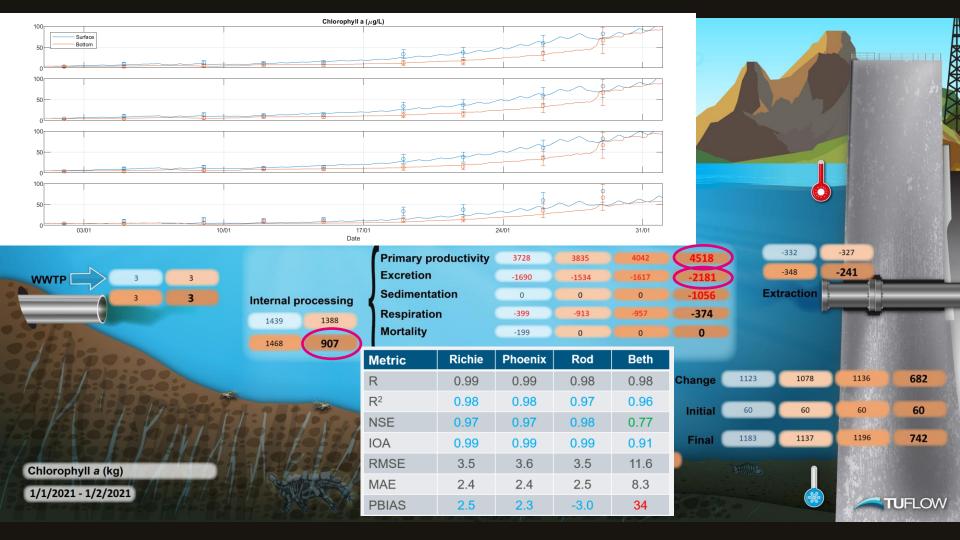
- 50 years living in the catchment and working at the treatment plant
  - It is very poor in organics
  - Sludge exists at the bottom of the reservoir
  - Urbanisation has made green blooms much worse
  - Nitrates are high at the downstream water treatment plant
- Who does Declan go with?
- As peer reviewers what do you now do?





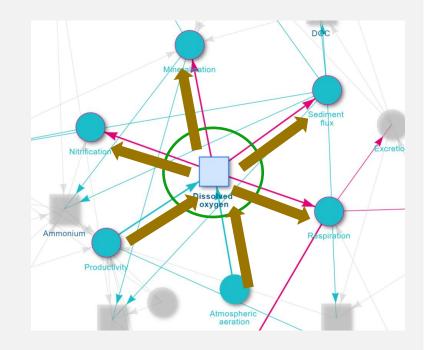


### The wrap



#### **Outcomes**

- Simulation, modelling and analysis of the living water system: Improving our beneficial return on investment
- Models offer richness of data
- Compliance (past and future)
  - Timeseries (necessary but not sufficient)
  - Statistics (necessary but not sufficient)
- Understanding and beneficial return (future)
  - Fluxes (should be mandatory)







#### **Concentrations and fluxes**

- Not new
  - Hipsey et al. (2020)



Environmental Modelling & Software

Volume 128, June 2020, 104697



A system of metrics for the assessment and improvement of aquatic ecosystem models

Matthew R. Hipsey <sup>a b</sup> △ ⋈, Gideon Gal <sup>c</sup>, George B. Arhonditsis <sup>d</sup>, Cayelan C. Carey <sup>e</sup>,

J. Alex Elliott <sup>f</sup>, Marieke A. Frassl <sup>g</sup>, Jan H. Janse <sup>h</sup>, Lee de Mora <sup>i</sup>, Barbara J. Robson <sup>j</sup>





#### **Concentrations and fluxes**

- Comparing model concentration timeseries with point field measurements (or medians, or by zones) actively excludes understanding
  - Wasteful scenarios (avoiding disbenefits)
  - Wasteful calibration time often the major project and community resource sink
  - Get the right answers for the wrong reasons
  - End up arguing over modelled timeseries and measured points not matching





#### **Concentrations and fluxes**

- Understanding mass fluxes through environmental systems is essential to effective management
  - This is the substantial opportunity to improve on the beneficial return on investment we make in the living water system







### Thank you

## Appendix: Background science

#### Internal processes – dissolved oxygen

Atmospheric exchange (https://docs.tuflow.com/fv/wqm/manual/2023/AppO.html#AtmosphericAeration-3)

Atmospheric oxygen flux is a key source of water column dissolved oxygen. Oxygenation is implemented in the upper model layer by the WQ Module, and then this oxygenated water is mixed downwards by TUFLOW in subsequent timesteps.

