

# Modelling Aquatic Ecosystems

## Course 701-0426-00

Nele Schuwirth

ETH Zürich, Department of Environmental Systems Sciences  
Eawag, Swiss Federal Institute of Aquatic Science and Technology

1. Introduction, principles of modelling environmental systems, mass balance in a mixed reactor, process table notation, simple lake plankton model  
Exercise: R, ecosim-package, simple lake plankton model  
Exercise: lake phytoplankton-zooplankton model
2. Process stoichiometry Exercises: analytical solution, calculation with stoichcalc
3. Biological processes in lakes
4. Physical processes in lakes, mass balance in multi-box and continuous systems Exercise: structured, biogeochemical-ecological lake model  
Assignments: build your own model by implementing model extensions
5. Physical processes in rivers, bacterial growth, river model for benthic populations Exercise: river model for benthic populations, nutrients and oxygen
6. Stochasticity, uncertainty, Parameter estimation  
Exercise: uncertainty, stochasticity
7. Existing models and applications in research and practice, examples and case studies, preparation of the oral exam, feedback

- Answer questions about stoichiometry (or anything else)?
- Biological processes in lakes
- Practice for the oral exam

## At the model level:

- 1) Choose the substances/organisms to be considered in the model.
- 2) Choose the “elementary constituents” to be considered in the model.
- 3) Add substances needed for elemental mass balances (e.g.  $\text{H}_2\text{O}$ , ...) .
- 4) Construct the composition matrix (with fixed values or parameters)

## At the process level (for each process):

- 1) Choose the substances involved in the process, and which one to normalize to +1 or -1
- 2) identify the sign of each stoichiometric coefficient based on knowledge
- 3) Figure out, if you need additional constraints and specify them
- 4) Calculate the stoichiometric coefficients
  - a) manually solving mass balance equations with fixed values
  - b) manually solving mass balance equations with parameters
  - c) using the `stoichcalc` package based on the SVD theorem

rate  
parameter  
under  
standard  
conditions

temperature  
dependence

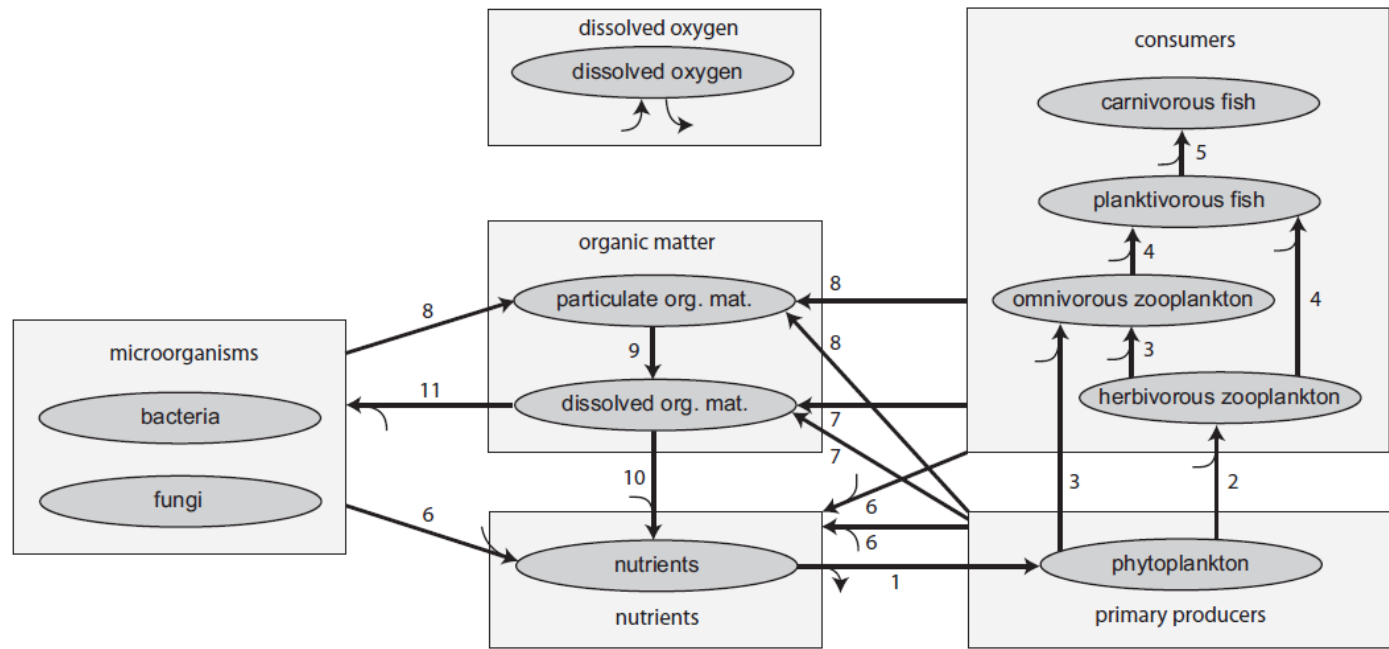
dependence  
on other  
env. factors

$$\rho_{\text{gro,ALG,NH}_4^+} = k_{\text{gro,ALG},T_0} \cdot f_{\text{temp}}(T) \cdot f_{\text{rad}}(I) \cdot \underbrace{f_{\text{lim}}(C_{\text{HPO}_4^{2-}}, C_{\text{NH}_4^+}, C_{\text{NO}_3^-})}_{\text{limitation terms for all "substances" that have a negative stoich. coefficient}} \cdot \underbrace{C_{\text{ALG}}}_{\text{dependence on the concentration of the substance to which the stoichiometry was normalized}}$$

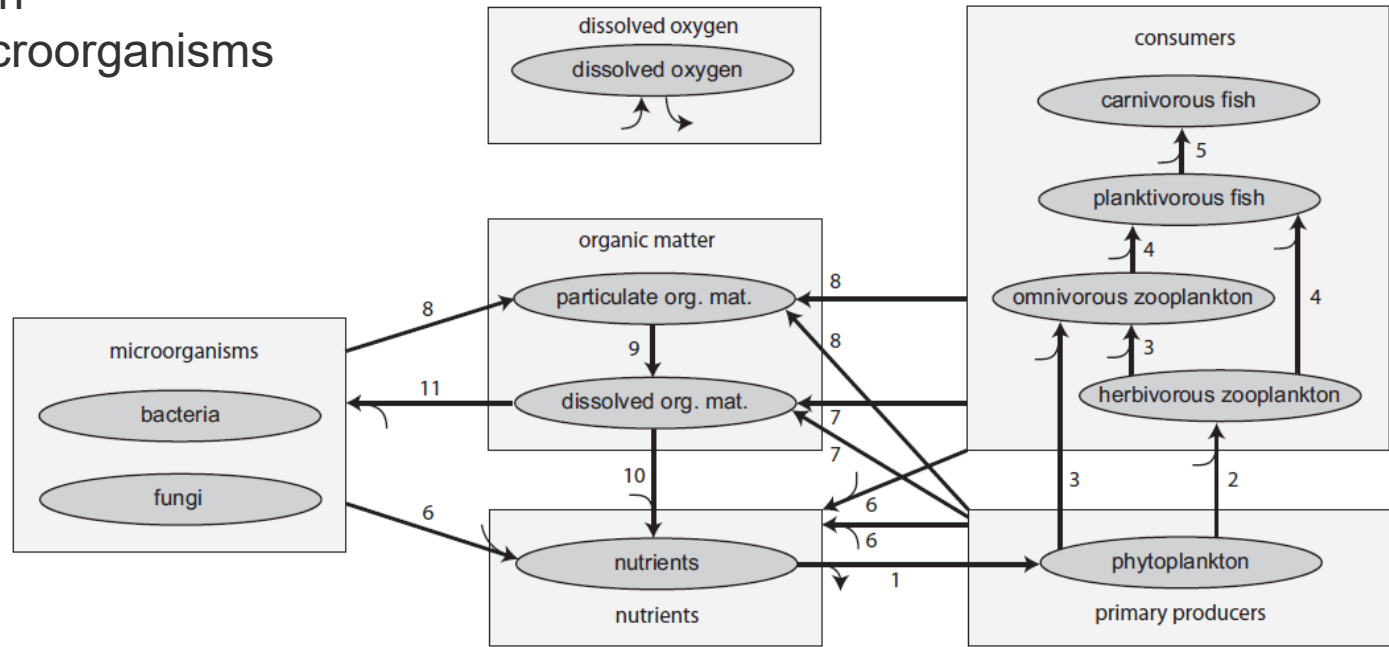
limitation terms for all "substances"  
that have a negative stoich. coefficient

