A thermodynamic theory of microbial growth and its perspectives for modelling environmental biotechnology processes

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# Microbial successions and energy gradients



http://www.hhmi.org/biointeractive/poster-winogradsky-column-microbial-evolution-bottle

http://www.esf.edu/efb/schulz/Limnology/redox.html



686

649

300

190

8.3

# Existence of a functional convergence phenomenon of microbial communities in environmental bioprocesses



 $C_{5}H_{7}O_{2}N + 3H_{2}O$   $\rightarrow$   $2,5 CH_{4} + 2,5 CO_{2}$   $+ NH_{3}$ 

« Open diversity systems »



 $C_{5}H_{7}O_{2}N + 7 O_{2}$   $\rightarrow$   $2 H_{2}O + 5 CO_{2} + NO_{3}^{-} + H^{+}$   $+ H_{2}O$ 



How could all these complex ecological interactions lead to such a reproducible functional convergence?

## What do models tell us about this convergence?

#### **Anaerobic Digestion Model N°1**

#### Activated Sludge Model N°1



### => Current models are not appropriate to handle this question

### Observed metabolic successions and thermodynamics



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### Thermodynamic balances of microbial growth



anabolism

 $\Delta G_{met} = \Delta G_{an} + \lambda$ .  $\Delta_r G_{cat} = \Delta G_{dis} = f$  (substrate)

Introducing the exergy concept

 $E_{dis} = \lambda \cdot E_{cat} - E_{M}$ 

### From thermodynamic balances to kinetics?

To cite this Article KLEEREBEZEM, ROBBERT and VAN LOOSDRECHT, MARK C. M.(2010) 'A Generalized Method for Thermodynamic State Analysis of Environmental Systems', Critical Reviews in Environmental Science and Technology, 40: 1, 1-54

### A microbial "transition state" theory



### **Resource allocation among microbes: a statistical question**



- Define the spatial distribution of molecules in the medium
- Introduce V<sub>harv</sub> « the harvesting volume »
- Compute the distribution of molecules in the various harvesting volumes
- $\Rightarrow N^{\ddagger}$  can be deduced from this calculation

$$\frac{N^{\ddagger}}{N} = \exp\left(-\frac{E_M + E_{dis}}{V_{harv} \cdot [S] \cdot E_{cat}}\right)$$

### A microbial growth equation and its consequence on isotopic fractionation



• Any further predictions?

#### A microbial growth equation and its consequence on isotopic fractionation



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# Challenging these predictions with real datasets...

Challenging thermodynamic growth model's predictions with actual isotopic data

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$$\alpha_{S/P} = \alpha_0 \cdot \exp\left(-\frac{E_M + E_{dis}}{V_{harv} \cdot [S_{lim}] \cdot E_{cat}^2} \Delta E_{cat}^{h-l}\right)$$

Hydrogenotrophic methanogenesis

 $4H_2 + CO_2 \rightarrow CH_4 + 2H_2O$ 



 $\Delta E_{cat}^{h-l} = \Delta E^{h-l}(CH_4) - \Delta E^{h-l}(CO_2) < 0$ 

#### Challenging thermodynamic growth model's predictions with actual isotopic data



### How are communities shaped by thermodynamic gradients?



Hadrien  $\mu = \mu_{max} \cdot \exp\left(-\frac{E_M + E_{dis}}{V_{harv} \cdot [S] \cdot E_{cat}}\right)$ Delattre's PhD Project Flux: microbial growth rate Force: catabolic exergy density Application to activated sludge Heterotrophs Nitrite oxidizers Ammonia oxidizers, ·w· CH<sub>3</sub>COO<sup>-</sup>  $NH_4^+$  $NO_2^ NO_3^-$ 

# Coupled modelling of energy balances, stoichiometry and microbial dynamics





Hadrien Delattre's PhD Project

 $\begin{array}{l} -0.525C_{2}H_{3}O_{2}^{-}-0.2NH_{4}^{+}-0.325H^{+}+0.45H_{2}O+0.05CO_{2}+1C_{1}H_{1,8}O_{0,5}N_{0,2}\\ +\lambda(-1C_{2}H_{3}O_{2}^{-}-2O_{2}-1H^{+}+2CO_{2}+H_{2}O)\end{array}$ 

 $-0.2NH_{4}^{+} - 0.6H_{2}O - 1CO_{2} + 1.05O_{2} + 0.2H^{+} + 1C_{1}H_{1,8}O_{0,5}N_{0,2} + \lambda(-4.5O_{2} - 2NH_{4}^{+} - 2H^{+} + 2NO_{2}^{-})$ 

 $\begin{array}{r} -0.2\text{NO}_2^- - 0.8\text{H}_2\text{O} - 1\text{CO}_2 - 0.2\text{H}^+ + 1.35\text{O}_2 + 1\text{C}_1\text{H}_{1,8}\text{O}_{0,5}\text{N}_{0,2} \\ + \lambda(-1\text{NO}_2^- - 0.5\text{O}_2 + 1\text{NO}_3^-) \end{array}$ 

