Eawag: Swiss Federal Institute of Aquatic Science and Technology

ETH zürich **DUSYS**



Modelling Aquatic Ecosystems Course 701-0426-00

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

- ETH zürich eawag aquatic research 80000
- 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 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

Check-in about the course



Mentimeter

Thank you for your feedback!

Course evaluation

Please rate the extent to which you were satisfied or dissatisfied about the following:

Overall, I am satisfied with the course so far	
The lectures are presented well	
The exercises are useful	
The exercises are well explained	
I feel comfortable asking questions	
you are invited to also ask after the course and in the breaks	
We always welcome suggestions for improvements!	0

Any cake recipes you want to share?





Short repetition of last week:

- Learn to calculate stoichiometric coefficients
 - from chemical substance notation (section 4.3.1)
 - using parameterized elemental mass fractions (section 4.3.2)

Today:

- general solution of stoichiometric equations: theory (section 4.3.3)
- general solution of stoichiometric equations: exercise (R-package stoichcalc; chapter 15)



Process table

Process i		Sub	ostance	es j		Rate			
	s ₁	\mathbf{S}_2	S_3	•••	${\sf S}_{n_{ m s}}$				
p_1	ν_{11}	$ u_{12}$	ν_{13}	•••	$ u_{1n_{\mathrm{s}}} $	$ ho_1$			
p_2	ν_{21}	ν_{22}	ν_{23}	•••	$ u_{2n_{ m s}}$	$ ho_2$			
÷	:	÷	÷	·	÷	:			
$p_{n_{\mathrm{p}}}$	$ u_{n_{\mathrm{p}}1}$	$\nu_{n_{\mathrm{p}}2}$	$ u_{n_{\mathrm{p}}3}$	•••	$ u_{n_{ m p}n_{ m s}}$	$ ho_{n_{ m p}}$			
$r_j = \sum_{i=1}^{n_{\rm p}} \nu_{ij} \ \rho_i$									

How to derive the stoichiometric coefficients v_{ij} ?

Idea: Conservation of mass of elements and charge constrain the stoichiometric coefficients



3 ways to derive stoichiometric coefficients:

- Chemical substance notation
- Parameterized elemental mass fractions
- General solution of stoichiometric equations

Extended Process Table Notation

Processes i	Processes i Substances j					Rates
	s_1	\mathbf{S}_2	S_3	•••	${\sf S}_{n_{ m s}}$	
p ₁	ν_{11}	ν_{12}	ν_{13}	•••	$\nu_{1n_{\rm s}}$	ρ_1
p_2	ν_{21}	ν_{22}	ν_{23}	•••	$\nu_{2n_{\rm s}}$	$ ho_2$
:	÷	:	÷	·	:	÷
$p_{n_{\mathrm{p}}}$	$\nu_{n_{\mathrm{p}}1}$	$\nu_{n_{\mathrm{p}}2}$	$\nu_{n_{\mathrm{p}}3}$	•••	$\nu_{n_{\rm p}n_{\rm s}}$	$ ho_{n_{ m p}}$
Elements k						
e ₁	α_{11}	α_{12}	α_{13}	•••	$\alpha_{1n_{\mathbf{s}}}$	
e_2	α_{21}	α_{22}	α_{23}	•••	$\alpha_{2n_{\mathbf{s}}}$	
:	÷	÷	÷	·	÷	
$e_{n_{\mathbf{e}}}$	$\alpha_{n_{\rm e}1}$	$\alpha_{n_{\rm e}2}$	$\alpha_{n_{\rm e}3}$	•••	$\alpha_{n_{\rm e}n_{\rm s}}$	

- ν_{ij} : stoich. coeff. = relative trans. rate of substance *j* in process *i*
- α_{kj} : mass fraction of element k in substance j
- $\nu_{ij}\alpha_{kj}$: rel. trans. rate by proc. *i* of element *k* contained in subst. *j*

Extended Process Table Notation

Processes i		Sul	ostance	es j		Rates
	s_1	s_2	S_3	•••	${\sf S}_{n_{ m s}}$	
p ₁	ν_{11}	ν_{12}	ν_{13}	•••	$\nu_{1n_{\rm s}}$	ρ_1
p_2	ν_{21}	ν_{22}	ν_{23}	•••	$\nu_{2n_{\rm s}}$	$ ho_2$
:	÷	:	÷	·	:	:
$p_{n_{\mathrm{p}}}$	$\nu_{n_{\mathrm{p}}1}$	$\nu_{n_{\mathrm{p}}2}$	$\nu_{n_{\rm p}3}$	•••	$\nu_{n_{\rm p}n_{\rm s}}$	$ ho_{n_{ m p}}$
Elements k						
e ₁	α_{11}	α_{12}	α_{13}	•••	$\alpha_{1n_{\mathbf{s}}}$	
e_2	α_{21}	α_{22}	α_{23}	•••	$\alpha_{2n_{\mathbf{s}}}$	
:	÷	÷	÷	·	÷	
$e_{n_{\mathbf{e}}}$	$\alpha_{n_{\rm e}1}$	$\alpha_{n_{\rm e}2}$	$\alpha_{n_{\rm e}3}$	•••	$\alpha_{n_{\rm e}n_{\rm s}}$	

