

Modelling Aquatic Ecosystems

Course 701-0426-00

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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

- Review exercise 2 and clarify open questions
- Acquire knowledge in process stoichiometry to bridge between ecological and biogeochemical processes.
- Learn to calculate stoichiometric coefficients from chemical substance notation (**chapter 4.3.1**) and parameterized elemental mass fractions (**chapter 4.3.2**).

Review Exercise 2: Model description

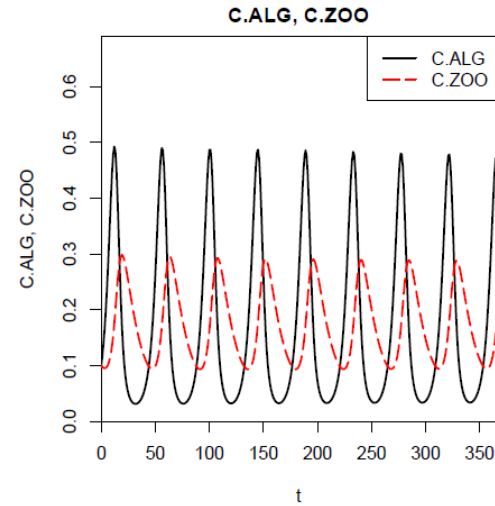
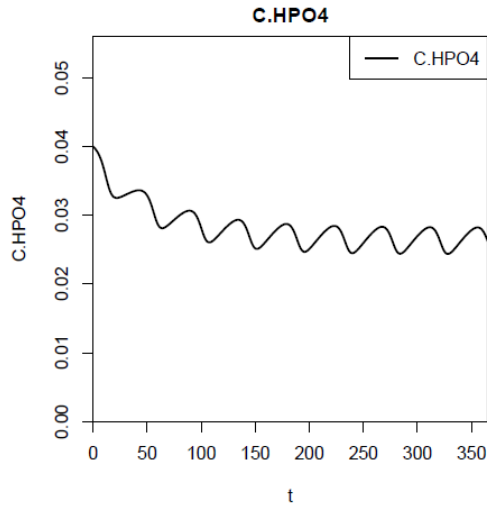
chapter 11.2

Process	Substances / Organisms			Rate
	HPO4 [gP/m ³]	ALG [gDM/m ³]	ZOO [gDM/m ³]	
Growth of algae	$-\alpha_{P,ALG}$	1		$\rho_{gro,ALG}$
Death of algae		-1		$\rho_{death,ALG}$
Growth of zooplankton		$-\frac{1}{Y_{ZOO}}$	1	$\rho_{gro,ZOO}$
Death of zooplankton			-1	$\rho_{death,ZOO}$

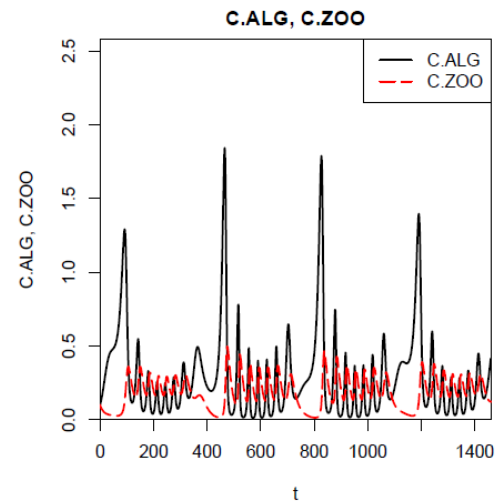
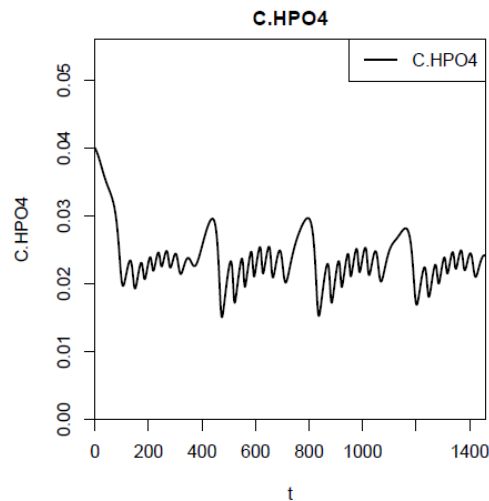
here units of the state variables in the model

Rate	Rate expression
$\rho_{gro,ALG}$	$k_{gro,ALG,T_0} \cdot \exp(\beta_{ALG}(T - T_0)) \cdot \frac{1}{\lambda h} \log \left(\frac{K_I + I_0}{K_I + I_0 \exp(-\lambda h)} \right) \cdot \frac{C_{HPO_4^{2-}}}{K_{HPO_4^{2-},ALG} + C_{HPO_4^{2-}}} \cdot C_{ALG}$
$\rho_{death,ALG}$	$k_{death,ALG} C_{ALG}$
$\rho_{gro,ZOO}$	$k_{gro,ZOO,T_0} \cdot \exp(\beta_{ZOO}(T - T_0)) \cdot C_{ALG} C_{ZOO}$
$\rho_{death,ZOO}$	$k_{death,ZOO} C_{ZOO}$

Results for constant environmental conditions

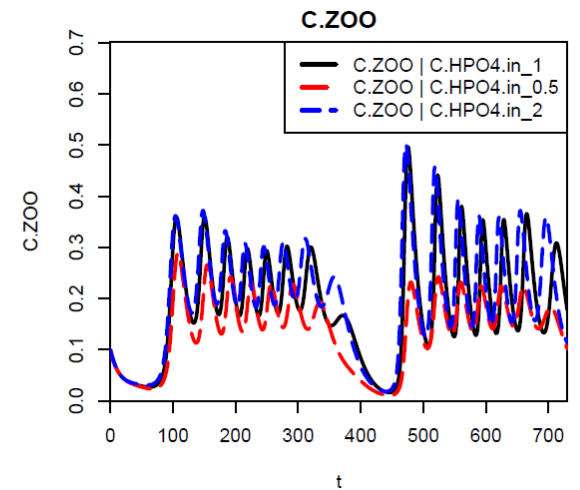
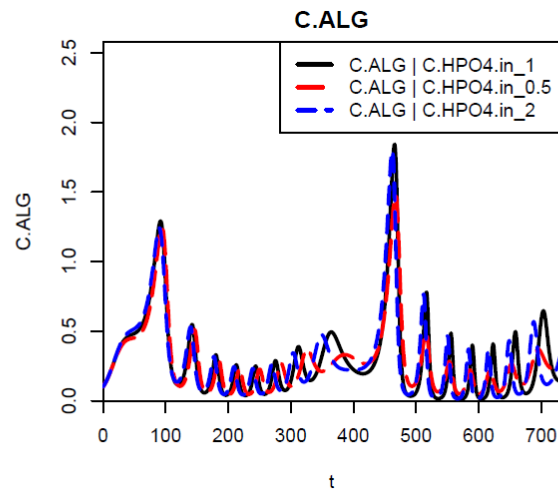
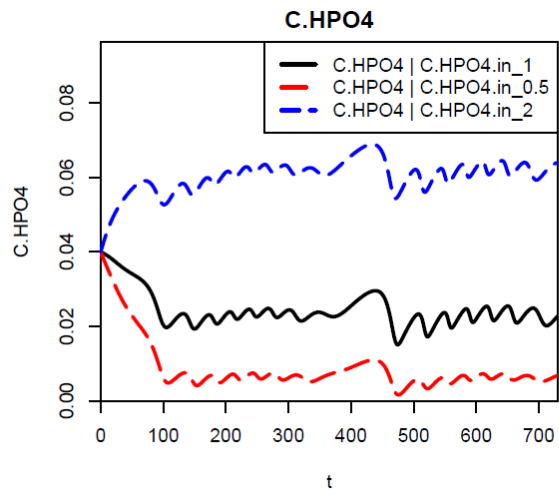
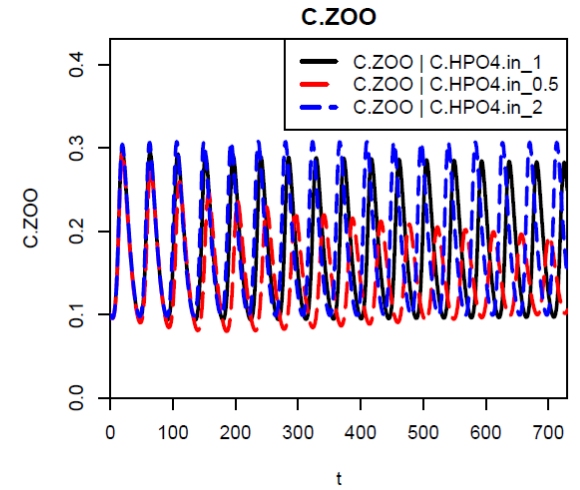
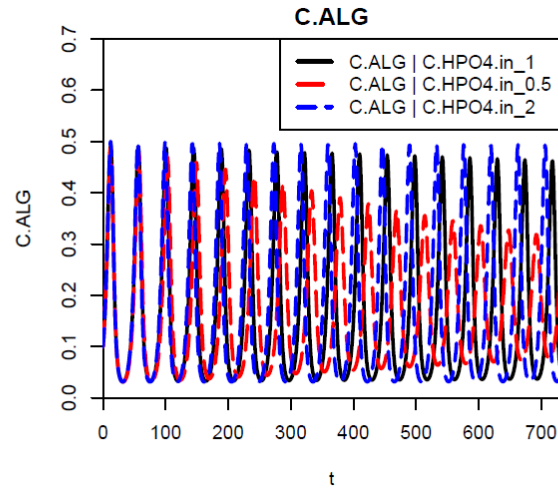
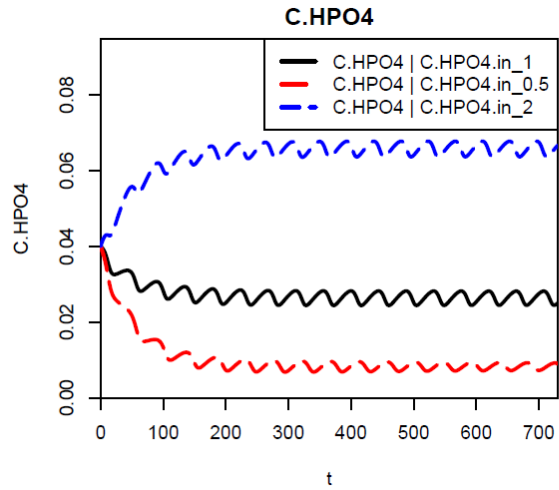