+ maybe inhibition terms

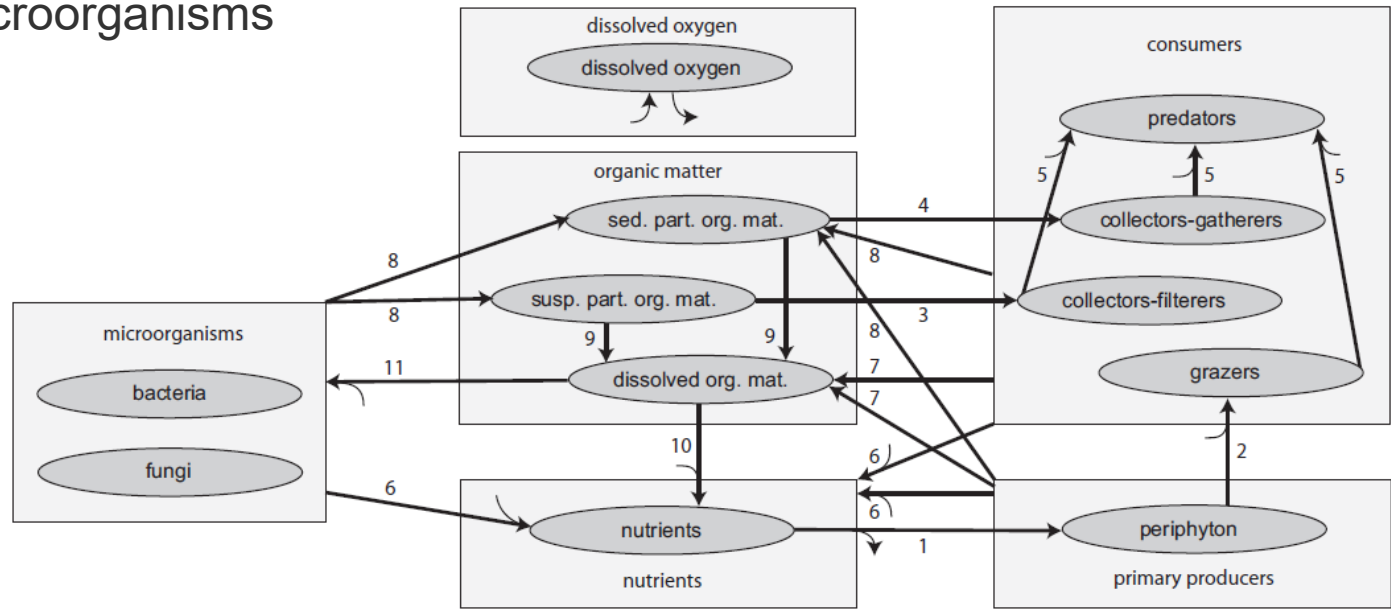
dependence on the  
concentration of the  
substance to which  
the stoichiometry  
was normalized



- 1 primary production
- 2,3,4,5 consumption
- 6 respiration
- 7 release of diss. OM during death and sloppy feeding
- 8 death
- 9 hydrolysis
- 10 mineralization
- 11 growth of microorganisms



- 1 primary production
- 2,3,4,5 consumption
- 6 respiration
- 7 release of diss. OM during death and sloppy feeding
- 8 death
- 9 hydrolysis
- 10 mineralization
- 11 growth of microorganisms