Mass conservation for element *k* in process *i*:

*n*_e constraints for each process from "elemental" composition (incl. charge)

$$\sum_{j} \nu_{ij} \alpha_{kj} = 0$$

V	NH4	NO3	HPO4	HCO3	02	н	H2O	ALG	ZOO	POM
	[mol]	[gDM]	[gDM]	[gDM]						
gro.ALG.NH4	-		-	-	+	?	?	1		
gro.ALG.NO3		-	-	-	+	?	?	1		
resp.ALG	+		+	+	-	?	?	-1		
death.ALG	0/+		0/+	0/+	+	?	?	-1		+
gro.ZOO	+		+	+	-	?	?	-	1	+
resp.ZOO	+		+	+	-	?	?		-1	
death.ZOO	0/+		0/+	0/+	+	?	?		-1	+

Choice of units: We measure inorganic compounds in moles, but organic compounds and organisms as dry mass.

Moles do not make much sense for organic compounds, because even if we use chemical notation, this is not meant to represent molecules.

v		NH4	NO3	HPO4	HCO3	02	н	H2O	ALG	ZOO	POM
		[mol]	[gDM]	[gDM]	[gDM]						
gro.ALG	i.NH4	-		-	-	+	?	?	1		
gro.ALG	i.NO3		-	-	-	+	?	?	1		
resp.ALG		+		+	+	-	?	?	-1		
death.ALG		0/+		0/+	0/+	+	?	?	-1		+
gro.ZOO		+		+	+	-	?	?	-	1	+
resp.ZO	0	+		+	+	-	?	?		-1	
death.Z	00	0/+		0/+	0/+	+	?	?		-1	+
α											
С	[mol]	0	0	0	1	0	0	0	0.030417	0.03	0.04025
н	[mol]	4	0	1	1	0	1	2	0.07	0.07	0.07
0	[mol]	0	3	4	3	2	0	1	0.03125	0.03125	0.025
Ν	[mol]	1	1	0	0	0	0	0	0.004286	0.004286	0.002857
Р	[mol]	0	0	1	0	0	0	0	0.000161	0.000323	0.000226
charge	[mol]	1	-1	-2	-1	0	1	0	0	0	0

$$\sum_{j} \nu_{ij} \alpha_{kj} = 0$$

Т

For growth of algae on nitrate:

6 unknown stoichiometric coefficients v,

6 mass balance equations (C,H,O,N,P,charge)

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 \rightarrow can be solved



Example: Algae growth

Typical composition of marine algae (Redfield, 1958)

$$(CH_2O)_{106}(NH_3)_{16}(H_3PO_4)_1 = C_{106}H_{263}O_{110}N_{16}P$$

Total "molar" mass

(this is an average composition that does not represent a molecule):

$$m = 106 \cdot 12 \frac{\text{gC}}{\text{``mol''}} + 263 \frac{\text{gH}}{\text{``mol''}} + 110 \cdot 16 \frac{\text{gO}}{\text{``mol''}} + 16 \cdot 14 \frac{\text{gN}}{\text{``mol''}} + 31 \frac{\text{gP}}{\text{``mol''}} = 3550 \frac{\text{gDM}}{\text{``mol''}} \quad .$$



Example: Algae growth

Write down the chemical reaction equation including all substances that are needed to close the mass balance:

$$a \operatorname{HCO}_{3}^{-} + b \operatorname{NO}_{3}^{-} + c \operatorname{HPO}_{4}^{2-} + d \operatorname{H}^{+} + e \operatorname{H}_{2}\operatorname{O}$$

 $\rightarrow \operatorname{C}_{106}\operatorname{H}_{263}\operatorname{O}_{110}\operatorname{N}_{16}\operatorname{P} + f \operatorname{O}_{2}$

Solving the mass balance equations for C, H, O, N, P and charge leads to the unique solution (6 eq. for 6 unknowns):

$$106 \operatorname{HCO}_{3}^{-} + 16 \operatorname{NO}_{3}^{-} + \operatorname{HPO}_{4}^{2-} + 124 \operatorname{H}^{+} + 16 \operatorname{H}_{2}\operatorname{O} \\ \rightarrow \operatorname{C}_{106}\operatorname{H}_{263}\operatorname{O}_{110}\operatorname{N}_{16}\operatorname{P} + 138 \operatorname{O}_{2}$$

$106 \operatorname{HCO}_{3}^{-} + 16 \operatorname{NO}_{3}^{-} + \operatorname{HPO}_{4}^{2-} + 124 \operatorname{H}^{+} + 16 \operatorname{H}_{2}\operatorname{O} \\ \rightarrow \operatorname{C}_{106}\operatorname{H}_{263}\operatorname{O}_{110}\operatorname{N}_{16}\operatorname{P} + 138 \operatorname{O}_{2}$

Conversion of units:

$\nu_{ m gro,ALG,NO3~HCO_3^-}$	=	$-\frac{106}{3550} \frac{\mathrm{molHCO}_3^-}{\mathrm{gDM}}$
$\nu_{\rm gro,ALG,NO3~NO_3^-}$	=	$-\frac{16}{3550} \frac{\mathrm{molNO}_3^-}{\mathrm{gDM}}$
$\nu_{ m gro,ALG,NO3~HPO_4^{2-}}$	=	$-\frac{1}{3550} \frac{\mathrm{molHPO_4^{2-}}}{\mathrm{gDM}}$
$\nu_{ m gro,ALG,NO3~H^+}$	=	$-\frac{124}{3550} \frac{\mathrm{molH^+}}{\mathrm{gDM}}$
$\nu_{ m gro,ALG,NO3~H_2O}$	=	$-\frac{16}{3550} \frac{\mathrm{molH}_2\mathrm{O}}{\mathrm{gDM}}$
$\nu_{ m gro,ALG,NO3}$ ALG	=	$1 \frac{\text{gDM}}{\text{gDM}}$
$\nu_{ m gro,ALG,NO3~O_2}$	=	$\frac{138}{3550} \frac{\text{molO}_2}{\text{gDM}}$

v		NH4	NO3	HPO4	HCO3	02	н	H2O	ALG	ZOO	POM
		[mol]	[mol]	[mol]	[mol]	[mol]	[mol]	[mol]	[gDM]	[gDM]	[gDM]
gro.ALG	i.NH4	-		-	-	+	?	?	1		
gro.ALG	i.NO3		-0.00429	-0.00016	-0.030417	0.03785	-0.0350	-0.00220	1		
resp.AL	G	+		+	+	-	?	?	-1		
death.A	LG	0/+		0/+	0/+	+	?	?	-1		+
gro.ZOC)	+		+	+	-	?	?	-	1	+
resp.ZO	0	+		+	+	-	?	?		-1	
death.Z	00	0/+		0/+	0/+	+	?	?		-1	+
α											
С	[mol]	0	0	0	1	0	0	0	0.030417	0.03	0.04025
н	[mol]	4	0	1	1	0	1	2	0.07	0.07	0.07
0	[mol]	0	3	4	3	2	0	1	0.03125	0.03125	0.025
Ν	[mol]	1	1	0	0	0	0	0	0.004286	0.004286	0.002857
Р	[mol]	0	0	1	0	0	0	0	0.000161	0.000323	0.000226
charge	[mol]	1	-1	-2	-1	0	1	0	0	0	0

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$$\sum_{j} \nu_{ij} \alpha_{kj} = 0$$

v		NH4	NO3	HPO4	HCO3	02	н	H2O	ALG	ZOO	РОМ	
		[mol]	[gDM]	[gDM]	[gDM]							
gro.ALG	.NH4	-		-	-	+	?	?	1			
gro.ALG	.NO3		-	-	-	+	?	?	1			
resp.ALC	G	+		+	+	-	?	?	-1			
death.A	LG	0/+		0/+	0/+	+	?	?	-1		+	
gro.ZOO		+		+	+	-	?	?	-	1	+	
resp.ZO	0	+		+	+	-	?	?		-1		
death.Z	00	0/+		0/+	0/+	+	?	?		-1	+	
α												
С	[mol]	0	0	0	1	0	0	0	0.030417	0.03	0.04025	
н	[mol]	4	0	1	1	0	1	2	0.07	0.07	0.07	
0	[mol]	0	3	4	3	2	0	1	0.03125	0.03125	0.025	
Ν	[mol]	1	1	0	0	0	0	0	0.004286	0.004286	0.002857	
Р	[mol]	0	0	1	0	0	0	0	0.000161	0.000323	0.000226	
charge	[mol]	1	-1	-2	-1	0	1	0	0	0	0	

 $\sum_{j} \nu_{ij} \alpha_{kj} = 0$

For growth of zooplankton:

8 unknown stoichiometric coefficients v,

6 mass balance equations (C,H,O,N,P,charge)

 \rightarrow the system of equations is underdetermined

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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: $f_{\rm r} = 1 - Y_{
m ZOO} - f_{
m e}$

1 ALG = Y_{Zoo} Zoo + f_e POM + (1- Y_{Zoo} - f_e) * ("nutrients")

1 Zoo $-1/Y_{Zoo}$ ALG + f_e/Y_{Zoo} POM + $(1 - Y_{Zoo} - f_e)$ ("nutrients") = 0

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v		NH4	NO3	HPO4	HCO3	02	н	H2O	ALG	ZOO	POM	
		[mol]	[gDM]	[gDM]	[gDM]							
gro.ALG	.NH4	-		-	-	+	?	?	1			
gro.ALG	.NO3											
resp.ALC	G	+		+	+	-	?	?	-1			
death.A	LG	0/+		0/+	0/+	+	?	?	-1		+	
gro.ZOO)	+		+	+	-	?	?	-1/Y.ZOO	1	fe/Y.ZOO	
resp.ZO	0	+		+	+	-	?	?		-1		
death.Z	00	0/+		0/+	0/+	+	?	?		-1	+	
α												
С	[mol]	0	0	0	1	0	0	0	0.030417	0.03	0.04025	
н	[mol]	4	0	1	1	0	1	2	0.07	0.07	0.07	
0	[mol]	0	3	4	3	2	0	1	0.03125	0.03125	0.025	
Ν	[mol]	1	1	0	0	0	0	0	0.004286	0.004286	0.002857	
Р	[mol]	0	0	1	0	0	0	0	0.000161	0.000323	0.000226	
charge	[mol]	1	-1	-2	-1	0	1	0	0	0	0	

 $\sum_{j} \nu_{ij} \alpha_{kj} = 0$

For growth of zooplankton:

8 unknown stoichiometric coefficients v,

6 mass balance equations (C,H,O,N,P,charge)

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+ 2 additional constraints \rightarrow can be solved

Conclusion?