Results for periodic environmental conditions

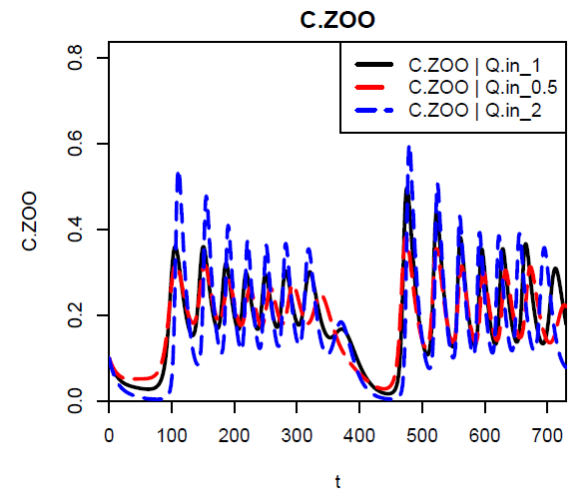
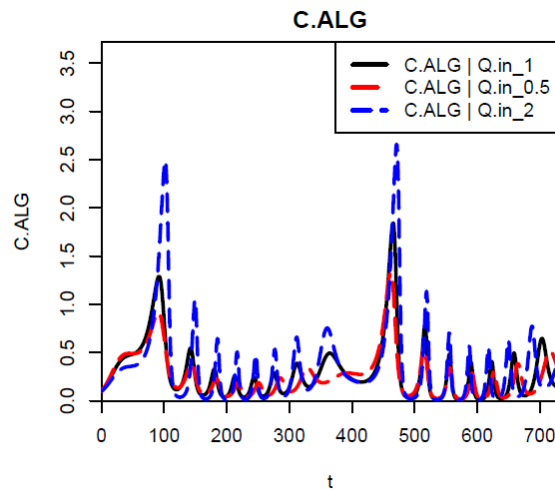
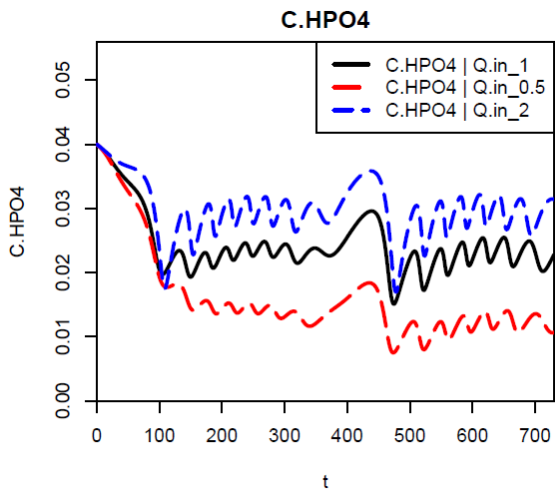
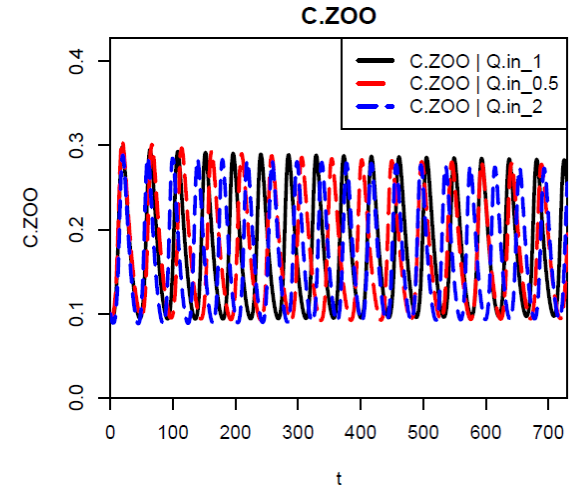
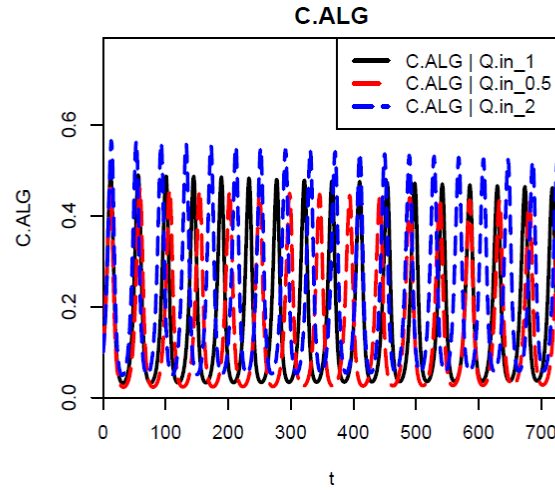
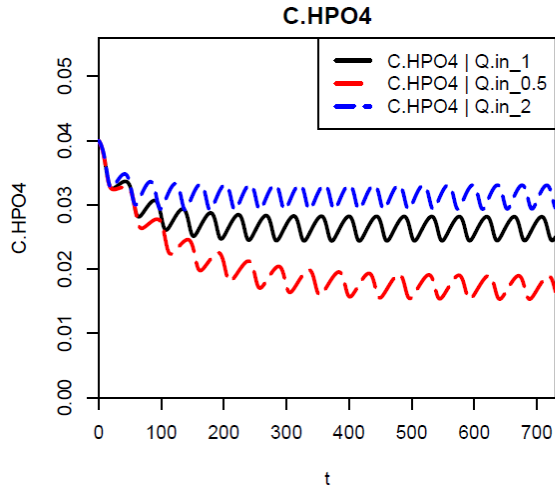


1. Are the algae concentrations controlled bottom-up (by phosphate limitation) or top-down (by grazing of zooplankton)?
2. What is the reason for oscillating concentrations under constant driving forces? What happens when you introduce periodic driving forces?
3. What are the main deficits of the model compared to a real lake?
4. What is your expectation regarding the response of the model to the change in each parameter, does the result match your expectation and can you explain the observed changes?

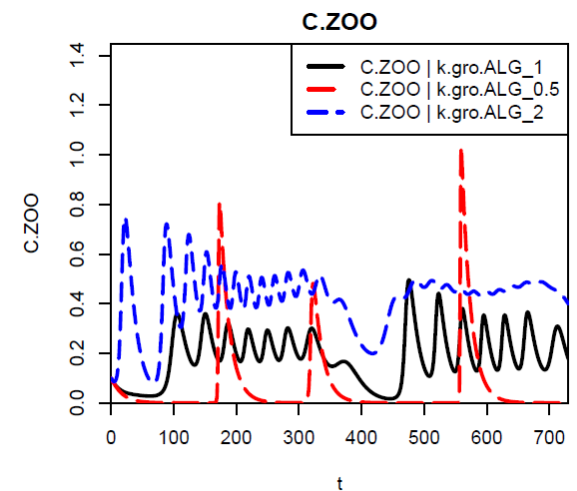
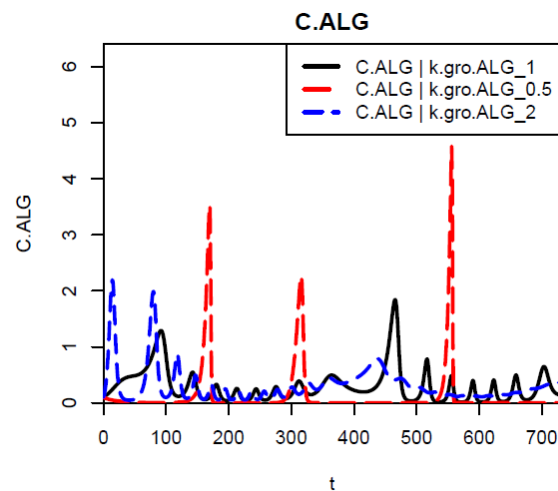
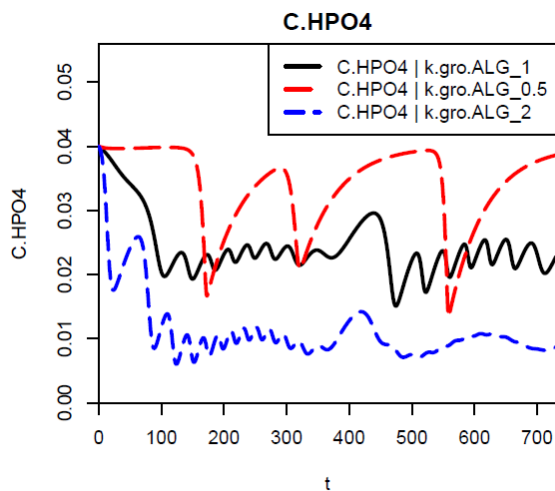
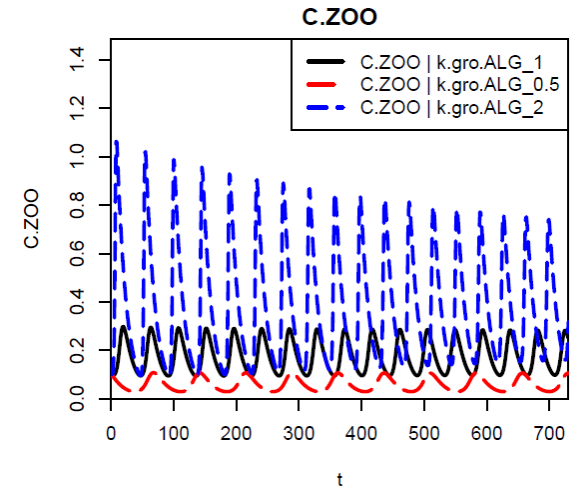
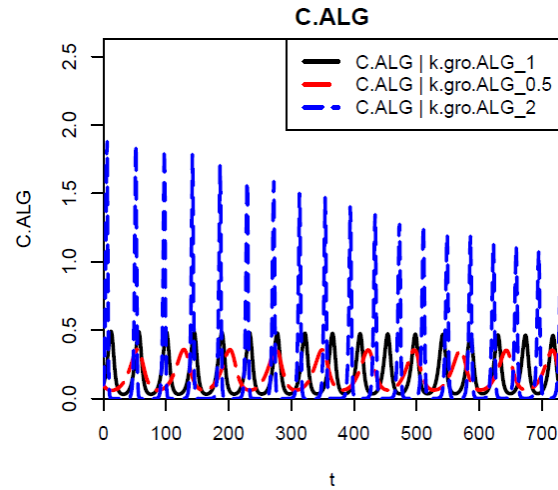
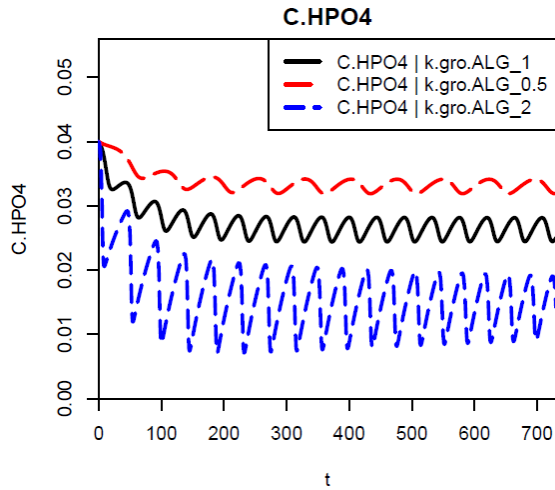
Review Exercise 2: Sensitivity Analysis