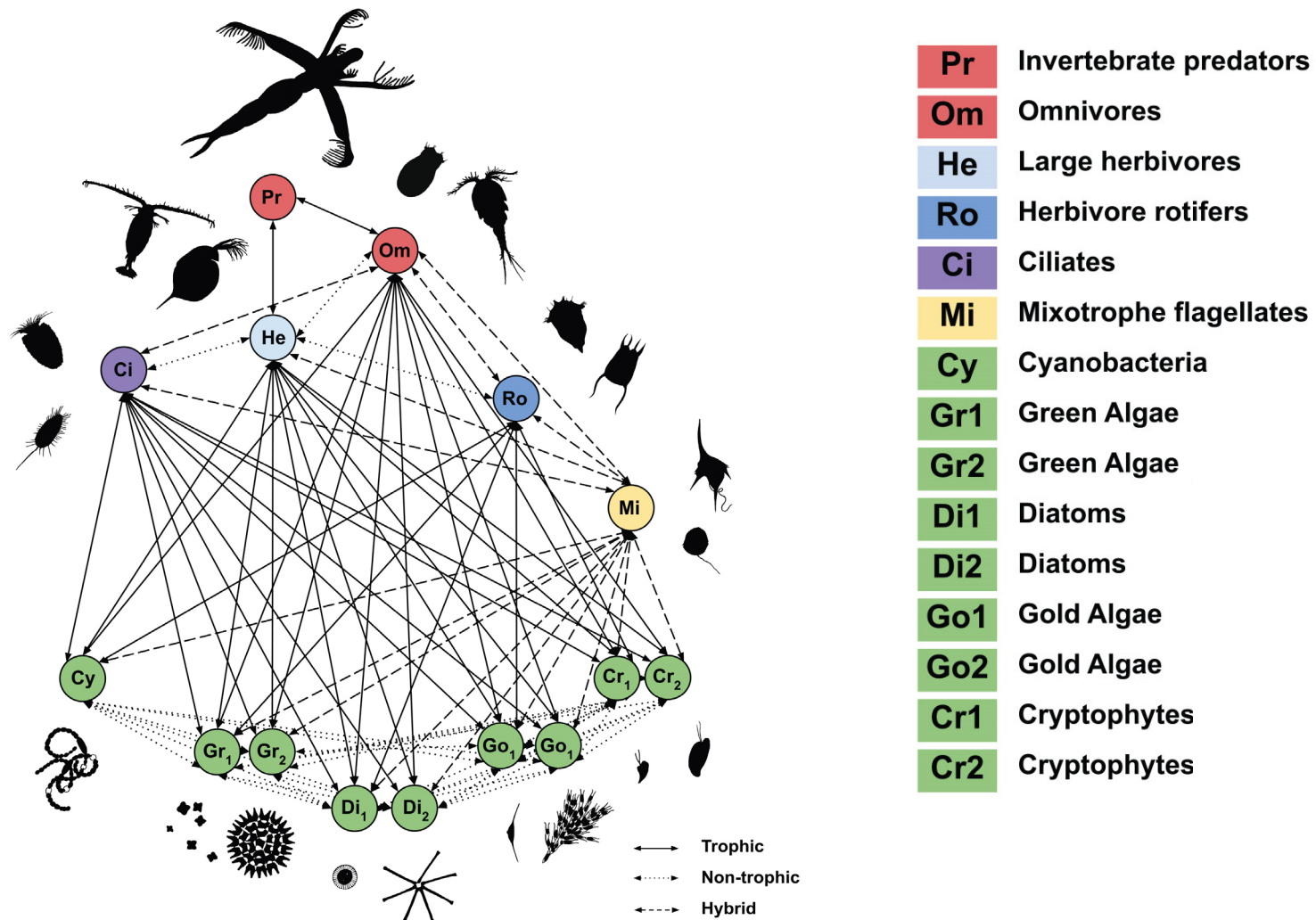






(Foto Marta Reyes, Eawag)

# More realistic lake food web



## It's your turn:

Safe space to practice for the oral exam

1. What happens in the process from a biological point of view?  
Which substances/organisms are involved?
2. Explain the qualitative stoichiometry (process table).  
Do we need additional constraints?
3. Explain how to formulate the process rate.
4. Anything special?

## What happens?

## chapter 8.1

Primary production is the production of organic material from inorganic nutrients through photosynthesis.

This process provides the food for the subsequent trophic levels of the ecosystem food web.

Algae can use nitrate or ammonia as a nitrogen source.

## Stoichiometry:

Process	Substances / Organisms								Rate
	$\text{NH}_4^+$ gN	$\text{NO}_3^-$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{O}_2$ gO	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	ALG gDM	
Pri. prod. $\text{NH}_4^+$	—		—	—	+	?	?	1	$\rho_{\text{gro,ALG,NH4}}$
Pri. prod. $\text{NO}_3^-$		—	—	—	+	?	?	1	$\rho_{\text{gro,ALG,NO3}}$

Six unknown stoichiometric coefficients.

Conservation of C, H, O, N, P and charge: 6 equations.

No additional constraints needed.

## Process rate:

$$\rho_{\text{gro,ALG,NH}_4^+} = k_{\text{gro,ALG},T_0} \cdot \exp\left(\beta_{\text{ALG}}(T - T_0)\right) \cdot \frac{I}{K_I + I} \cdot \min\left(\frac{C_{\text{HPO}_4^{2-}}}{K_{\text{HPO}_4^{2-},\text{ALG}} + C_{\text{HPO}_4^{2-}}}, \frac{C_{\text{NH}_4^+} + C_{\text{NO}_3^-}}{K_{\text{N,ALG}} + C_{\text{NH}_4^+} + C_{\text{NO}_3^-}}\right) \cdot \frac{p_{\text{NH}_4^+} C_{\text{NH}_4^+}}{p_{\text{NH}_4^+} C_{\text{NH}_4^+} + C_{\text{NO}_3^-}} \cdot C_{\text{ALG}}$$

$$\rho_{\text{gro,ALG,NO}_3^-} = k_{\text{gro,ALG},T_0} \cdot \exp\left(\beta_{\text{ALG}}(T - T_0)\right) \cdot \frac{I}{K_I + I} \cdot \min\left(\frac{C_{\text{HPO}_4^{2-}}}{K_{\text{HPO}_4^{2-},\text{ALG}} + C_{\text{HPO}_4^{2-}}}, \frac{C_{\text{NH}_4^+} + C_{\text{NO}_3^-}}{K_{\text{N,ALG}} + C_{\text{NH}_4^+} + C_{\text{NO}_3^-}}\right) \cdot \frac{C_{\text{NO}_3^-}}{p_{\text{NH}_4^+} C_{\text{NH}_4^+} + C_{\text{NO}_3^-}} \cdot C_{\text{ALG}}$$

with  $p_{\text{NO}_3^-} = 1$

## What happens?

## chapter 8.2

Respiration is the inverse process of photosynthesis.

Respiration is an important process for the survival of organisms as it provides energy for live maintenance processes.

Respiration leads to cycling of nutrients between the organically bound and inorganic phases.

## Stoichiometry:

Process	Substances / Organisms							Rate
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{O}_2$ gO	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	ALG gDM	
Respiration	+	+	+	-	?	?	-1	$\rho_{\text{resp,ALG}}$

Six unknown stoichiometric coefficients.

Conservation of C, H, O, N, P and charge: 6 equations.

No additional constraints needed.

## Process rate:

$$\rho_{\text{resp,ALG}} = k_{\text{resp,ALG}} \cdot \exp\left(\beta_{\text{ALG}}(T - T_0)\right) \cdot \frac{C_{\text{O}_2}}{K_{\text{O}_2} + C_{\text{O}_2}} \cdot C_{\text{ALG}}$$



## chapter 8.3

### What happens?

Death transfers living organisms into dead organic particles.

Different organisms can have **different compositions**.

To avoid introducing many types of POM, we have to account for a different composition of the living organisms and the dead organic particles (the dead bodies).

To respect the **mass balance principle**, we introduce a **yield** that leads to a **partial mineralization** during the death process. The yield is chosen so that as much as possible of the living organism is transferred to POM and the rest is mineralized.

Natural organic particles have a wide spectrum of biodegradability.

In models of ecological systems, this is often represented by a (quickly) **degradable** and an **inert** (slowly degradable) fraction of organic matter.

## Stoichiometry:

Process	Substances / Organisms								
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{O}_2$ gO	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	ALG gDM	POMD gDM	POMI gDM
Death	0/+	0/+	0/+	0/+	?	?	-1	$(1 - f_I)$ $\cdot Y_{\text{ALG,death}}$	$f_I$ $\cdot Y_{\text{ALG,death}}$

Eight unknown stoichiometric coefficients.

Conservation of C, H, O, N, P and charge: 6 equations.