Concept is straightforward but quite some manual work!

If composition changes: redo the calculation!

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3 ways to derive stoichiometric coefficients:

- Chemical substance notation
- Parameterized elemental mass fractions
- General solution of stoichiometric equations

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

$$\rm C_{106}H_{263}O_{110}N_{16}P$$

use parameterized mass fractions:

$$\mathbf{C}_{\alpha_{\mathrm{C},j}/12}\mathbf{H}_{\alpha_{\mathrm{H},j}}\mathbf{O}_{\alpha_{\mathrm{O},j}/16}\mathbf{N}_{\alpha_{\mathrm{N},j}/14}\mathbf{P}_{\alpha_{\mathrm{P},j}/31}$$

with:

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

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$a \operatorname{HCO}_{3}^{-} + b \operatorname{NO}_{3}^{-} + c \operatorname{HPO}_{4}^{2-} + d \operatorname{H}^{+} + e \operatorname{H}_{2}\operatorname{O}$ $\rightarrow \operatorname{C}_{\alpha_{\mathrm{C,ALG}}/12} \operatorname{H}_{\alpha_{\mathrm{H,ALG}}} \operatorname{O}_{\alpha_{\mathrm{O,ALG}}/16} \operatorname{N}_{\alpha_{\mathrm{N,ALG}}/14} \operatorname{P}_{\alpha_{\mathrm{P,ALG}}/31} + f \operatorname{O}_{2}$

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Solving the mass balance equations for C, H, O, N and P and charge leads to the unique solution (6 eq. for 6 unknowns):

$$\begin{split} \frac{\alpha_{\mathrm{C,ALG}}}{12} \mathrm{HCO}_{3}^{-} + \frac{\alpha_{\mathrm{N,ALG}}}{14} \mathrm{NO}_{3}^{-} + \frac{\alpha_{\mathrm{P,ALG}}}{31} \mathrm{HPO}_{4}^{2-} \\ + \left(\frac{\alpha_{\mathrm{C,ALG}}}{12} + \frac{\alpha_{\mathrm{N,ALG}}}{14} + \frac{2 \alpha_{\mathrm{P,ALG}}}{31} \right) \mathrm{H}^{+} \\ + \left(\frac{\alpha_{\mathrm{H,ALG}}}{2} - \frac{\alpha_{\mathrm{C,ALG}}}{12} - \frac{\alpha_{\mathrm{N,ALG}}}{28} - \frac{3 \alpha_{\mathrm{P,ALG}}}{62} \right) \mathrm{H}_{2}\mathrm{O} \\ \rightarrow \mathrm{C}_{\alpha_{\mathrm{C,ALG}}/12} \mathrm{H}_{\alpha_{\mathrm{H,ALG}}} \mathrm{O}_{\alpha_{\mathrm{O,ALG}}/16} \mathrm{N}_{\alpha_{\mathrm{N,ALG}}/14} \mathrm{P}_{\alpha_{\mathrm{P,ALG}}/31} \end{split}$$

$$+\left(\frac{\alpha_{\mathrm{C,ALG}}}{12} + \frac{\alpha_{\mathrm{H,ALG}}}{4} - \frac{\alpha_{\mathrm{O,ALG}}}{32} + \frac{5\,\alpha_{\mathrm{N,ALG}}}{56} + \frac{5\,\alpha_{\mathrm{P,ALG}}}{124}\right)\,\mathrm{O}_2$$

Once we decided about the α parameters, we can calulate the v

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$\alpha_{\mathrm{C,ALG}}^{\mathrm{Redfield}}$	$=\frac{106\cdot 12}{3550}\;\frac{\rm gC}{\rm gDM}$	$pprox 0.36 \ \frac{\text{gC}}{\text{gDM}}$
$\alpha_{\mathrm{H,ALG}}^{\mathrm{Redfield}}$	$= \frac{263}{3550} \frac{\text{gH}}{\text{gDM}}$	$pprox 0.07 \ \frac{\text{gH}}{\text{gDM}}$
$\alpha_{\mathrm{O,ALG}}^{\mathrm{Redfield}}$	$=\frac{110\cdot 16}{3550}\;\frac{\text{gO}}{\text{gDM}}$	$pprox 0.50 \ rac{{ m gO}}{{ m gDM}}$
$\alpha_{ m N,ALG}^{ m Redfield}$	$=\frac{16\cdot 14}{3550}\;\frac{\text{gN}}{\text{gDM}}$	$pprox 0.06 \ \frac{\text{gN}}{\text{gDM}}$
$\alpha_{\mathrm{P,ALG}}^{\mathrm{Redfield}}$	$=\frac{1\cdot 31}{3550}\;\frac{\text{gP}}{\text{gDM}}$	$pprox 0.01 \ \frac{\text{gP}}{\text{gDM}}$

Conclusions?