Initially, a Schmidt number  $Sc_{atm}^{O_2}$  is computed via Equation (D.1).

$$Sc_{atm}^{O_2} = \left(0.9 + \frac{S}{350.0}\right) \times \left(2073.1 - 125.62T + 3.6276T^2 - 0.043219T^3\right)$$
 (D.1)

T and S are ambient water temperature and salinity respectively. An oxygen piston velocity  $V_{pist}^{O_2}$  (also known as a gas transfer velocity) is then computed. Two piston models for  $V_{mist}^{O_2}$  are available. The first is due to Wanninkhof (1992):

$$V_{pist}^{O_2} = 0.31 \left(V_{wind}^{O_2}\right)^2 \times \left(\frac{660.0}{Sc_{atm}^{O_2}}\right)^x$$
 (D.2)

where  $V_{wind}^{O_2}$  is wind speed. For wind speed  $V_{wind}^{O_3}$ <0.0 m/s, x is 0.66, otherwise x is 0.5. Wind speed is assumed to be provided from TUFLOW at 10 metres from the water surface. The second is due to Ho et al. (2016):

$$V_{pist}^{O_2} = \left(0.77 \sqrt{\frac{V_{water}}{H_{layer}}} + 0.266 \left(V_{wind}^{O_2}\right)^2\right) \times \sqrt{\frac{660.0}{Sc_{atm}^{O_2}}}$$
(D.3)

where  $V_{water}$  is surface water speed,  $H_{layer}$  is the thickness of the uppermost TUFLOW FV computational layer and  $V_{wind}^{O_2}$  is wind speed.

There are other models available for computing both  $Sc_{atm}^{O_2}$  and  $V_{pist}^{O_2}$  within the WQ Module. Contact support@tuflow.com if these are required.

Once  $Sc_{atm}^{O_2}$  and  $V_{pist}^{O_2}$  are known, oxygenation to the surface layer is computed as per Equation (D.4).





#### Internal processes – dissolved oxygen

• Sediment flux (https://docs.tuflow.com/fv/wqm/manual/2023/AppO.html#SedOxyCons-3)

Oxygen is exchanged between the water column and sediments via specification of a sediment flux representing the net effect of biological activity. In the case of oxygen, this flux is most commonly into the sediments, i.e. a negative sediment flux. Although it is rare that sediments act as sources of oxygen, the WQ Module can be parameterised to allow for this if required.

The user specified sediment oxygen flux (which can be spatially varying) is modified by overlying ambient dissolved oxygen concentration (together with a user specified half saturation oxygen concentration) and water temperature. These modifications are simulated via Michaelis-Menten and Arrhenius models, respectively, as per Equation (D.6).

$$F_{sed \langle computed \rangle}^{O_2} = F_{sed}^{O_2} \times \underbrace{\frac{[DO]}{K_{sed-O_2}^{O_2} + [DO]}}_{\text{Influence of oxygen}} \times \underbrace{\left[\theta_{sed}^{O_2}\right]^{(T-20)}}_{\text{Influence of temperature}} \tag{D.6}$$

 $F_{sed}^{O_2}$  is the user specified oxygen sediment flux at 20°C without the influence of dissolved oxygen, [DO] is the overlying dissolved oxygen concentration computed by the WQ Module,  $K_{sed-O_2}^{O_2}$  and  $\theta_{sed}^{O_2}$  are the half saturation oxygen concentration and temperature coefficient for dissolved oxygen sediment flux respectively, and T is ambient water temperature.