Two additional constraints needed:

$$Y_{\text{death}} = \frac{-(\nu_{\text{death POMD}} + \nu_{\text{death POMI}})}{\nu_{\text{death ALG}}}$$

$$\nu_{\text{death ALG}} \cdot Y_{\text{death}} + \nu_{\text{death POMD}} + \nu_{\text{death POMI}} = 0$$

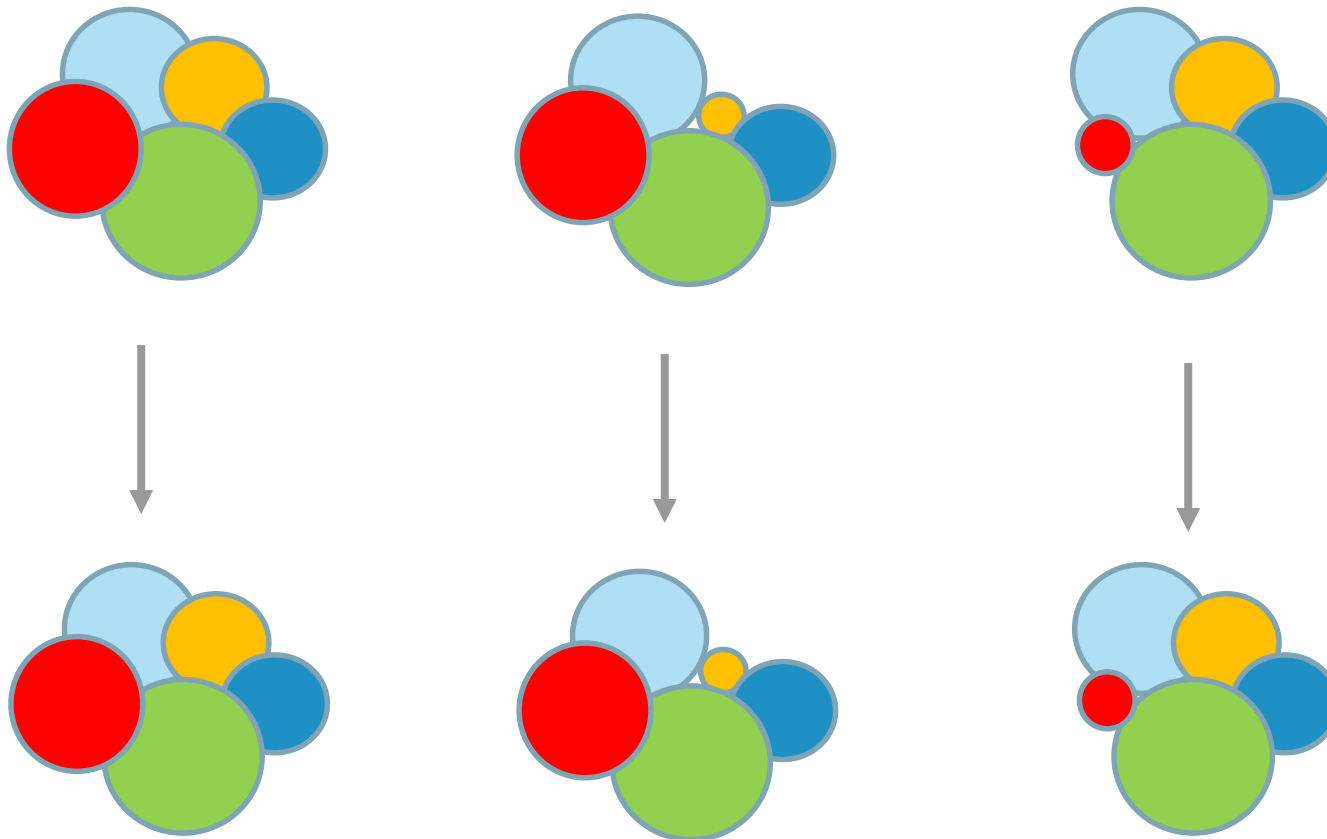
$$f_I = \frac{\nu_{\text{death POMI}}}{\nu_{\text{death POMI}} + \nu_{\text{death POMD}}}$$

$$\nu_{\text{death POMD}} f_I - \nu_{\text{death POMI}}(1 - f_I) = 0$$

**Process rate:**

$$\rho_{\text{death,ALG}} = k_{\text{death,ALG}} \cdot C_{\text{ALG}}$$

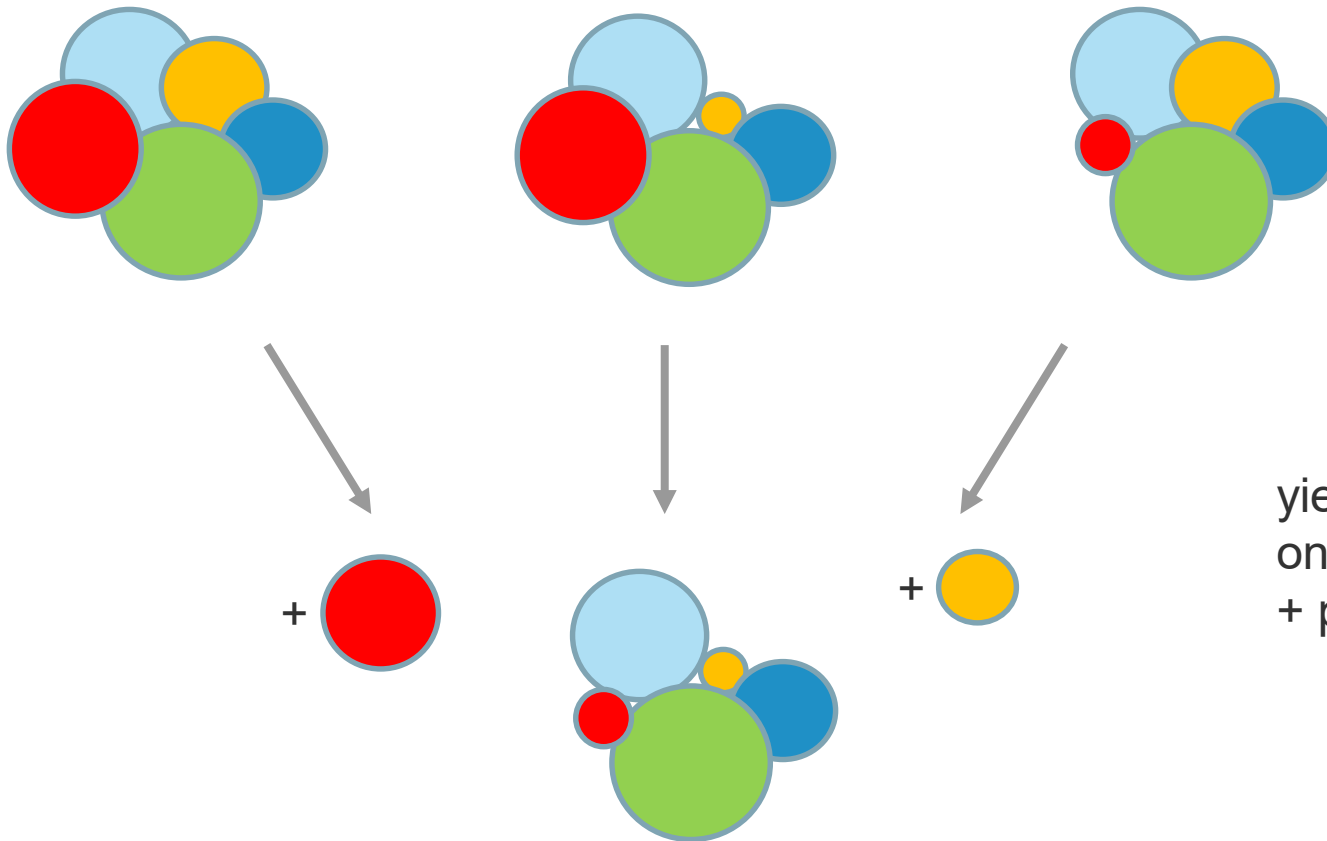
Living organisms with different composition



yield 100%  
but 3 different  
types of POM  
needed

Dead particulate organic matter

Living organisms with different composition



yield <100%  
only 1 type of POM  
+ partial mineralization

Dead particulate organic matter + nutrients

## What happens?

## chapter 8.4

Secondary producers consume organic food sources  
(living organisms or dead organic matter).