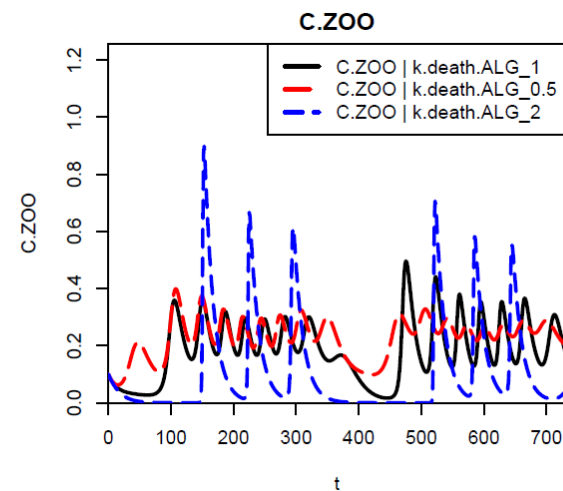
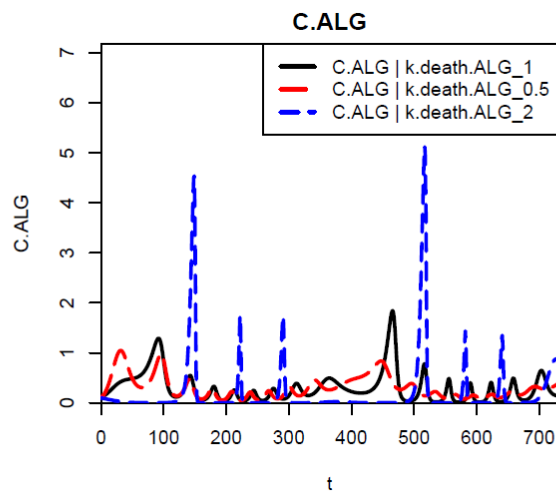
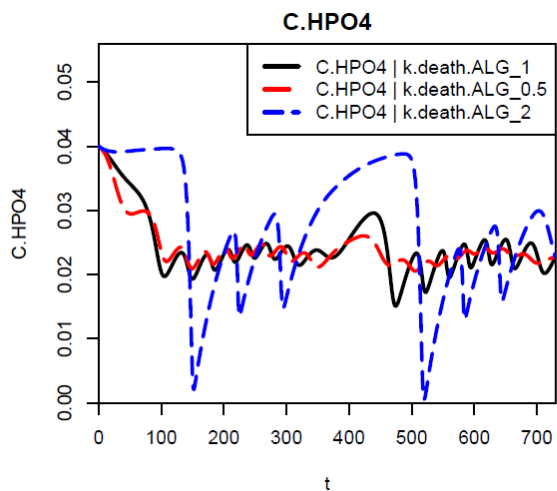
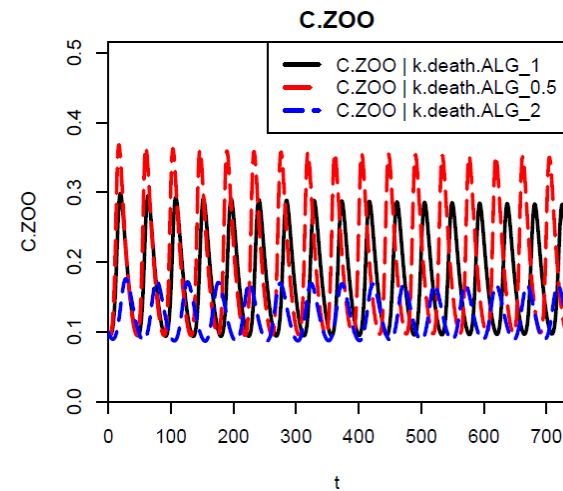
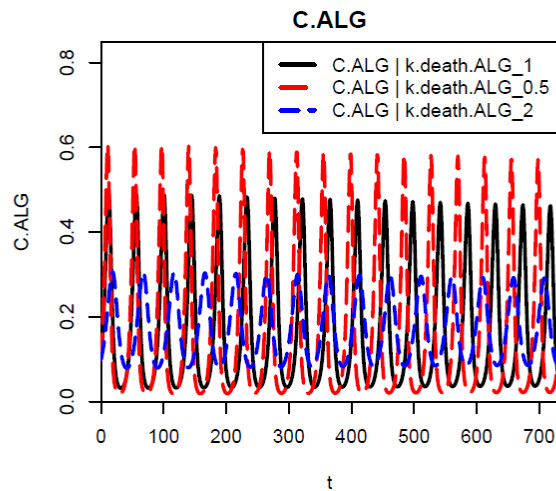
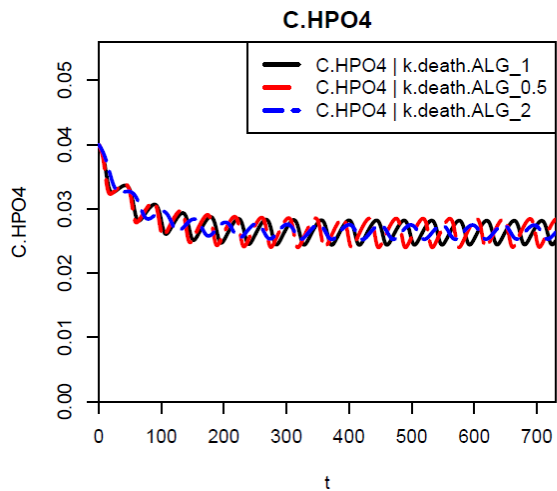
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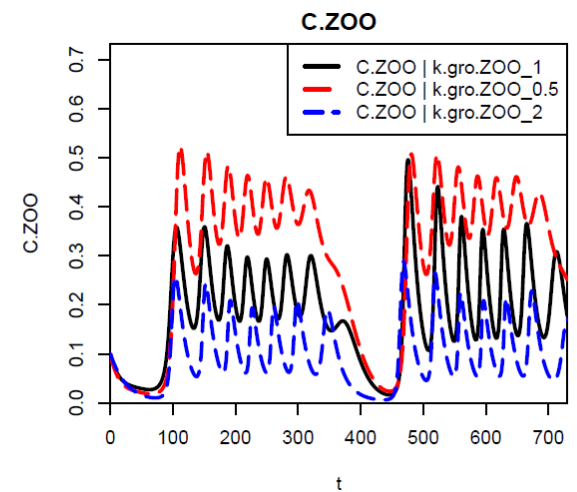
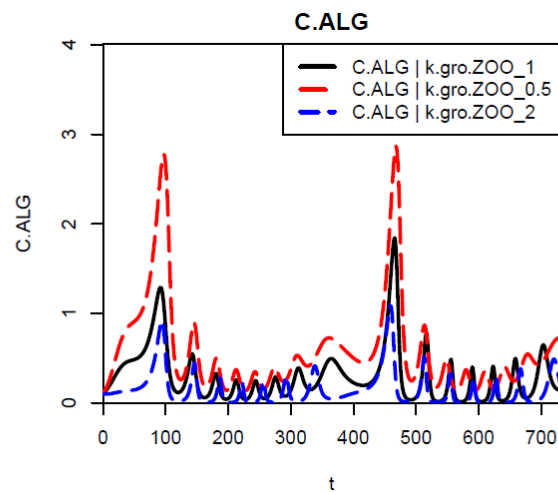
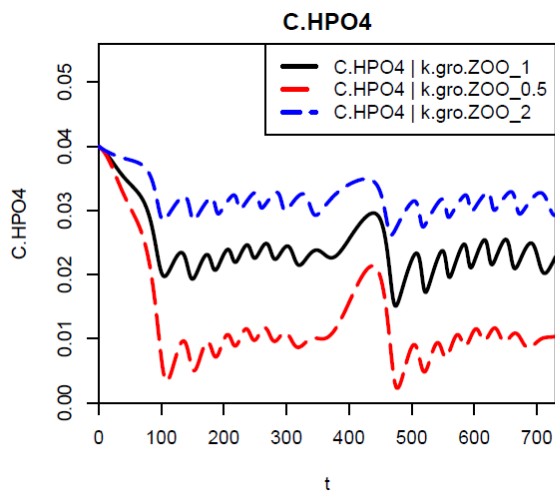
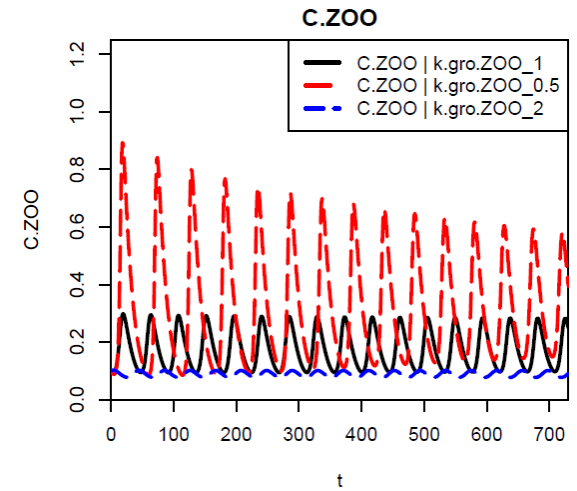
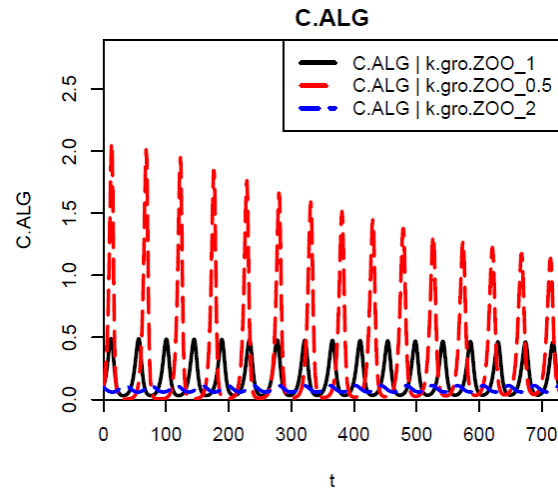
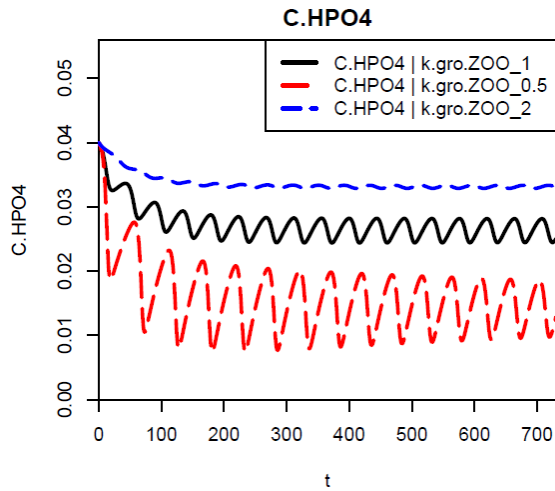
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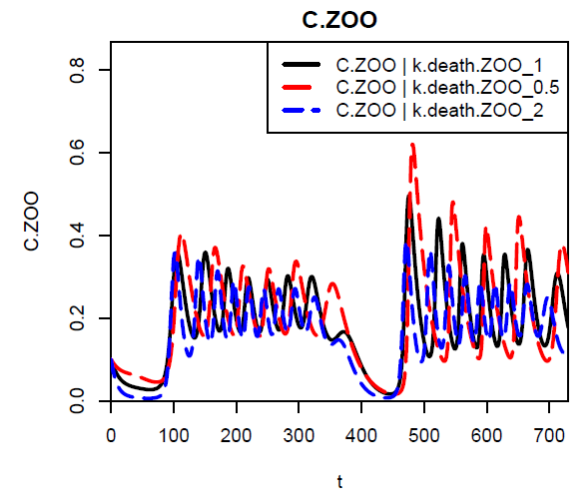