• Even more tedious to solve the equations manually.

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- Changes in composition are now easy to handle, just change the numerical values of the parameters!
- However, when adding elements, all calculations have to be revised.
- → Try to find a general solution of stoichiometric equations



3 ways to derive stoichiometric coefficients:

- Chemical substance notation
- Parameterized elemental mass fractions
- General solution of stoichiometric equations

Extended Process Table Notation

Processes i		Sul	ostance	es j		Rates
	s_1	\mathbf{s}_2	S_3	•••	${\sf S}_{n_{ m s}}$	
p ₁	ν_{11}	ν_{12}	ν_{13}	•••	$\nu_{1n_{\rm s}}$	ρ_1
p_2	ν_{21}	ν_{22}	ν_{23}	• • •	$\nu_{2n_{\rm s}}$	$ ho_2$
:	÷	:	÷	·	:	:
$p_{n_{\mathrm{p}}}$	$\nu_{n_{\mathrm{p}}1}$	$\nu_{n_{\mathrm{p}}2}$	$\nu_{n_{\mathrm{p}}3}$	•••	$\nu_{n_{\rm p}n_{\rm s}}$	$ ho_{n_{\mathbf{p}}}$
Elements k						
e ₁	α_{11}	α_{12}	α_{13}	•••	$\alpha_{1n_{\mathbf{s}}}$	
e_2	α_{21}	α_{22}	α_{23}	•••	$\alpha_{2n_{\mathbf{s}}}$	
:	÷	÷	÷	·	÷	
$e_{n_{\mathbf{e}}}$	$\alpha_{n_{\rm e}1}$	$\alpha_{n_{\rm e}2}$	$\alpha_{n_{\mathbf{e}}3}$	•••	$\alpha_{n_{\rm e}n_{\rm s}}$	

Mass conservation for element *k* in process *i*:

 $n_{\rm e}$ constraints for each process from the "elemental" composition

$$\sum_{j} \nu_{ij} \alpha_{kj} = 0$$

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Mass conservation for element *k* in process *i*:

n matrix notation:
$$oldsymbol{
u}_i \cdot ig(oldsymbol{lpha}_{(i)}ig)^{\mathrm{T}} = oldsymbol{0}$$

Constraints:

С

$$\sum_{j=1}^{n_{\rm s}} \nu_{ij} \, \gamma_{(i),kj} = 0$$

in matrix notation: $\boldsymbol{\nu}_i \cdot \left(\boldsymbol{\gamma}_{(i)}\right)^{\mathrm{T}} = \boldsymbol{0}$

$$oldsymbol{
u}_i \cdot \left(egin{array}{c} oldsymbol{lpha}_{(i)} \ oldsymbol{\gamma}_{(i)} \end{array}
ight)^{ ext{T}} = oldsymbol{0}$$

→ Solving stoichiometric equations is a problem of linear algebra: Finding the "left null-space" of a matrix

$$\sum_{j=1}^{n_{\rm s}} \nu_{ij} \, \alpha_{kj} = 0$$

 $\alpha_{(i)}$: composition matrix with only the columns of substances involved in process *i*



→ Swiss Army Knife of Linear Algebra



What did you find out?

... from perplexity.ai March 2025

What is the "Swiss Army Knife of Linear Algebra"? Please explain it in simple words

people.inf.ethz
 [PDF] SVD -- the Swiss
 Army Knife of Linear...

(m) cmps-people.ok.ubc
 [PDF] Projection Methods:
 Swiss Army Knives for...

Peterbloem The Singular Value Decomposition |...



Answer Answer

The "Swiss Army Knife of Linear Algebra" is the Singular Value Decomposition (SVD) 1 3 4. This term is used to describe SVD because of its versatility and wide range of applications in mathematics, data science, and machine learning 3 4.

SVD is a powerful mathematical technique that decomposes any matrix into three simpler matrices ⁶. This decomposition allows us to analyze and manipulate complex data more easily, much like how a Swiss Army knife provides various tools for different tasks ⁴.

Here's why SVD is considered so versatile:

- 1. It can be used for dimensionality reduction, which is crucial in data analysis and machine learning 3.
- 2. It helps in solving various problems like semantic search, prediction, pattern extraction, clustering, and topic modeling 4.
- 3. SVD is fundamental to many important operations in linear algebra, including linear regression, principal component analysis (PCA), and matrix approximation 3 6.
- It's useful in a wide range of fields, from image processing to natural language processing 4 6.

In simple terms, SVD is like a multi-tool that can help solve many different types of mathematical and data-related problems, making it an essential technique for anyone working with large datasets or complex mathematical structures 4 6.

bit superfluous bla bla...