#### Internal processes – dissolved oxygen

- Primary productivity (https://docs.tuflow.com/fv/wqm/manual/2023/PhyRates-3.html#PhyProd-4)
  - Primary productivity is the consumption of carbon and the generation of oxygen and carbohydrate due to photosynthesis. Photosynthetically active radiation
    catalyses this process so it occurs only during daylight hours. This process is also referred to as growth or gross primary productivity

$$C + O_2 \leftarrow CO_2$$

- Respiration (https://docs.tuflow.com/fv/wqm/manual/2023/PhyRates-3.html#PhyResp-4)
  - Respiration is the consumption of oxygen and stored carbohydrate and the production of carbon. This can be thought of as the reverse of primary
    productivity. Respiration dominates phytoplankton dynamics during nighttime hours, although it generally still operates during the daytime

$$C + O_2 \rightarrow CO_2$$





#### Internal processes – dissolved oxygen

• Organics mineralisation (https://docs.tuflow.com/fv/wqm/manual/2023/AppOrg.html#Miner-3)

Mineralisation is the pelagic biological conversion of labile dissolved organic matter to dissolved inorganic carbon and nutrients. It is therefore a source of dissolved inorganic carbon, ammonium and filterable reactive phosphorus, and a sink of the corresponding labile dissolved organics. Mineralisation is conceptualised as comprising aerobic (i.e. consuming dissolved oxygen and (via denitrification) inorganic nitrate) and anaerobic components, and is implemented within the labile organics constituent model of the WQ Module.

• **Nitrification** (https://docs.tuflow.com/fv/wqm/manual/2023/AppOrg.html#Miner-3)

Nitrification is the pelagic biological oxidation of ammonium to nitrate. The equations representing this process (including intermediates) are as follows.

$$\left. \begin{array}{c} 2NH_4^+ + 3O_2 \rightarrow \!\! 2NO_2^- + 4H^+ + 2H_2O \\ \\ 2NO_2^- + O_2 \rightarrow \!\! 2NO_3^- \end{array} \right\}$$





#### Internal processes – phytoplankton

- Primary productivity (https://docs.tuflow.com/fv/wqm/manual/2023/PhyRates-3.html#PhyProd-4)
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    productivity. Respiration dominates phytoplankton dynamics during nighttime hours, although it generally still operates during the daytime

$$C + O_2 \rightarrow CO_2$$





#### Internal processes – phytoplankton

Excretion (https://docs.tuflow.com/fv/wqm/manual/2023/PhyLosses-3.html#PhyLossC-4)

Excretion loss: Computed from a combination of respiration and exudation rates ( $R^{phy}_{resp(computed)}$  and  $R^{phy}_{exud(computed)}$ , respectively)

$$F^{phy}_{C-excr} = \left( \left[ \left( 1 - f^{phy}_{true-resp} \right) \times f^{phy}_{excr-loss} \times R^{phy}_{resp\langle computed \rangle} \right] + R^{phy}_{exud\langle computed \rangle} \right) \times [PHY]$$

• Mortality (https://docs.tuflow.com/fv/wqm/manual/2023/PhyLosses-3.html#PhyLossC-4)

Mortality loss: Computed from the respiration rate  $R^{phy}_{resp\langle computed 
angle}$ 

$$F^{phy}_{C-mort} = \left( \left( 1 - f^{phy}_{true-resp} \right) \times \left( 1 - f^{phy}_{excr-loss} \right) \times R^{phy}_{resp\langle computed \rangle} \right) \times [PHY]$$





# Appendix: References

### Workshop 1 References

#### **Publications**

- M. Hipsey, G. Gal, G. Arhonditsis, C. Carey, J. A. Elliott, M. Frassl, J. Janse, L. de Mora and B. Robson (2020) "A system of metrics for the assessment and improvement of aquatic ecosystem models", Environmental Modelling & Software 128
- D. Moriasi, M. Gitau, N. Pai and P. Daggupati (2015) "Hydrologic and water quality models: performance measures and evaluation criteria", Transactions of the ASABE 58:1763-1785
- D. Moriasi, J. Arnold, M. Van Liew, R. Bingner, R. Harmel and T. Veith (2007) "Model evaluation guidelines for systematic quantification of accuracy in watershed simulations", Transactions of the ASABE 50