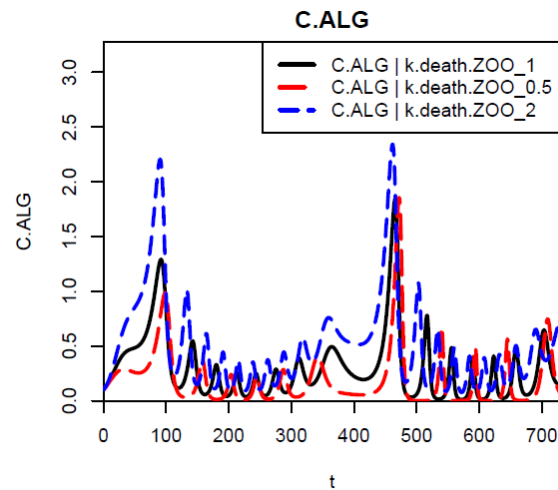
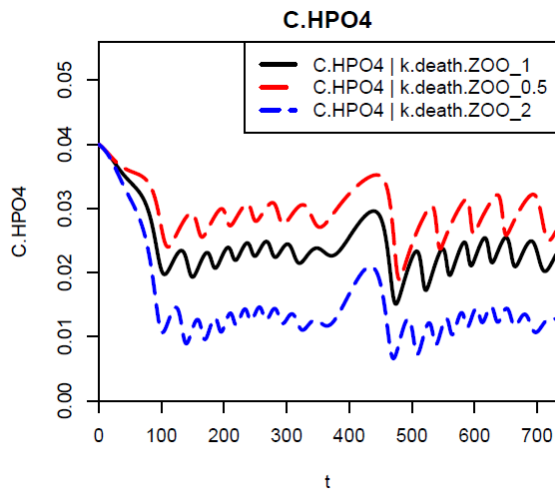
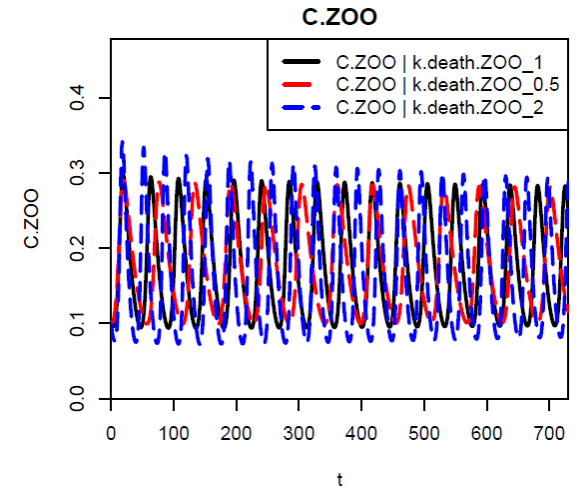
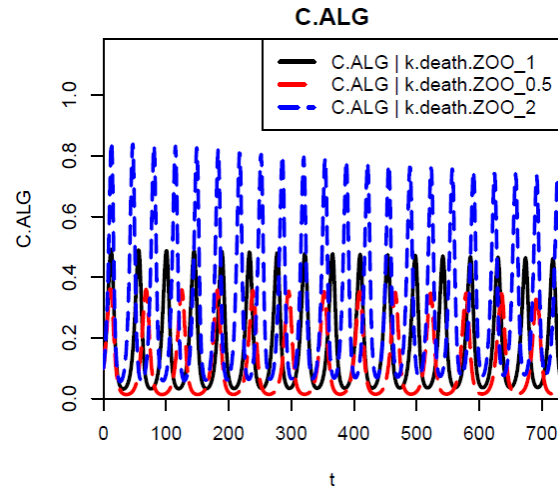
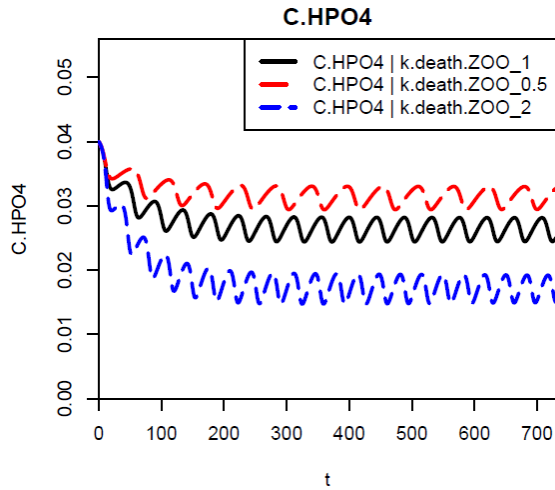
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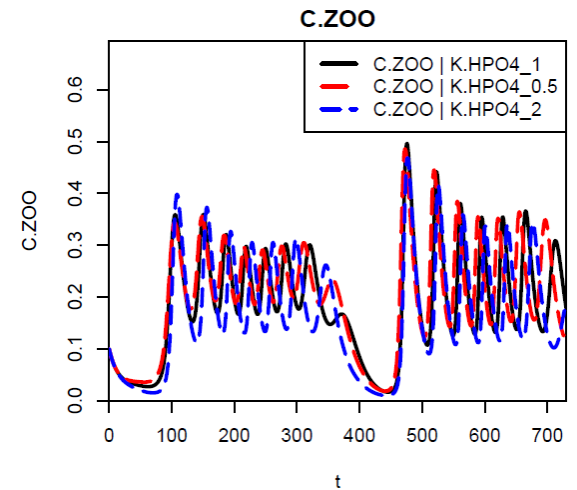
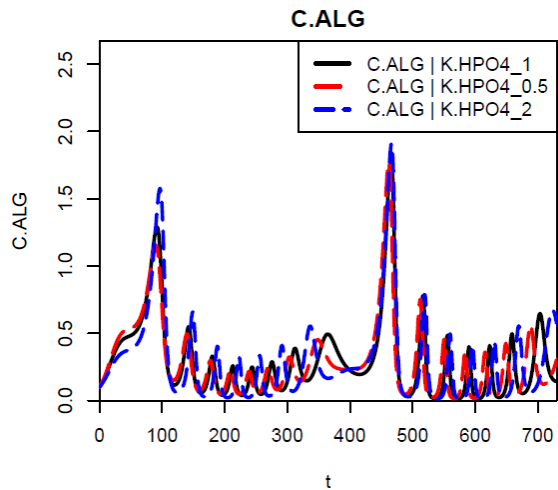
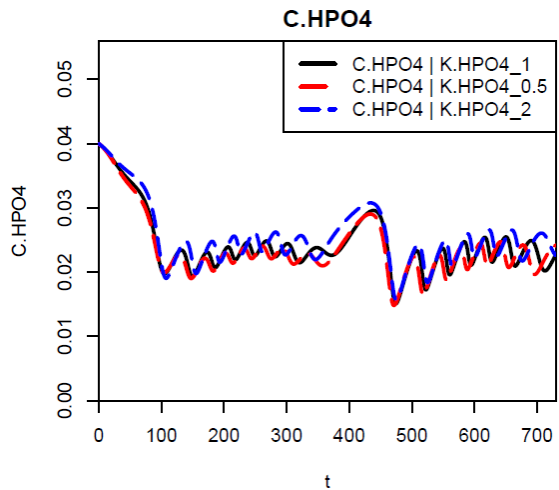
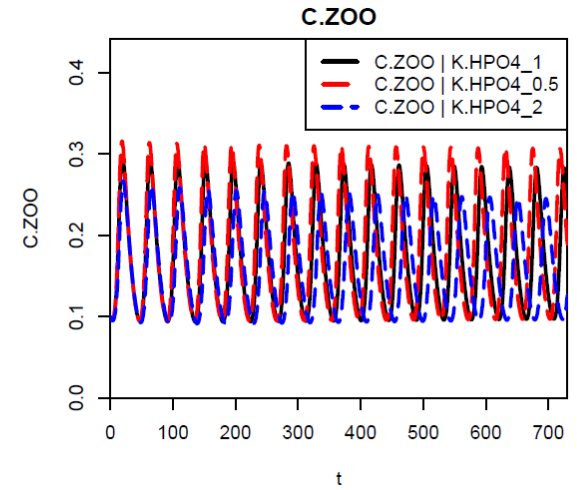
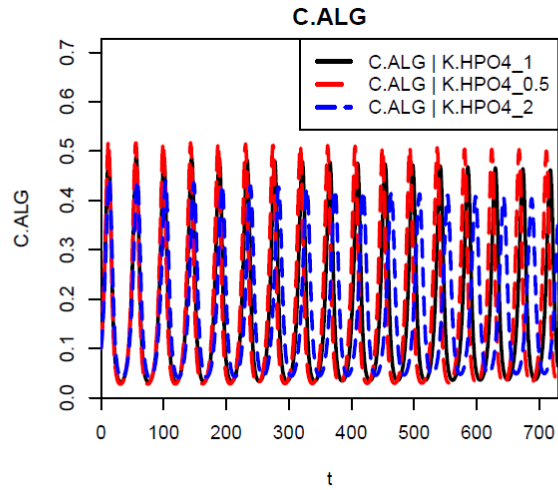
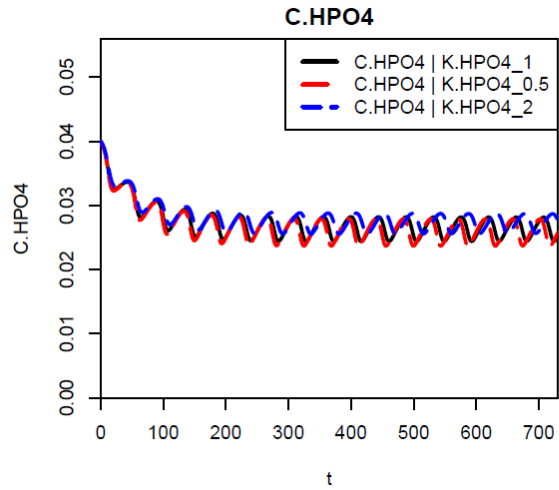