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... from perplexity.ai March 2025

What is the "Swiss Army Knife of Linear Algebra"? Please explain how it works in simple words

w en.wikipedia Singular value decomposition - Wikipedia	b builtin Singular Value Decomposition (SVD)	 gregorygundersen Singular Value Decomposition as Simply 	★ D \$ +4 sources							
龄 Answer										
The "Swiss Army Knife of Linear Algebra" is the Singular Value Decomposition (SVD). It's called this because of its versatility and wide range of applications in mathematics, data science, and machine learning 1 2.										
SVD works by decomposing any matrix into three simpler matrices:										
1. A left singular matrix (U)										
2. A diagonal matrix of singular values (Σ)										
3. A right singular matrix (V^T)										
In simple terms, SVD breaks down a complex matrix into three parts that are easier to work with $1 2$.										
Here's how SVD works in simple words:										
1. Rotation: The matrix V ^T rotates the original data.										
2. Scaling: The diagonal matrix Σ scales the rotated data.										
3. Another rotation: The matrix U performs a final rotation.										
This process can be thought of as transforming data through a series of simple steps: rotate,										

stretch or shrink, and rotate again 1.

The power of SVD lies in its ability to reveal important structures and patterns in the data. The singular values in the diagonal matrix Σ represent the importance of different features or components in the data. Larger singular values correspond to more significant patterns 1 2.

... from ChatGPT 4.0 March 2024



Anonymous

What is the "Swiss Army Knife of Linear Algebra"? Please explain it in simple words.



ChatGPT

The "Swiss Army Knife of Linear Algebra" often refers to the Singular Value Decomposition (SVD). Just like a Swiss Army knife, which is valued for its versatility and utility in various situations, SVD is highly versatile and useful in the field of linear algebra and beyond.

SVD is a method that breaks down a matrix into three simpler matrices. Imagine you have a complex puzzle (the original matrix); SVD allows you to separate it into three easier puzzles (the matrices U, Σ , and V*), where:

- U is a matrix containing what are called the left singular vectors,
- Σ (Sigma) is a diagonal matrix with singular values (these values can be thought of as the importance or weight of each corresponding singular vector),
- V* (the conjugate transpose of V) contains the right singular vectors.

This decomposition helps in understanding the structure and properties of the original matrix. It's like having a tool that can adapt to perform a wide range of tasks:

Data compression, Noise reduction, Solving linear equations, Principal component analysis...

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Full Answers (always to be treated with a grain of salt)

What is the "Swiss Army Knife of Linear Algebra"? Please explain it in simple words: <u>https://chat.openai.com/share/b2035ee9-382c-43d2-9591-9dab098d9de0</u>

Please explain step by step, how the singular value decomposition works. Explain it on three levels: first for a 5 year old, then for a college students and finally for experts with all mathematical details.

https://chat.openai.com/share/a69e6f50-b5cb-4ae6-98a1-ea7b8a8ebabc

I have the process table of a chemical reaction. How can I translate this to the corresponding ODE system? Please give me a small example. <u>https://chat.openai.com/share/f3466e31-772b-4aa4-83a9-3e8a6f46f80f</u> (note that it doesn't refer to the process table concept as we use it here)

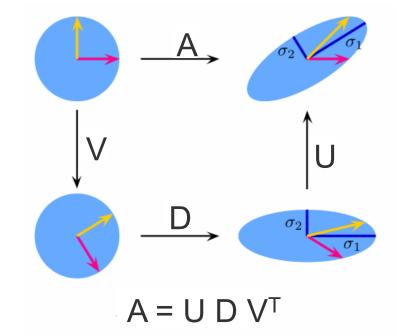


... from Wikipedia March 2024



Solving homogeneous linear equations

A set of homogeneous linear equations can be written as Ax = 0 for a matrix A and vector x. A typical situation is that A is known and a non-zero x is to be determined which satisfies the equation. Such an x belongs to A's <u>null space</u> and is sometimes called a (right) null vector of A. The vector x can be characterized as a right-singular vector corresponding to a singular value of A that is zero.



If **A** is a square matrix and has no vanishing singular value, the equation has no non-zero **x** as a solution. If there are several vanishing singular values, any linear combination of the corresponding right-singular vectors is a valid solution. Analogously to the definition of a (right) null vector, a non-zero **x** satisfying $\mathbf{x}*\mathbf{A} = \mathbf{0}$, with $\mathbf{x}*$ denoting the conjugate transpose of **x**, is called a left null vector of **A**.

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We can profit from implementations of the Singular Value Decomposition Theorem (Swiss army knife of linear algebra)

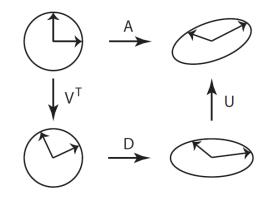


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each $n \times m$ matrix **A** with $n \ge m$ can be decomposed $\mathbf{A} = \mathbf{U} \cdot \mathbf{D} \cdot \mathbf{V}^{\mathrm{T}}$

- U is an $n \times m$ matrix with orthonormal columns: $\mathbf{U}^{\mathrm{T}} \cdot \mathbf{U} = \mathbf{I}$.
- **D** is an $m \times m$ diagonal matrix with non-negative elements in its diagonal. These values in the diagonal of **D** are called singular values of the matrix **A**.
- **V** is an $m \times m$ matrix with orthonormal columns: $\mathbf{V}^{\mathrm{T}} \cdot \mathbf{V} = \mathbf{I}$.
- → The rows of U^T corresponding to elements of D that are zero build a basis of the left null space of A. This solves our linear algebra problem.