This process produces dead organic matter  
due to sloppy feeding and excretion.

Our example here is zooplankton growth on algae.

## Stoichiometry:

Process	Substances / Organisms									
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{O}_2$ gO	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	ALG gDM	ZOO gDM	POMD gDM	POMI gDM
Growth ZOO	+	+	+	-	?	?	-	1	+	+

Process formulation with fast degradable and "inert" (=slowly degradable) particle production due to sloppy feeding and excretion and partial mineralization.

Nine unknown stoichiometric coefficients.

Conservation of C, H, O, N, P and charge: 6 equations.

Three additional constraints needed:

$$1\text{ALG} \rightarrow Y_{\text{ZOO}}\text{ZOO} + f_e\text{POM} + (1 - Y_{\text{ZOO}} - f_e) \text{nutrients}$$

$$\text{POM} = f_i\text{POMI} + (1 - f_i)\text{POMD}$$

### 3 constraints:

$$Y_{ZOO} = \frac{-\nu_{gro,ZOO ZOO}}{\nu_{gro,ZOO ALG}}$$

yield

$$\nu_{gro,ZOO ZOO} + \nu_{gro,ZOO ALG} Y_{ZOO} = 0$$

$$f_e = \frac{-(\nu_{gro,ZOO POMD} + \nu_{gro,ZOO POMI})}{\nu_{gro,ZOO ALG}}$$

fraction excreted

$$\nu_{gro,ZOO POMD} + \nu_{gro,ZOO POMI} + \nu_{gro,ZOO ALG} f_e = 0$$

$$f_I = \frac{\nu_{gro,ZOO POMI}}{\nu_{gro,ZOO POMI} + \nu_{gro,ZOO POMD}}$$

fraction inert

$$\nu_{gro,ZOO POMD} f_I - \nu_{gro,ZOO POMI} (1 - f_I) = 0$$

Process	Substances / Organisms									
	NH <sub>4</sub> <sup>+</sup> gN	HPO <sub>4</sub> <sup>2-</sup> gP	HCO <sub>3</sub> <sup>-</sup> gC	O <sub>2</sub> gO	H <sup>+</sup> mol	H <sub>2</sub> O mol	ALG gDM	ZOO gDM	POMD gDM	POMI gDM
Growth ZOO	+	+	+	-	?	?	$\frac{-1}{Y_{ZOO}}$	1	$\frac{(1 - f_I) f_e}{Y_{ZOO}}$	$\frac{f_I f_e}{Y_{ZOO}}$



## Process rate:

$$\rho_{\text{gro,ZOO}} = k_{\text{gro,ZOO},T_0} \cdot \exp\left(\beta_{\text{ZOO}}(T - T_0)\right) \cdot \frac{C_{\text{O}_2}}{K_{\text{O}_2,\text{ZOO}} + C_{\text{O}_2}} \cdot \frac{C_{\text{ALG}}}{K_{\text{ALG,ZOO}} + C_{\text{ALG}}} \cdot C_{\text{ZOO}}$$

$$\rho_{\text{gro,ZOO}} = k'_{\text{gro,ZOO},T_0} \cdot \exp\left(\beta_{\text{ZOO}}(T - T_0)\right) \cdot \frac{C_{\text{O}_2}}{K_{\text{O}_2,\text{ZOO}} + C_{\text{O}_2}} \cdot C_{\text{ALG}} \cdot C_{\text{ZOO}}$$

with Monod-limitation or linear dependence on food source

! affects the unit of the specific growth rate  $k_{\text{gro,ZOO},T_0}$

## What happens?

chapter 8.5

**Oxic mineralization** transforms organic matter to dissolved nutrients and carbon dioxide under **consumption of oxygen**.

In the absence of dissolved oxygen (primarily in the sediment), mineralization can use **nitrate (=anoxic)**, **manganese** oxide, **iron** hydroxide or **sulfate** for oxidizing organic matter (=anaerobic). Finally, **methanogenesis** can convert organic matter to nutrients, carbon dioxide and methane.

As **mineralization is caused by bacteria** and bacterial concentrations vary considerably from one (part of the) system to another, mineralization rate coefficients vary over many orders of magnitude.

## Stoichiometry:

Process	Substances / Organisms							Rate
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{O}_2$ gO	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	POM gDM	
Oxic miner.	+	+	+	-	?	?	-1	$\rho_{\text{miner,ox,POM}}$

Six unknown stoichiometric coefficients.

Conservation of C, H, O, N, P and charge: 6 equations.

No additional constraints needed.

## Process rate:

$$\rho_{\text{miner,ox,POM}} = k_{\text{miner,ox,POM}} \cdot \exp\left(\beta_{\text{BAC}}(T - T_0)\right) \cdot \frac{C_{\text{O}_2}}{K_{\text{O}_2,\text{miner}} + C_{\text{O}_2}} \cdot C_{\text{POM}}$$

## Stoichiometry:

Process	Substances / Organisms								Rate
	$\text{NH}_4^+$ gN	$\text{NO}_3^-$ gN	$\text{N}_2$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	POM gDM	
Anox. min.	+	-	+	+	+	?	?	-1	$\rho_{\text{miner,anox,POM}}$

Seven unknown stoichiometric coefficients. Conservation of C, H, O, N, P and charge: 6 equations. One additional constraint needed:

$$\nu_{\text{miner,anox NO}_3} + \nu_{\text{miner,anox N}_2} = 0$$

## Process rate:

$$\rho_{\text{miner,anox,POM}} = k_{\text{miner,anox,POM}} \cdot \exp\left(\beta_{\text{BAC}}(T - T_0)\right) \cdot \frac{K_{\text{O}_2,\text{miner}}}{K_{\text{O}_2,\text{miner}} + C_{\text{O}_2}} \cdot \frac{C_{\text{NO}_3}}{K_{\text{NO}_3,\text{miner}} + C_{\text{NO}_3}} \cdot C_{\text{POM}}$$

## Stoichiometry:

Process	Substances / Organisms							
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{Mn}^{2+}$ mol	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	$\text{MnO}_2$ mol	POM gDM
Mn oxide red.	+	+	+	+	?	?	-	-1

Process	Substances / Organisms							
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{Fe}^{2+}$ mol	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	$\text{FeOOH}$ mol	POM gDM
Fe hydrox. red.	+	+	+	+	?	?	-	-1

Process	Substances / Organisms							
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{SO}_4^{2-}$ mol	$\text{HS}^-$ mol	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	POM gDM
Sulfate reduction	+	+	+	-	+	?	?	-1

7 unknowns and 6+1 (Mn/Fe/S) mass balance equations  
= no additional constraint needed

## Stoichiometry:

Process	Substances / Organisms						
	$\text{NH}_4^+$ gN	$\text{HPO}_4^{2-}$ gP	$\text{HCO}_3^-$ gC	$\text{CH}_4$ gC	$\text{H}^+$ mol	$\text{H}_2\text{O}$ mol	POM gDM
Methanogenesis	+	+	+	+	?	?	-1

6 unknowns and 6 mass balance equations = no additional constraint needed

The process rates need additional limitation and inhibition terms!