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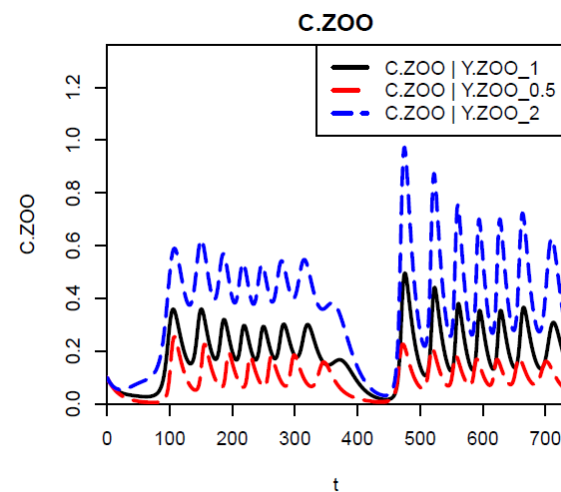
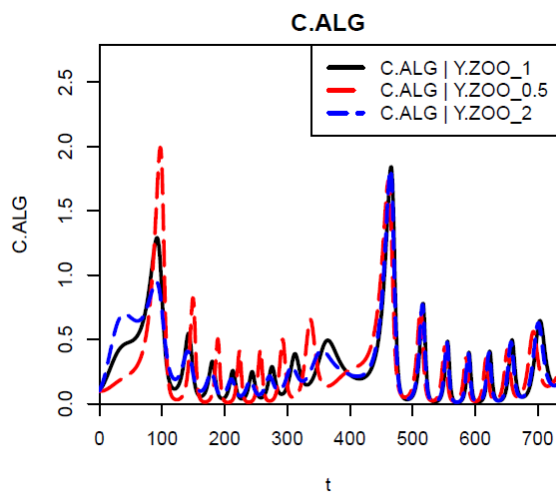
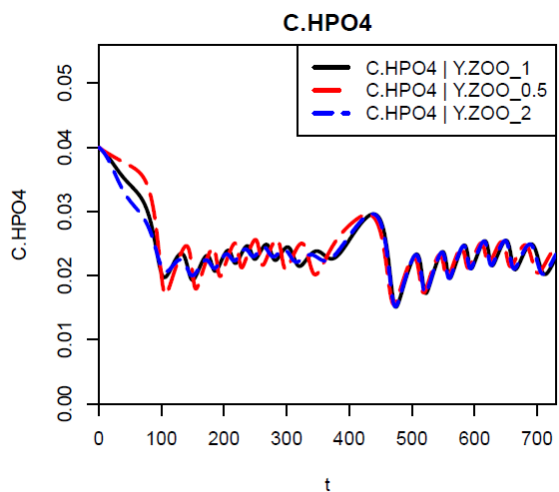
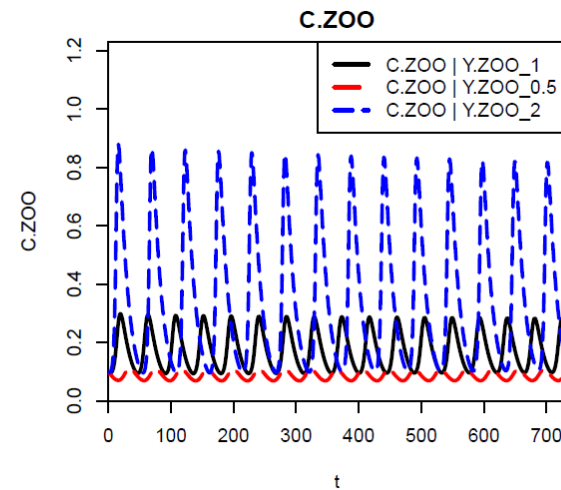
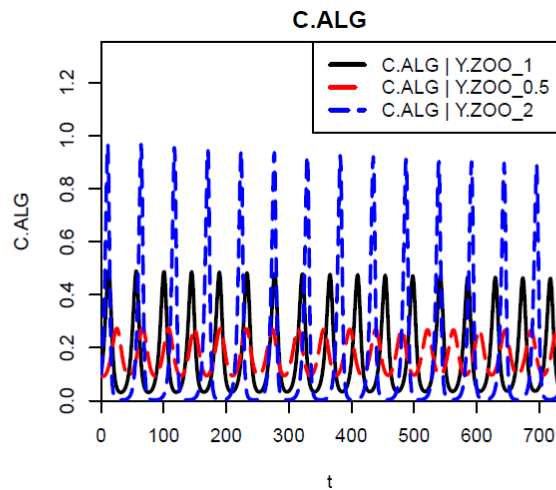
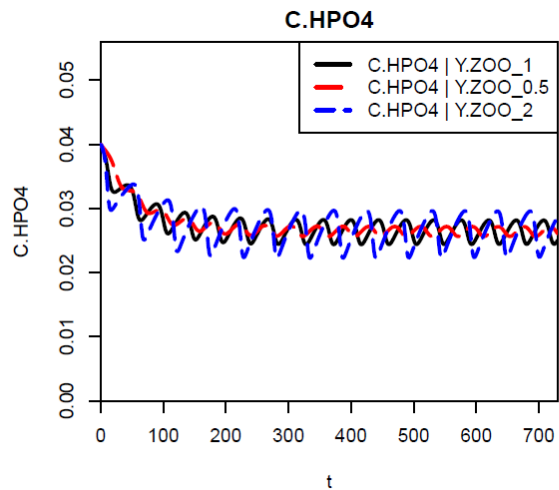
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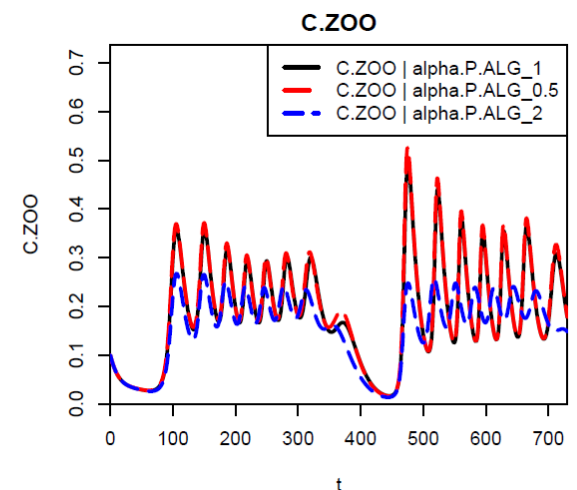
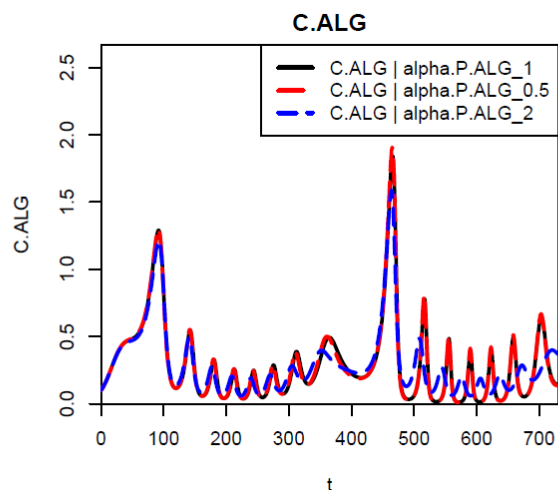
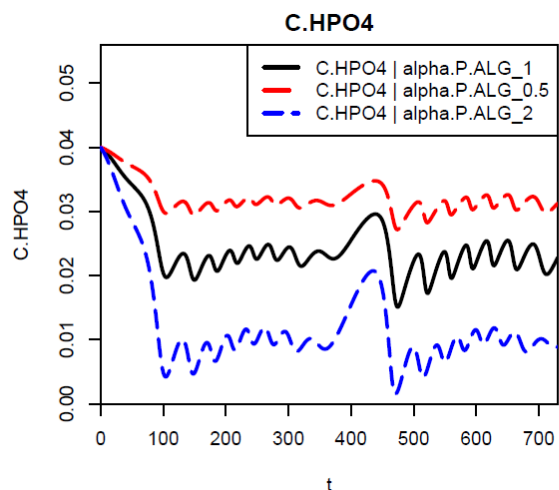
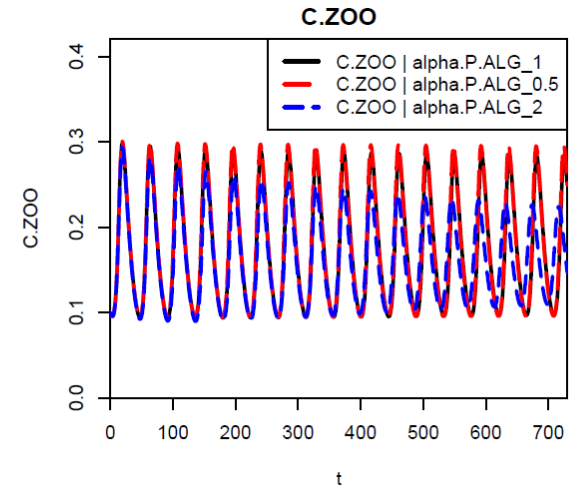
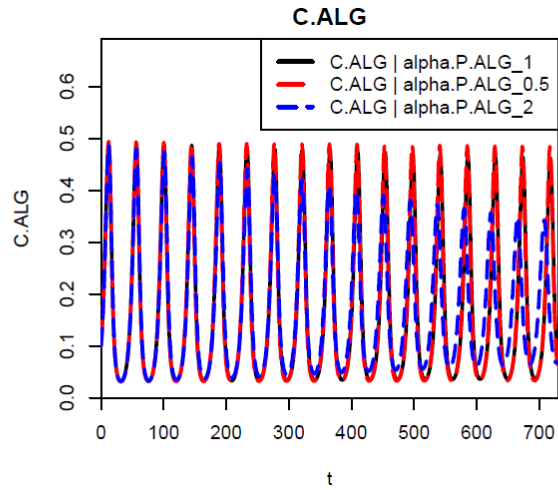
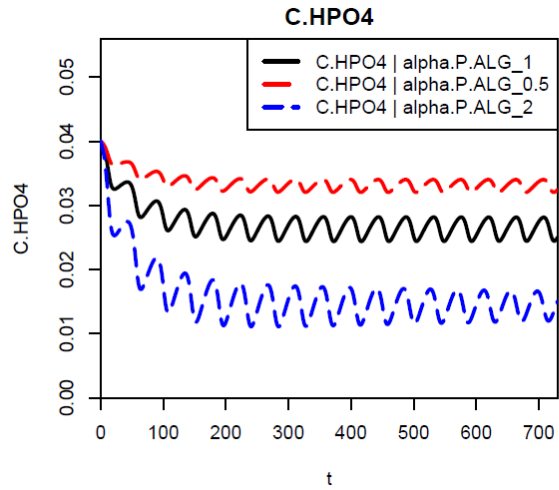
Review Exercise 2: Sensitivity Analysis