# Coupled modelling of energy balances, stoichiometry and microbial dynamics





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Multisubstrate rate law expression for all groups:

$$\mu = \mu_m \prod_i e^{-\frac{\nu_{i(\lambda)}}{V_h \cdot S_i}}$$

 $\lambda$  is calculated from thermodynamic balances of microbial growth

### Simulating activated sludge batchs fed with wastewater

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**Simulation conditions**: constant supply of air, default ASM chemical species and microbial composition used for initialization, same default *E.coli* growth parameters for all groups



=> Proper metabolic succession obtained without parameter fitting

# Simulating « chemostats »



Monod 1950 – Novick & Szilard 1950

# Varying the loading rate in virtual activated sludge chemostats

#### Low loading rate

**High loading rate** 



#### => Engineering rules as emerging properties of thermodynamic models

# Take home messages...

- A consistent framework for coupled modelling of energy balance, stoichiometry and microbial dynamics
- Revisiting the importance of energy drivers for shaping microbial community structures
- Reproducing microbial successions without parameter fitting
- Towards more predictive models?



# Many thanks to...

All the BIOMIC team members in Irstea-Antony http://www.irstea.fr/la-recherche/themes-de-recherche/ted/biomic



Elie Desmond, postdoc Microbial thermodynamics

Agence Nationale de la Recherche

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**BIORARE** project

**ANR-10-BTBR-02** 







Christian Duquennoi, multiphysic models Ahlem Filali, Activated sludge models



Hadrien Delattre, PhD, Thermodynamic simulation of microbial ecosystems

# Thanks for you attention







# Choice of a generic biomass formula

- Hoover and Porges' biomass: C<sub>5</sub>H<sub>7</sub>O<sub>2</sub>N
  - Widely used in wastewater bioprocesses modelling
  - Gibbs energy of formation is unknown
  - Composition appears to be unrealistic
- Heijnen's biomass: C<sub>1</sub>H<sub>1.8</sub>O<sub>0.5</sub>N<sub>0.2</sub>
  - Infered from growth data of multiple microbes on multiple substrates
  - Gibbs energy of formation is known
  - Composition appears to be unrealistic
- Battley's biomass: C<sub>1</sub>H<sub>1.613</sub>O<sub>0.557</sub>N<sub>0.158</sub>
  - Experimentally measured from Saccharomyces cerevisiae cultures
  - Gibbs energy of formation directly measured by calorimetry
  - Composition seems to be more realistic



- Hoover S.R. and Porges N. (1952). Assimilation of dairy wastes by activated sludge. II. The equations of synthesis and rate of oxygen utilization. Sew. Indus. Wastes J., 24, 306-312.
- Heijnen J. and Dijken J. (1991). In Search of a Thermodynamic Description of Biomass Yields for the Chemotrophic Growth of Microorganisms. biotechnology and bioengineering, 39(8), 833-858.
- Battley E. (1998). The development of direct and indirect methods for the study of the thermodynamics of microbial growth. Thermochimica Acta, 309, 17-37.

### Estimation of the harvesting volume $(V_h)$

$$\mu = \mu_m e^{\frac{\nu}{V_h S}}$$
$$V_h = \frac{\nu}{S(\ln \mu - \ln \mu_m)}$$

 $V_h$  estimated for E Coli growing on various substrates ;

- Glycerol : 0.42 m<sup>3</sup>.C-mol<sup>-1</sup> (sphere of radius 14.3 µm around each cell)
- Glucose : 0.74 m<sup>3</sup>.C-mol<sup>-1</sup> (sphere of radius 19.2 μm around each cell)
- Sorbitol : 0.79 m<sup>3</sup>.C-mol<sup>-1</sup> (sphere of radius 17.7 μm around each cell)



Data is from Taheri-Araghi S. et al. (2015). Cell-size control and homeostasis in bacteria. Current Biology, 25(3), 385-391.

### Lambda factor computation

 $\overline{S}$ : chemical species concentrations vector (Cx1)  $\overline{v_{cat}}, \overline{v_{an}}$ : raw stoichiometric coefficients vectors (1xC)  $\Delta G_{cat} = \Delta G^{0}{}_{cat} - RT \overline{v_{cat}} * \ln \overline{S}$  $\Delta G_{an} = \Delta G^{0}{}_{an} - RT \overline{v_{an}} * \ln \overline{S}$ 

 $\Delta G_{dis}$ : energie to dissipate(constant depending on the carbon source)

$$\lambda = \frac{\Delta G_{an} + \Delta G_{dis}}{-\Delta G_{cat}}$$



### **Dissipated energy calculation**



**Figure 6.** Minimum Gibbs energy dissipation for biomass production ( $Y_{\rm G}^{\rm max}$  kJ/cmol X) as a function of the degree of reduction (*NoC*<sub>Cs</sub>) and the carbon chain length of the carbon source ( $\gamma_{\rm Cs}$ ) according to Equation 19.

Dissipated energy is a constant whose value depends on the anabolic carbon source, according to Heijnen and Kleerebezem



Heijnen J. and Kleerebezem R. (1999). Bioenergetics of microbial growth. Encyclopedia of Bioprocess Technology.