## What happens?

Nitrification leads to a **transformation** of **ammonia** to **nitrite** and **nitrate**.

This is done by chemoautotrophic bacteria that gain energy by this transformation process.

It can be modelled as a 1 or 2 step process.

As an alternative, we can model the growth, respiration, and death of the nitrifying bacteria (see chapter 8.8.2).

## One step model:

Process	Substances / Organisms				
	NH <sub>4</sub> <sup>+</sup> gN	NO <sub>3</sub> <sup>-</sup> gN	O <sub>2</sub> gO	H <sup>+</sup> mol	H <sub>2</sub> O mol
Nitrification	-1	+	-	?	?

4 unknowns,  
4 equations for N,H,O,e<sup>-</sup>  
no constraints needed



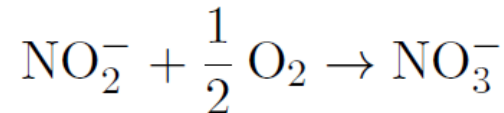
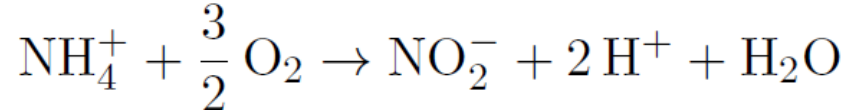
Rate:

$$\rho_{\text{nitri}} = k_{\text{nitri}} \cdot \exp\left(\beta_{\text{BAC}}(T - T_0)\right) \cdot \min\left(\frac{C_{\text{NH}_4}}{K_{\text{NH}_4,\text{nitri}} + C_{\text{NH}_4}}, \frac{C_{\text{O}_2}}{K_{\text{O}_2,\text{nitri}} + C_{\text{O}_2}}\right)$$



## Two steps model:

Process	Substances / Organisms					
	NH <sub>4</sub> <sup>+</sup> gN	NO <sub>2</sub> <sup>-</sup> gN	NO <sub>3</sub> <sup>-</sup> gN	O <sub>2</sub> gO	H <sup>+</sup> mol	H <sub>2</sub> O mol
Ammonium oxidation	-1	+		-	?	?
Nitrite oxidation		-1	+	-	?	?



4 unknowns,  
4 equations for N,H,O,e<sup>-</sup>  
no constraints needed

Rate:

$$\rho_{\text{nitri1}} = k_{\text{nitri1},T_0} \cdot \exp(\beta_{\text{N1}}(T-T_0)) \cdot \min\left(\frac{C_{\text{NH}_4^+}}{K_{\text{NH}_4^+, \text{nitri}} + C_{\text{NH}_4^+}}, \frac{C_{\text{O}_2}}{K_{\text{O}_2, \text{nitri}} + C_{\text{O}_2}}\right)$$

$$\rho_{\text{nitri2}} = k_{\text{nitri2},T_0} \cdot \exp(\beta_{\text{N2}}(T-T_0)) \cdot \min\left(\frac{C_{\text{NO}_2^-}}{K_{\text{NO}_2^-, \text{nitri}} + C_{\text{NO}_2^-}}, \frac{C_{\text{O}_2}}{K_{\text{O}_2, \text{nitri}} + C_{\text{O}_2}}\right)$$

## What happens?

chapter 8.7

In this process, particulate organic matter is transformed into dissolved organic matter, which can be consumed by heterotrophic bacteria.

It is a chemical process, where a water molecule or hydroxide ion substitutes for another atom or group of atoms in an organic molecule.

## Stoichiometry:

Process	Substances / Organisms							
	NH <sub>4</sub> <sup>+</sup> gN	HPO <sub>4</sub> <sup>2-</sup> gP	HCO <sub>3</sub> <sup>-</sup> gC	O <sub>2</sub> gO	H <sup>+</sup> mol	H <sub>2</sub> O mol	POM gDM	DOM g
Hydrolysis	0/+	0/+	0/+	0/+	?	?	-1	Y <sub>hyd</sub>

The 0/+ indicates that the stoichiometric coefficient should not be negative.  
7 unknowns and 6 equations: 1 additional constraint is needed.

$$\nu_{\text{hyd DOM}} + \nu_{\text{hyd POM}} Y_{\text{hyd}} = 0$$

$Y_{\text{hyd}}$  specifies which fraction of POM is transferred to DOM

→ can be max. 1 if the elemental composition is the same,  
then all other unknowns are 0.

Process rate:

$$\rho_{\text{hyd,POM}} = k_{\text{hyd,POM},T_0} \cdot \exp\left(\beta_{\text{hyd}}(T - T_0)\right) \cdot C_{\text{POM}}$$

1. Introduction, principles of modelling environmental systems, mass balance in a mixed reactor, process table notation, simple lake plankton model  
Exercise: R, ecosim-package, simple lake plankton model  
Exercise: lake phytoplankton-zooplankton model
2. Process stoichiometry Exercises: analytical solution, calculation with stoichcalc
3. Biological processes in lakes
4. Physical processes in lakes, mass balance in multi-box and continuous systems Exercise: structured, biogeochemical-ecological lake model  
Assignments: build your own model by implementing model extensions
5. Physical processes in rivers, bacterial growth, river model for benthic populations Exercise: river model for benthic populations, nutrients and oxygen
6. Stochasticity, uncertainty, Parameter estimation  
Exercise: uncertainty, stochasticity
7. Existing models and applications in research and practice, examples and case studies, preparation of the oral exam, feedback

- read chapter 3.3 (mass balance in multi-reactor system)
- read chapter 6.1.1 (transport and mixing in lakes)
- read chapters 11.3 and 11.4 (two-box model lake models)
- voluntary bonus: if you are interested in chemical processes read chapter 6

... about components of process rates (repetition chapter 4)

## Light dependence factor

Monod:

$$f_{\text{rad}}^{\text{Monod}}(I) = \frac{I}{K_I + I}$$

Smith:

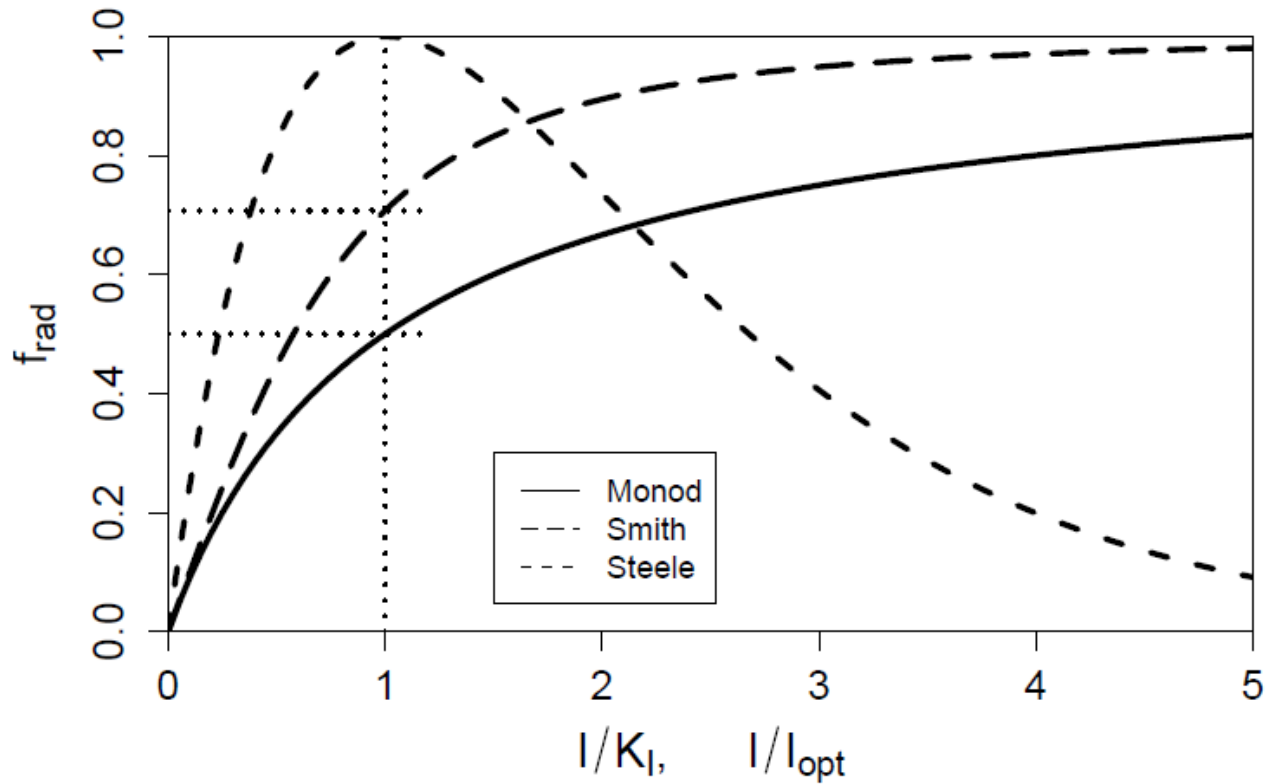
$$f_{\text{rad}}^{\text{Smith}}(I) = \frac{I}{\sqrt{K_I^2 + I^2}}$$

Steele:

$$f_{\text{rad}}^{\text{Steele}}(I) = \frac{I}{I_{\text{opt}}} \exp\left(1 - \frac{I}{I_{\text{opt}}}\right)$$

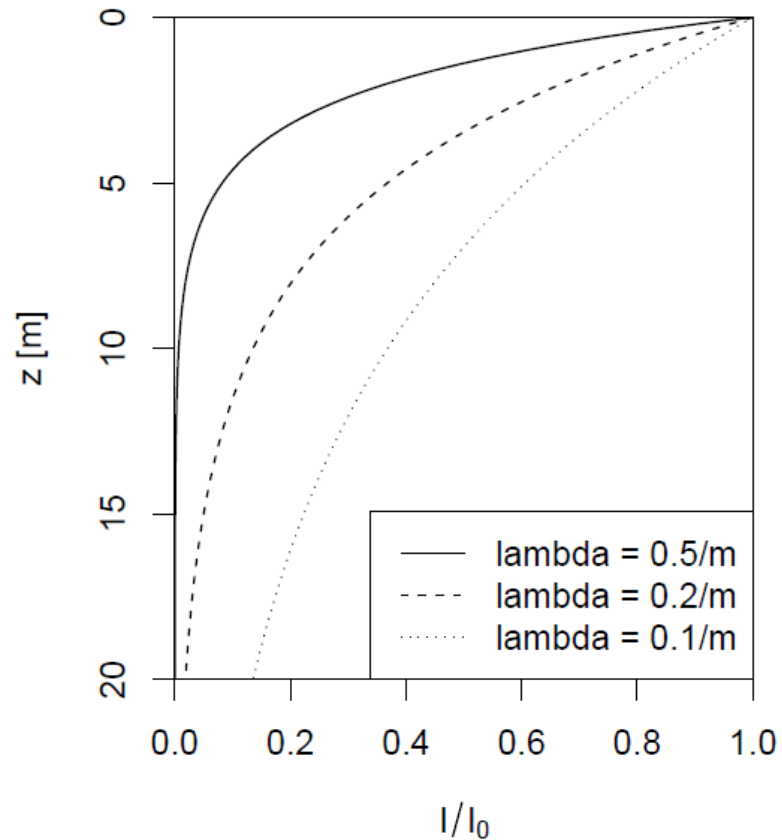


## Light dependence factors



## Light attenuation:

$$I(z) = I_0 \exp(-\lambda z);$$



## Light attenuation

For a model with a mixed reactor, the light dependence factor (and not the light itself!) has to be averaged across depth.

**Average light dependence factor:**

$$\bar{f}_{\text{rad}}(I_0, \lambda, h) = \frac{1}{h} \int_0^h f_{\text{rad}}(I_0 \exp(-\lambda z)) dz$$

## Average light dependence factors

Monod:

$$\bar{f}_{\text{rad}}^{\text{Monod}}(I_0, \lambda, h) = \frac{1}{\lambda h} \log \left( \frac{K_I + I_0}{K_I + I_0 \exp(-\lambda h)} \right)$$

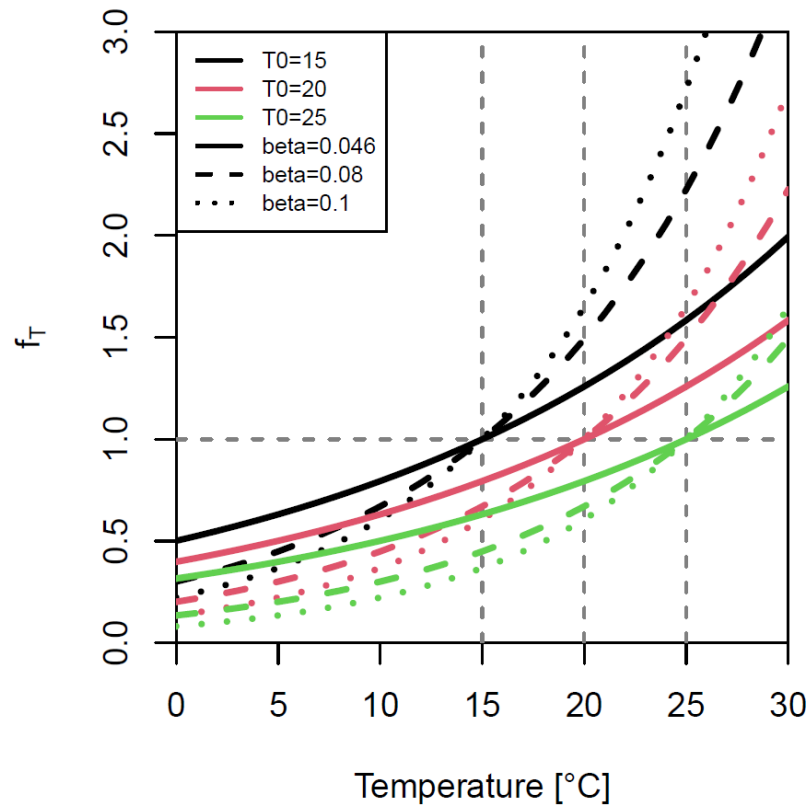
Smith:

$$\bar{f}_{\text{rad}}^{\text{Smith}}(I_0, \lambda, h) = \frac{1}{\lambda h} \log \left( \frac{\frac{I_0}{K_I} + \sqrt{1 + \left(\frac{I_0}{K_I}\right)^2}}{\frac{I_0 \exp(-\lambda h)}{K_I} + \sqrt{1 + \left(\frac{I_0 \exp(-\lambda h)}{K_I}\right)^2}} \right)$$