Review Exercise 2: Sensitivity Analysis



Review Exercise 2: Sensitivity Analysis



Review Exercise 2: Lessons learned?

Process i	Substances j					Rate
	S_1	S_2	S_3	\dots	S_{n_s}	
ρ_1	ν_{11}	ν_{12}	ν_{13}	\dots	ν_{1n_s}	ρ_1
ρ_2	ν_{21}	ν_{22}	ν_{23}	\dots	ν_{2n_s}	ρ_2
\vdots	\vdots	\vdots	\vdots	\ddots	\vdots	\vdots
ρ_{n_p}	$\nu_{n_p 1}$	$\nu_{n_p 2}$	$\nu_{n_p 3}$	\dots	$\nu_{n_p n_s}$	ρ_{n_p}

$$r_j = \sum_{i=1}^{n_p} \nu_{ij} \rho_i$$

How to derive the stoichiometric coefficients ν_{ij} ?

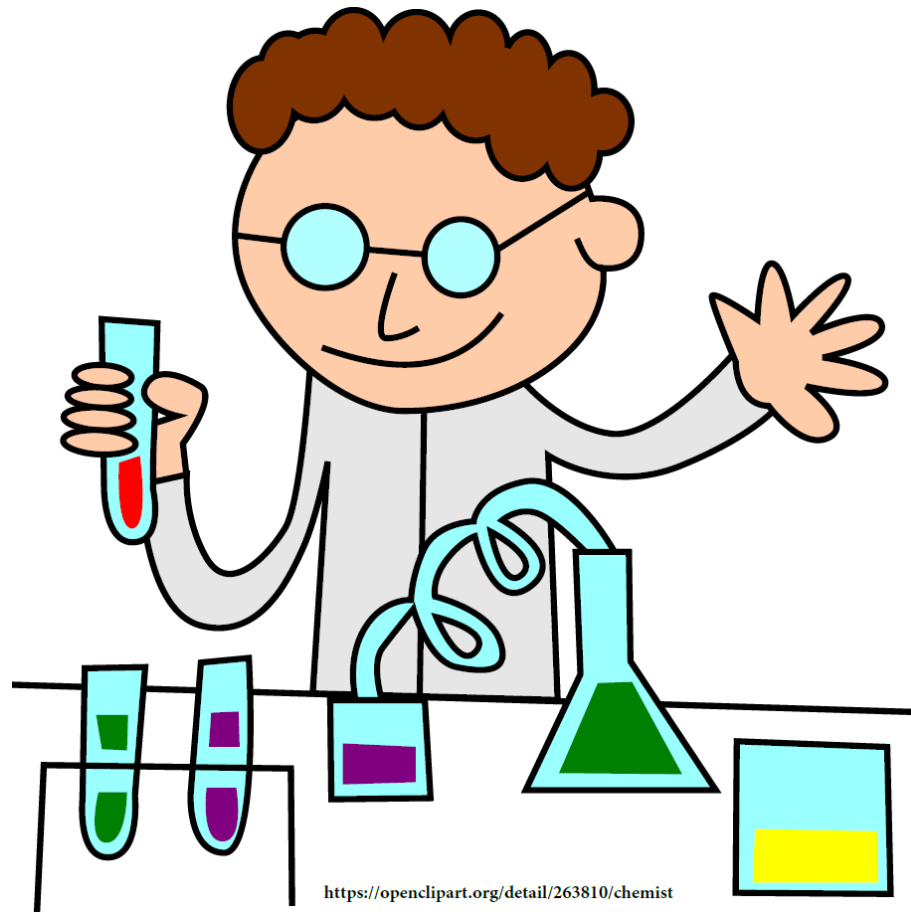
Stoichiometry: Ingredients for 1 cake?



Best recipe: <https://tinyurl.com/Schoggikuchen>

Process table for chocolate cake

process	Chocolate [g]	Egg [no.]	Butter [g]	Sugar [g]	Cake [no.]	rate [min ⁻¹]
baking a cake	-300	-5	-100	-100	+1	1/25 (at 180 °C)



3 ways to derive stoichiometric coefficients:

- Chemical substance notation
- Parameterized elemental mass fractions
- General solution

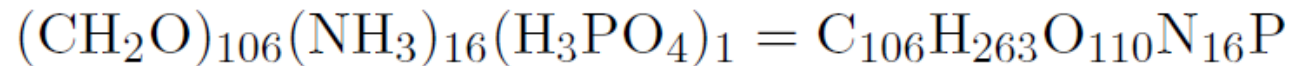
Process	Substances / Organisms						
	NH_4^+	NO_3^-	HPO_4^{2-}	O_2	ALG	ZOO	POM
	mol	mol	mol	mol	gDM	gDM	gDM
Growth of ALG, NH_4	?		?	?	1		
Growth of ALG, NO_3		?	?	?	1		
Respiration of ALG	?		?	?	-1		
Death of ALG					-1		1
Growth of ZOO	?		?	?	?	1	?
Respiration of ZOO	?		?	?		-1	
Death of ZOO						-1	1

here just units of measurement of the different substances

Additional substances for calculation of the stoichiometric coefficients:
 HCO_3^- , H^+ , H_2O

1. Example: Growth of algae

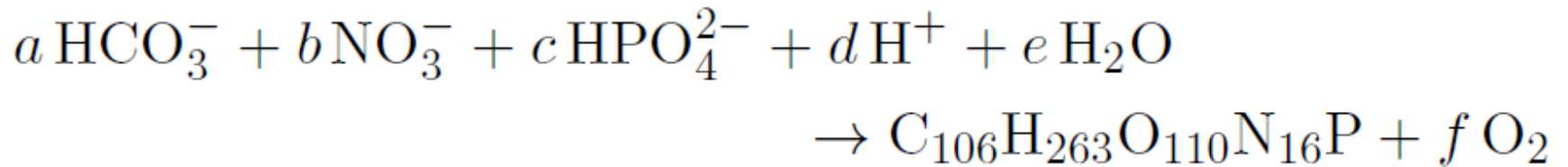
Typical composition of marine algae (Redfield, 1958)



Total “molar” mass:

$$\begin{aligned} M &= 106 \cdot 12 \frac{\text{gC}}{\text{“mol”}} + 263 \frac{\text{gH}}{\text{“mol”}} + 110 \cdot 16 \frac{\text{gO}}{\text{“mol”}} \\ &\quad + 16 \cdot 14 \frac{\text{gN}}{\text{“mol”}} + 31 \frac{\text{gP}}{\text{“mol”}} \\ &= 3550 \frac{\text{gDM}}{\text{“mol”}} \end{aligned}$$

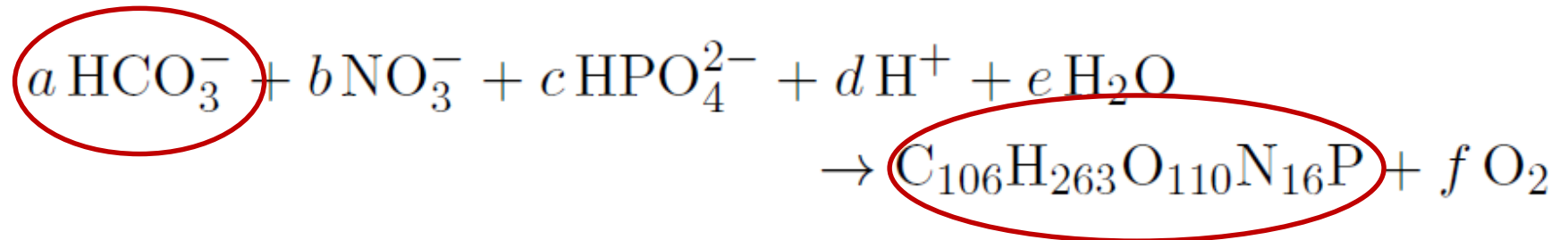
1. Example: Growth of algae with nitrate:



6 unknowns (a, b, c, d, e, f)

equations for the conservation of "mass": ?

1. Example: Growth of algae with nitrate:

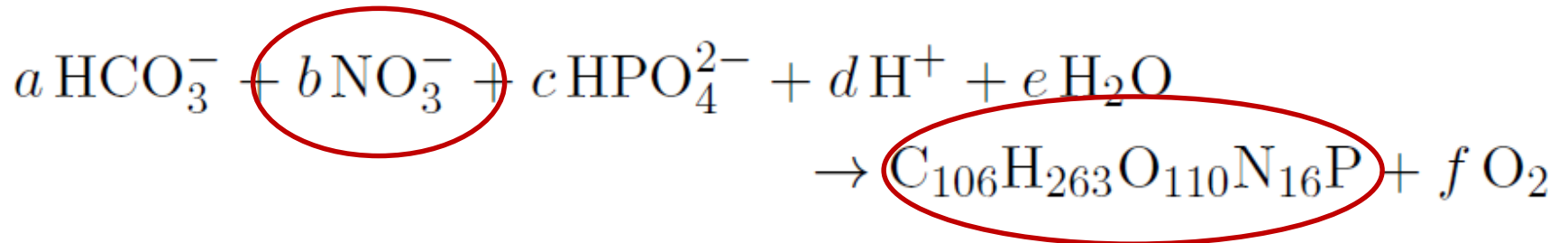


6 unknowns (a, b, c, d, e, f)

equations for the conservation of "mass": for C, H, O, N, P and charge

$$\text{C: } a \cdot 1 = 1 \cdot 106 \rightarrow a = 106$$

1. Example: Growth of algae with nitrate:



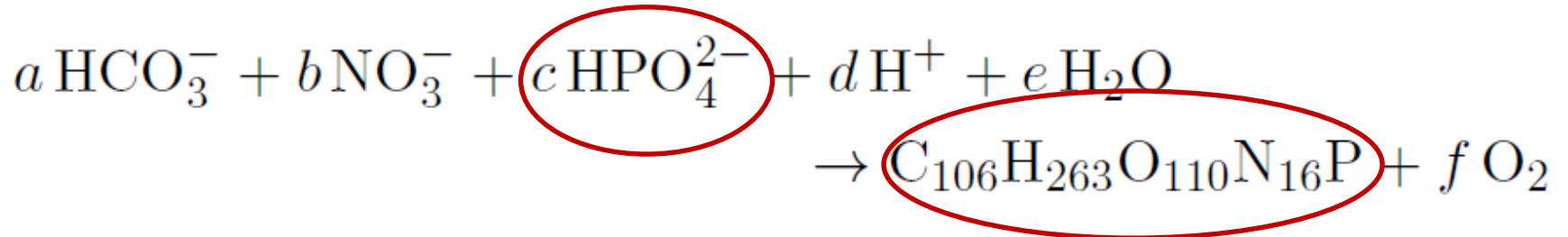
6 unknowns (a, b, c, d, e, f)

equations for the conservation of "mass": for C, H, O, N, P and charge

$$\text{C: } a \cdot 1 = 1 \cdot 106 \rightarrow a = 106$$

$$\text{N: } b \cdot 1 = 1 \cdot 16 \rightarrow b = 16$$

1. Example: Growth of algae with nitrate:



6 unknowns (a, b, c, d, e, f)

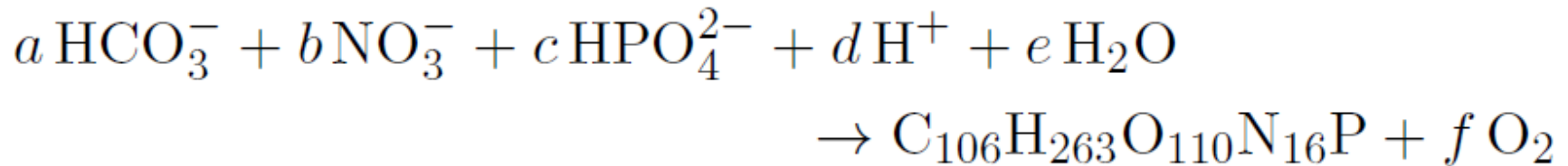
equations for the conservation of "mass": for C, H, O, N, P and charge

$$\text{C: } a \cdot 1 = 1 \cdot 106 \rightarrow a = 106$$

$$\text{N: } b \cdot 1 = 1 \cdot 16 \rightarrow b = 16$$

$$\text{P: } c \cdot 1 = 1 \cdot 1 \rightarrow c = 1$$

1. Example: Growth of algae with nitrate:



6 unknowns (a, b, c, d, e, f)

equations for the conservation of "mass": for C, H, O, N, P and charge

$$a = 106, b = 16, c = 1$$

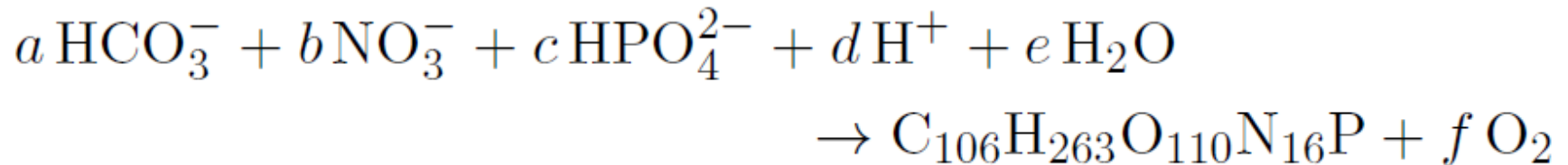
$$\text{H: } 106 \cdot 1 + 1 \cdot 1 + (d) \cdot 1 + (e) \cdot 2 = 1 \cdot 263 \quad ,$$

$$\text{O: } 106 \cdot 3 + 16 \cdot 3 + 1 \cdot 4 + (e) \cdot 1 = 1 \cdot 110 + (f) \cdot 2 \quad ,$$