Recipe for deriving the stoichiometry:

At the model level:

- 1) Choose the elements to be considered in the model.
- 2) Choose the substances to be considered in the model.
- 3) Add substances needed for elemental mass balances (e.g. H_2O , H^+).
- 4) Choose elemental mass fractions and construct the composition matrix.

At the process level (for each process):

- 1) Choose the substances involved in the process and known constraints.
- 2) Determine the dimension of the left null space of the joint composition and constraint matrix.
- 3) 1: make the stoichiometry unique by normalizing one of the coefficients.
 0: check whether all relevant substances were included. → Step 1)
 >1: check for too many substances or missing constraints. → Step 1) 36

The R package "stoichcale" provides us with a function cale.stoich.coef that accepts for each process

- a composition matrix alpha,
- a vector of substances to be considered,
- a selection of a normalized coefficient and its value,
- if required a list with coefficients of additional constraints,

and returns a vector of stoichiometric coefficients.

nu.gro.ALG < calc.stoich.coef(alpha = alpha.1,
 name = "growth.ALG",
 subst = c("HPO4","ALG"),
 subst.norm = "ALG",
 nu.norm = 1)</pre>

```
nu.gro.ZOO <-
   calc.stoich.coef(alpha
                                 = alpha.2,
                                 = "gro.Z00",
                     name
                                 = c("NH4","HPO4","HCO3","O2","H",
                     subst
                                     "H2O", "ALG", "ZOO", "POM"),
                     subst.norm
                                = "ZOO",
                     nu.norm
                                 = 1.
                     constraints = list(c("ZOO" = 1,
                                           "ALG" = param Y.ZOO),
                                         c("POM" = 1,
                                           "ALG" = param$f.e)))
```

As a first step, the null space is analyzed and an error message is issued if it is empty or of a higher dimension than one.

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Simplified approach for estimating the need for constraints

- Count the number of unknown stoichiometric coefficients (excluding the one that is normalized)
- 2) Count the number of mass balance constraints (number of elements considered for the composition; typically 5 in our examples, but see the exercises today) and add one for the charge balance constraint.
- 3) The difference of 1) minus 2) gives the number of required constraints, if there are no linear dependences in compositions or constraints.

The stoichcalc function calc.stoich.coeff considers these linear dependences and provides the correct answer unless there are numerical difficulties.

V		NH4	NO3	HPO4	HCO3	02	н	H2O	ALG	ZOO	РОМ	
		[mol]	[gDM]	[gDM]	[gDM]							
gro.ALG	i.NH4	-		-	-	+	?	?	1			6 unknowns
gro.ALG	i.NO3		-	-	-	+	?	?	1			6 unknowns
resp.ALC	G	+		+	+	-	?	?	-1			6 unknowns
death.A	LG	0/+		0/+	0/+	+	?	?	-1		+	7 unknowns
gro.ZOO)	+		+	+	-	?	?	-	1	+	8 unknowns
resp.ZO	0	+		+	+	-	?	?		-1		6 unknowns
death.Z	00	0/+		0/+	0/+	+	?	?		-1	+	7 unknowns
α												
С	[mol]	0	0	0	1	0	0	0	0.030417	0.03	0.04025	
н	[mol]	4	0	1	1	0	1	2	0.07	0.07	0.07	
0	[mol]	0	3	4	3	2	0	1	0.03125	0.03125	0.025	
Ν	[mol]	1	1	0	0	0	0	0	0.004286	0.004286	0.002857	
Р	[mol]	0	0	1	0	0	0	0	0.000161	0.000323	0.000226	
charge	[mol]	1	-1	-2	-1	0	1	0	0	0	0	

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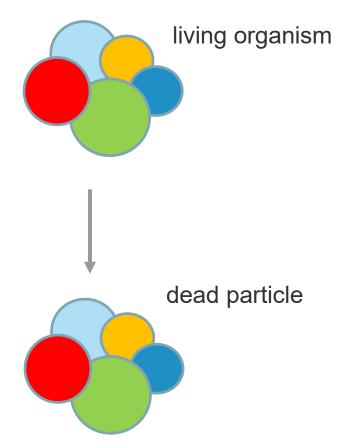
$$\sum_{j} \nu_{ij} \alpha_{kj} = 0$$





Death would have a trivial stoichiometry, if the dead organic matter has the same composition than the dying organisms. Then we would just turn one unit of living organisms into one unit of dead organic matter.