Steele:

$$\bar{f}_{\text{rad}}^{\text{Steele}}(I_0, \lambda, h) = \frac{e}{\lambda h} \left[ \exp \left( -\frac{I_0 \exp(-\lambda h)}{I_{\text{opt}}} \right) - \exp \left( -\frac{I_0}{I_{\text{opt}}} \right) \right]$$

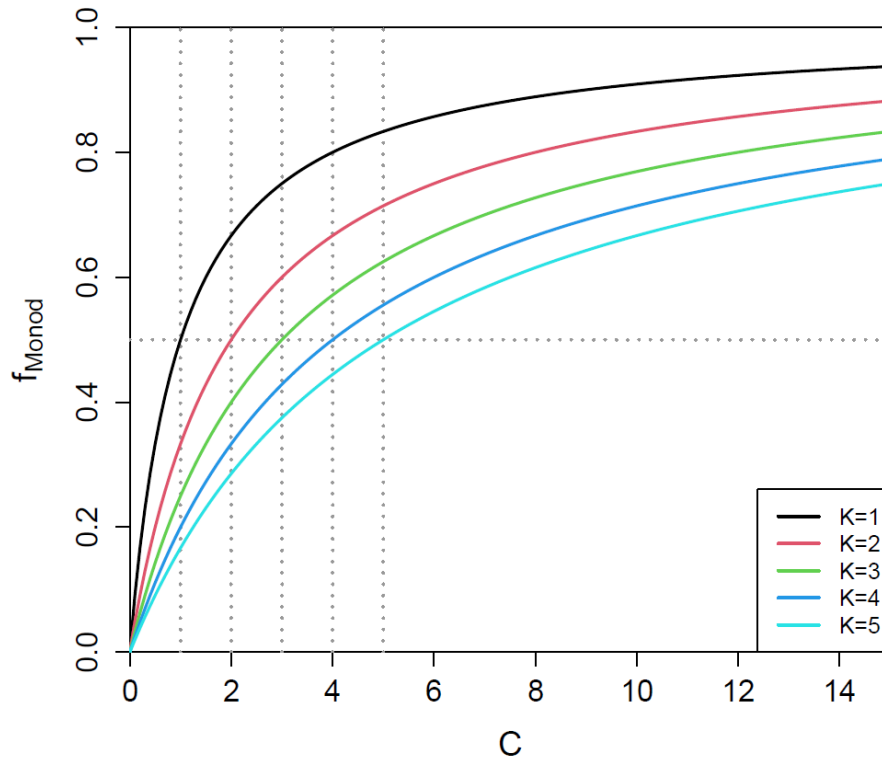
## Temperature dependence factor



Exponential:

$$f_{\text{temp}}^{\text{exp}}(T) = \exp\left(\beta(T - T_0)\right)$$

## Limitation by substance concentrations



$$f_{\text{lim}}^{\text{Monod}}(C) = \frac{C}{K + C}$$

## Limitation by multiple substances

Product:

$$f_N(C_{\text{HPO}_4}, C_{\text{NH}_4}, C_{\text{NO}_3}) \\ = \frac{C_{\text{HPO}_4}}{K_{\text{HPO}_4} + C_{\text{HPO}_4}} \cdot \frac{C_{\text{NH}_4} + C_{\text{NO}_3}}{K_N + C_{\text{NH}_4} + C_{\text{NO}_3}}$$

Minimum (Liebig's Law):

$$f_N(C_{\text{HPO}_4}, C_{\text{NH}_4}, C_{\text{NO}_3}) \\ = \min \left( \frac{C_{\text{HPO}_4}}{K_{\text{HPO}_4} + C_{\text{HPO}_4}}, \frac{C_{\text{NH}_4} + C_{\text{NO}_3}}{K_N + C_{\text{NH}_4} + C_{\text{NO}_3}} \right)$$

## Preference Among Different Food Sources

Many organisms can grow on different food sources.

As the stoichiometry and kinetics of growth on one food source may be different from that on another, it is best to represent growth on different food sources by different processes.

The process rates of these processes can still have many terms in common. But they also need a preference factor that depends on the concentrations of all food sources.



## Preference Among Different Food Sources

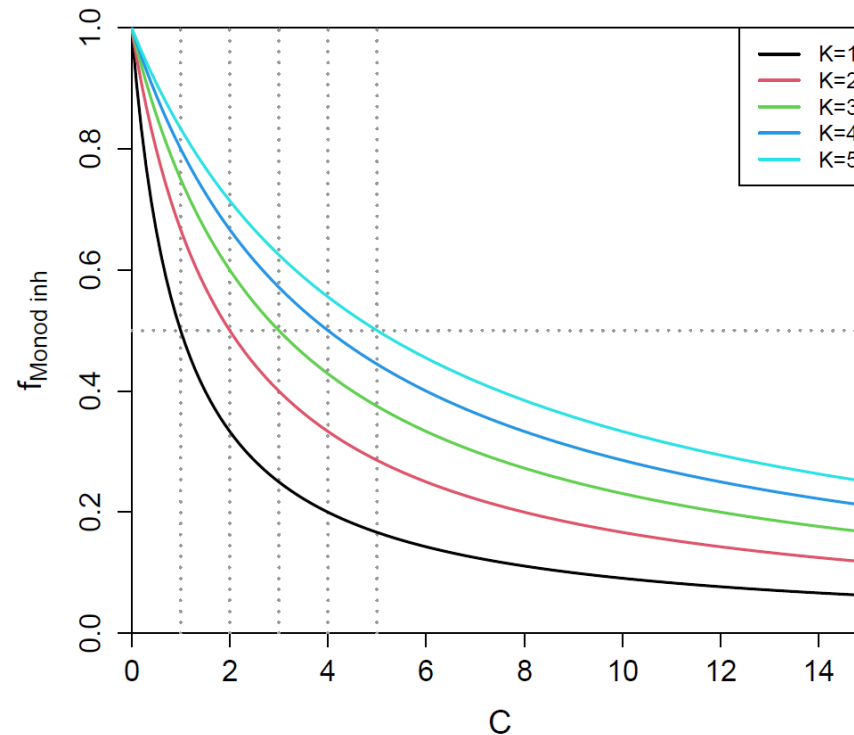
Simplest conceptually satisfying expression:

$$f_{\text{pref}}^i(C_1, \dots, C_n) = \frac{p_i C_i}{\sum_{j=1}^n p_j C_j}$$

$n$ : food sources with concentrations  $C_1, \dots, C_n$ ,

$p_j$ : preference coefficient for food source  $j$ .

## Inhibition by substance concentrations



$$f_{\text{inh}}^{\text{Monod}}(C) = \frac{K}{K + C}$$