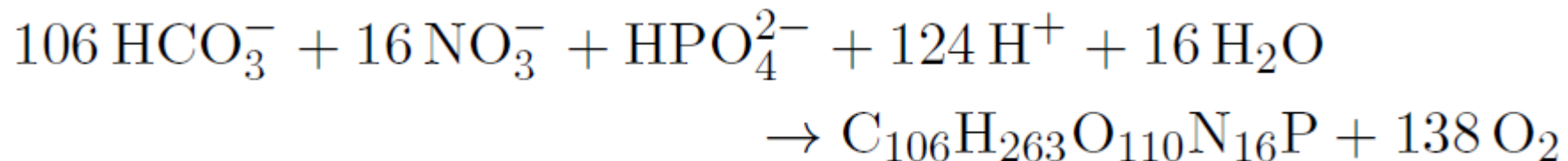
$$\text{e}^-: 106 \cdot (-1) + 16 \cdot (-1) + 1 \cdot (-2) + (d) \cdot (+1) = 0 \quad .$$

$$d = 124 \quad e = 16 \quad f = 138$$

1. Example: Growth of algae with nitrate:



$$a = 106, b = 16, c = 1, d = 124, e = 16, f = 138$$



$$M_{ALG} = 3550 \frac{\text{gDM}}{\text{“mol”}}$$

Stoichiometric coefficients for growth of algae:

$$\begin{aligned}\nu_{\text{gro,ALG,NO3 HCO}_3^-} &= -\frac{106}{3550} \frac{\text{molHCO}_3^-}{\text{gDM}} \\ \nu_{\text{gro,ALG,NO3 NO}_3^-} &= -\frac{16}{3550} \frac{\text{molNO}_3^-}{\text{gDM}} \\ \nu_{\text{gro,ALG,NO3 HPO}_4^{2-}} &= -\frac{1}{3550} \frac{\text{molHPO}_4^{2-}}{\text{gDM}} \\ \nu_{\text{gro,ALG,NO3 H}^+} &= -\frac{124}{3550} \frac{\text{molH}^+}{\text{gDM}} \\ \nu_{\text{gro,ALG,NO3 H}_2\text{O}} &= -\frac{16}{3550} \frac{\text{molH}_2\text{O}}{\text{gDM}} \\ \nu_{\text{gro,ALG,NO3 ALG}} &= 1 \frac{\text{gDM}}{\text{gDM}} \\ \nu_{\text{gro,ALG,NO3 O}_2} &= \frac{138}{3550} \frac{\text{molO}_2}{\text{gDM}}\end{aligned}$$

Check-in about the course

Go to

www.menti.com

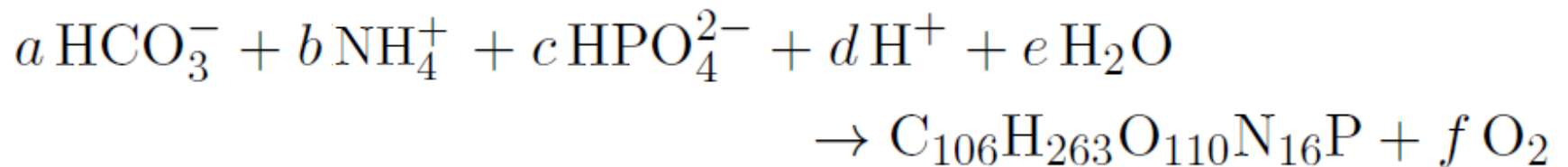
Enter the code

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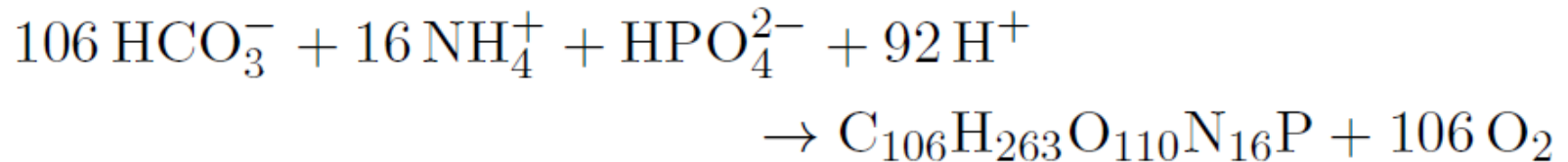


Or use QR code

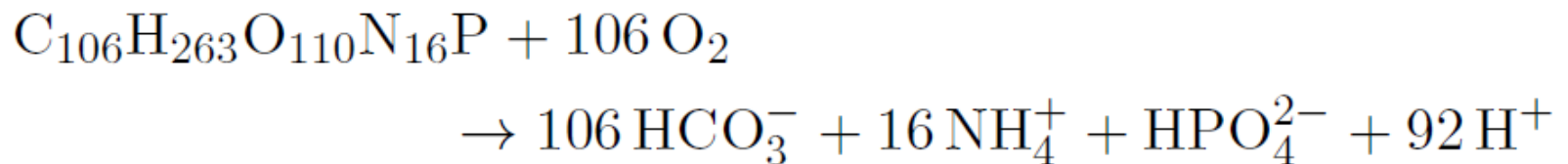
Do exercise L2 Task 1



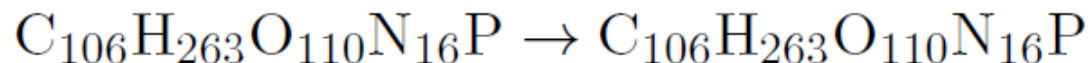
Similarly for algal growth with ammonium:



Respiration:



Death:



Process	Substances / Organisms						
	NH_4^+ mol	NO_3^- mol	HPO_4^{2-} mol	O_2 mol	ALG gDM	ZOO gDM	POM gDM
Growth of ALG, NH_4	?		?	?	1		
Growth of ALG, NO_3		?	?	?	1		
Respiration of ALG	?		?	?	-1		
Death of ALG					-1		1
Growth of ZOO	?		?	?	?	1	?
Respiration of ZOO	?		?	?		-1	
Death of ZOO						-1	1

→ how many unknowns?

Additional substances for calculation of the stoichiometric coefficients:
 HCO_3^- , H^+ , H_2O

Zooplankton Growth:

8 unknown stoichiometric coefficients

6 mass balance equations

2 additional constraints required:

Fraction of zooplankton biomass produced per algal biomass consumed (yield): Y_{ZOO}

Fraction of dead particles produced (excretion + sloppy feeding) per algal biomass consumed: f_e

The fraction of algal biomass respired is then: $f_r = 1 - Y_{ZOO} - f_e$

Process	Substances / Organisms						
	NH_4^+ mol	NO_3^- mol	HPO_4^{2-} mol	O_2 mol	ALG gDM	ZOO gDM	POM gDM
Gro. ALG,NH4	$-\frac{16}{3550}$		$-\frac{1}{3550}$	$\frac{106}{3550}$	1		
Gro. ALG,NO3		$-\frac{16}{3550}$	$-\frac{1}{3550}$	$\frac{138}{3550}$	1		
Resp. ALG	$\frac{16}{3550}$		$\frac{1}{3550}$	$-\frac{106}{3550}$	-1		
Death ALG					-1		1
Growth ZOO	$\frac{f_r}{Y_{ZOO}} \frac{16}{3550}$		$\frac{f_r}{Y_{ZOO}} \frac{1}{3550}$	$-\frac{f_r}{Y_{ZOO}} \frac{106}{3550}$	$-\frac{1}{Y_{ZOO}}$	1	$\frac{f_e}{Y_{ZOO}}$
Resp. ZOO	$\frac{16}{3550}$		$\frac{1}{3550}$	$-\frac{106}{3550}$		-1	
Death ZOO						-1	1

Chemical Substance Notation:

Quite some handwork!

If composition changes: redo the calculation!

→ instead of fixed composition use parameters for elemental mass fractions

3 ways to derive stoichiometric coefficients:

- Chemical substance notation
- Parameterized elemental mass fractions
- General solution

Processes i	Substances j					Rates
	s_1	s_2	s_3	\dots	s_{n_s}	
p_1	ν_{11}	ν_{12}	ν_{13}	\dots	ν_{1n_s}	ρ_1
p_2	ν_{21}	ν_{22}	ν_{23}	\dots	ν_{2n_s}	ρ_2
\vdots	\vdots	\vdots	\vdots	\ddots	\vdots	\vdots
p_{n_p}	$\nu_{n_p 1}$	$\nu_{n_p 2}$	$\nu_{n_p 3}$	\dots	$\nu_{n_p n_s}$	ρ_{n_p}
Elements k						
e_1	α_{11}	α_{12}	α_{13}	\dots	α_{1n_s}	
e_2	α_{21}	α_{22}	α_{23}	\dots	α_{2n_s}	
\vdots	\vdots	\vdots	\vdots	\ddots	\vdots	
e_{n_e}	$\alpha_{n_e 1}$	$\alpha_{n_e 2}$	$\alpha_{n_e 3}$	\dots	$\alpha_{n_e n_s}$	

ν_{ij} : stoich. coeff. = relative transf. rate of substance j in proc. i

α_{kj} : mass fraction of element k on substance j

$\nu_{ij}\alpha_{kj}$: relative transf. rate of element k contained in subst. j

Processes i	Substances j					Rates
	s_1	s_2	s_3	\dots	s_{n_s}	
p_1	ν_{11}	ν_{12}	ν_{13}	\dots	ν_{1n_s}	ρ_1
p_2	ν_{21}	ν_{22}	ν_{23}	\dots	ν_{2n_s}	ρ_2
\vdots	\vdots	\vdots	\vdots	\ddots	\vdots	\vdots
p_{n_p}	$\nu_{n_p 1}$	$\nu_{n_p 2}$	$\nu_{n_p 3}$	\dots	$\nu_{n_p n_s}$	ρ_{n_p}
Elements k						
e_1	α_{11}	α_{12}	α_{13}	\dots	α_{1n_s}	
e_2	α_{21}	α_{22}	α_{23}	\dots	α_{2n_s}	
\vdots	\vdots	\vdots	\vdots	\ddots	\vdots	
e_{n_e}	$\alpha_{n_e 1}$	$\alpha_{n_e 2}$	$\alpha_{n_e 3}$	\dots	$\alpha_{n_e n_s}$	

Mass conservation for element k in process i :