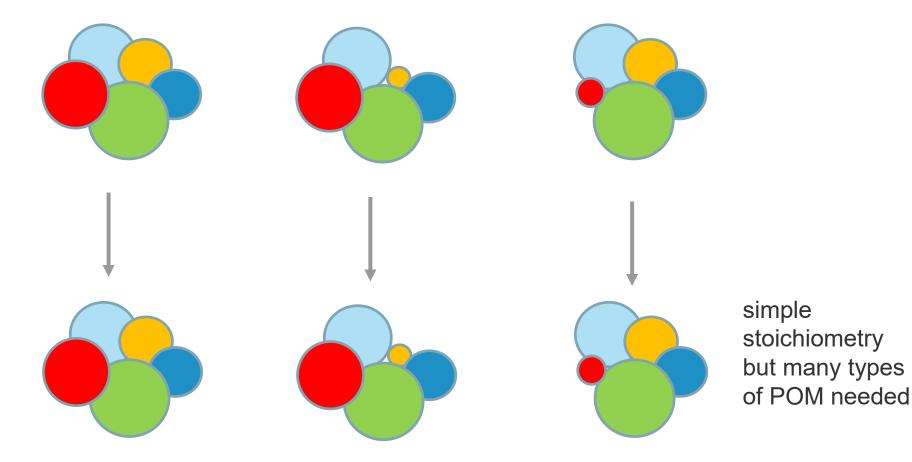
If we have many groups of organisms with different compositions, we would need a large number of types of dead organic matter.



Death



Living organisms with different composition



Dead particulate organic matter



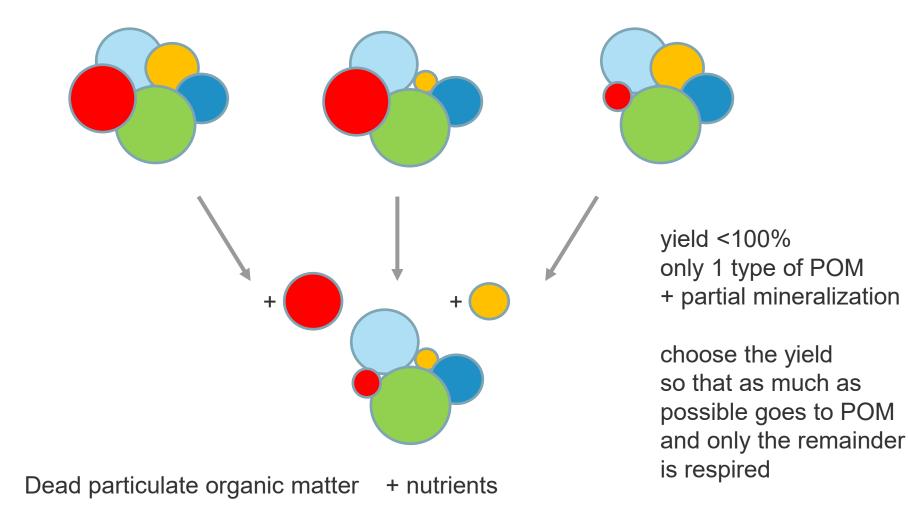
Alternatively, we can formulate the model with one type of dead organic particles and mineralize part of the dying organism to keep the mass balances. This can be accepted as dead organic particles will be mineralized anyways.

Technically, we introduce a "yield" for death and adjust it so that neither nutrients nor oxygen are required for dying.

Death



Living organisms with different composition



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V		NH4	NO3	HPO4	HCO3	02	н	H2O	ALG	ZOO	POM
		[mol]	[mol]	[mol]	[mol]	[mol]	[mol]	[mol]	[gDM]	[gDM]	[gDM]
gro.ALG.NH4		-0.00429	0	-0.00016	-0.030417	0.02928	-0.0265	0.00209	1	0	0
gro.ALG.NO3		0	-0.00429	-0.00016	-0.030417	0.03785	-0.0350	-0.00220	1	0	0
resp.ALC	3	0.004286	0	0.000161	0.030417	-0.02928	0.0265	-0.00209	-1	0	0
death.Al	LG	0.002245	0	0	0.001667	0.00171	-0.0006	0.00497	-1	0	0.714
gro.ZOO)	0.011429	0	3.23E-05	0.041583	-0.03055	0.0302	0.01123	-5	1	2
resp.ZO	0	0.004286	0	0.000323	0.03	-0.02906	0.0264	-0.00191	0	-1	0
death.Z0	00	0.001429	0	9.68E-05	-0.01025	0.01433	-0.0115	0.00796	0	-1	1
α											
С	[mol]	0	0	0	1	0	0	0	0.030417	0.03	0.04025
н	[mol]	4	0	1	1	0	1	2	0.07	0.07	0.07
0	[mol]	0	3	4	3	2	0	1	0.03125	0.03125	0.025
Ν	[mol]	1	1	0	0	0	0	0	0.004286	0.004286	0.002857
Ρ	[mol]	0	0	1	0	0	0	0	0.000161	0.000323	0.000226
charge	[mol]	1	-1	-2	-1	0	1	0	0	0	0
example conservation of											
C - deat	h.ZOO:	0	0	0	-0.01025	0	0	0	0	-0.03	0.04025

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> sum 0

$$\sum_{j} \nu_{ij} \alpha_{kj} = 0$$

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- 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 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