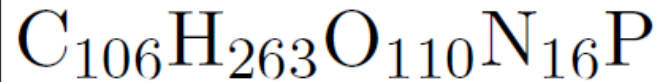
$$\sum_j \nu_{ij} \alpha_{kj} = 0$$

Process	Substances / Organisms						
	NH_4^+ mol	NO_3^- mol	HPO_4^{2-} mol	O_2 mol	ALG gDM	ZOO gDM	POM gDM
Growth of ALG, NH_4	?		?	?	1		
Growth of ALG, NO_3		?	?	?	1		
Respiration of ALG	?		?	?	-1		
Death of ALG					-1		1
Growth of ZOO	?		?	?	?	1	?
Respiration of ZOO	?		?	?		-1	
Death of ZOO						-1	1

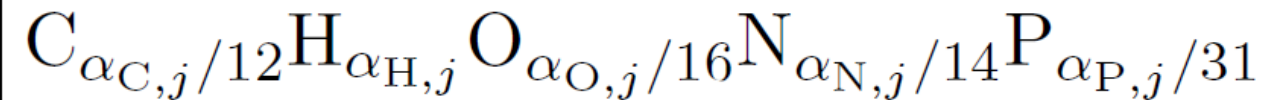
Additional substances for calculation of the stoichiometric coefficients:
 HCO_3^- , H^+ , H_2O

Mass balance equations for C,H,O,N,P and charge

Instead of assuming a fixed chemical composition (e.g. Redfield:)



use parameterized mass fractions:



with:

$$\alpha_{\text{C},j} + \alpha_{\text{H},j} + \alpha_{\text{O},j} + \alpha_{\text{N},j} + \alpha_{\text{P},j} = 1$$

Redfield composition:

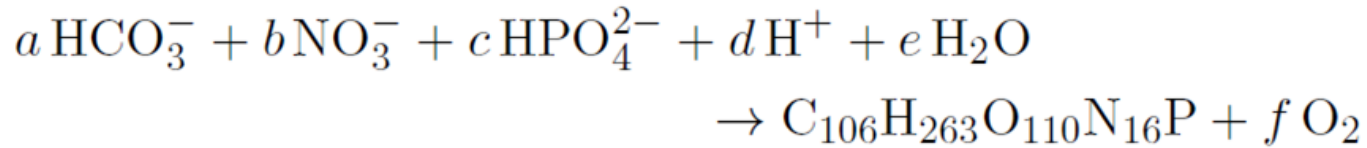
$$\alpha_{C,ALG}^{\text{Redfield}} = \frac{106 \cdot 12}{3550} \frac{\text{gC}}{\text{gDM}} \approx 0.36 \frac{\text{gC}}{\text{gDM}}$$

$$\alpha_{H,ALG}^{\text{Redfield}} = \frac{263}{3550} \frac{\text{gH}}{\text{gDM}} \approx 0.07 \frac{\text{gH}}{\text{gDM}}$$

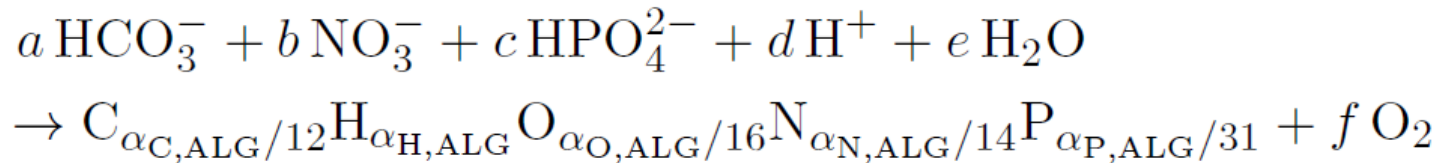
$$\alpha_{O,ALG}^{\text{Redfield}} = \frac{110 \cdot 16}{3550} \frac{\text{gO}}{\text{gDM}} \approx 0.50 \frac{\text{gO}}{\text{gDM}}$$

$$\alpha_{N,ALG}^{\text{Redfield}} = \frac{16 \cdot 14}{3550} \frac{\text{gN}}{\text{gDM}} \approx 0.06 \frac{\text{gN}}{\text{gDM}}$$

$$\alpha_{P,ALG}^{\text{Redfield}} = \frac{1 \cdot 31}{3550} \frac{\text{gP}}{\text{gDM}} \approx 0.01 \frac{\text{gP}}{\text{gDM}}$$



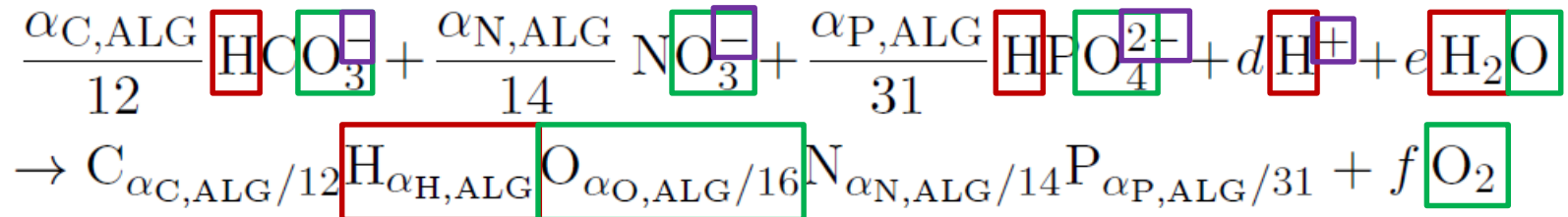
Setting up equation for algal growth with unknown coefficients:



Conservation of C: $a = \frac{\alpha_{\text{C,ALG}}}{12}$

Conservation of N: $b = \frac{\alpha_{\text{N,ALG}}}{14}$

Conservation of P: $c = \frac{\alpha_{\text{P,ALG}}}{31}$



Conservation of H, O and charge:

$$\text{H: } \frac{\alpha_{C,ALG}}{12} \cdot 1 + \frac{\alpha_{P,ALG}}{31} \cdot 1 + d \cdot 1 + e \cdot 2 = 1 \cdot \alpha_{H,ALG}$$

$$\text{O: } \frac{\alpha_{C,ALG}}{12} \cdot 3 + \frac{\alpha_{N,ALG}}{14} \cdot 3 + \frac{\alpha_{P,ALG}}{31} \cdot 4 + e \cdot 1 = 1 \cdot \frac{\alpha_{O,ALG}}{16} + f \cdot 2$$

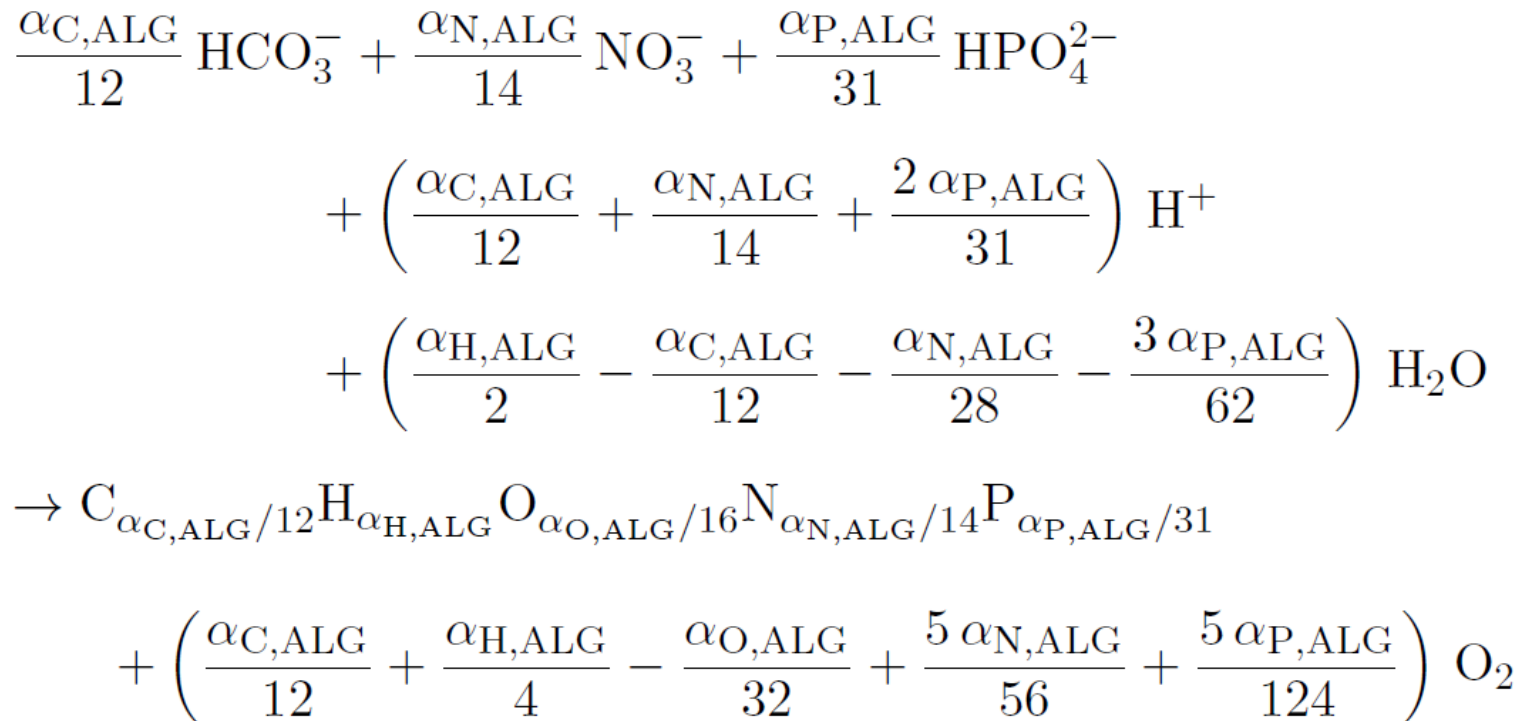
$$\text{charge: } \frac{\alpha_{C,ALG}}{12} \cdot (-1) + \frac{\alpha_{N,ALG}}{14} \cdot (-1) + \frac{\alpha_{P,ALG}}{31} \cdot (-2) + d \cdot (+1) = 0$$

$$d = \frac{\alpha_{C,ALG}}{12} + \frac{\alpha_{N,ALG}}{14} + \frac{2 \alpha_{P,ALG}}{31}$$

$$e = \frac{\alpha_{H,ALG}}{2} - \frac{\alpha_{C,ALG}}{12} - \frac{\alpha_{N,ALG}}{28} - \frac{3 \alpha_{P,ALG}}{62}$$

$$f = \frac{\alpha_{C,ALG}}{12} + \frac{\alpha_{H,ALG}}{4} - \frac{\alpha_{O,ALG}}{32} + \frac{5 \alpha_{N,ALG}}{56} + \frac{5 \alpha_{P,ALG}}{124}$$

Growth of algae:



Do exercise L2 Task 2

Parameterized Mass Fractions:

Changes in composition are now easy to handle,
just change the numerical values of the parameters.

What about adding additional elements?

The equations must be revised.

This is a laborious process.

Is there a general solution to this process?

→ Swiss Army Knife of Linear Algebra



1. Find out what the Swiss Army Knife of Linear Algebra is (hint: SVD)
2. Read chapter 4.3.3
3. Read chapter 14
4. Think about your open questions
5. Bonus: Try out the chocolate cake recipe



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