

# Coupling microcosm experiments to modeling in order to understand ecological impact of stressors

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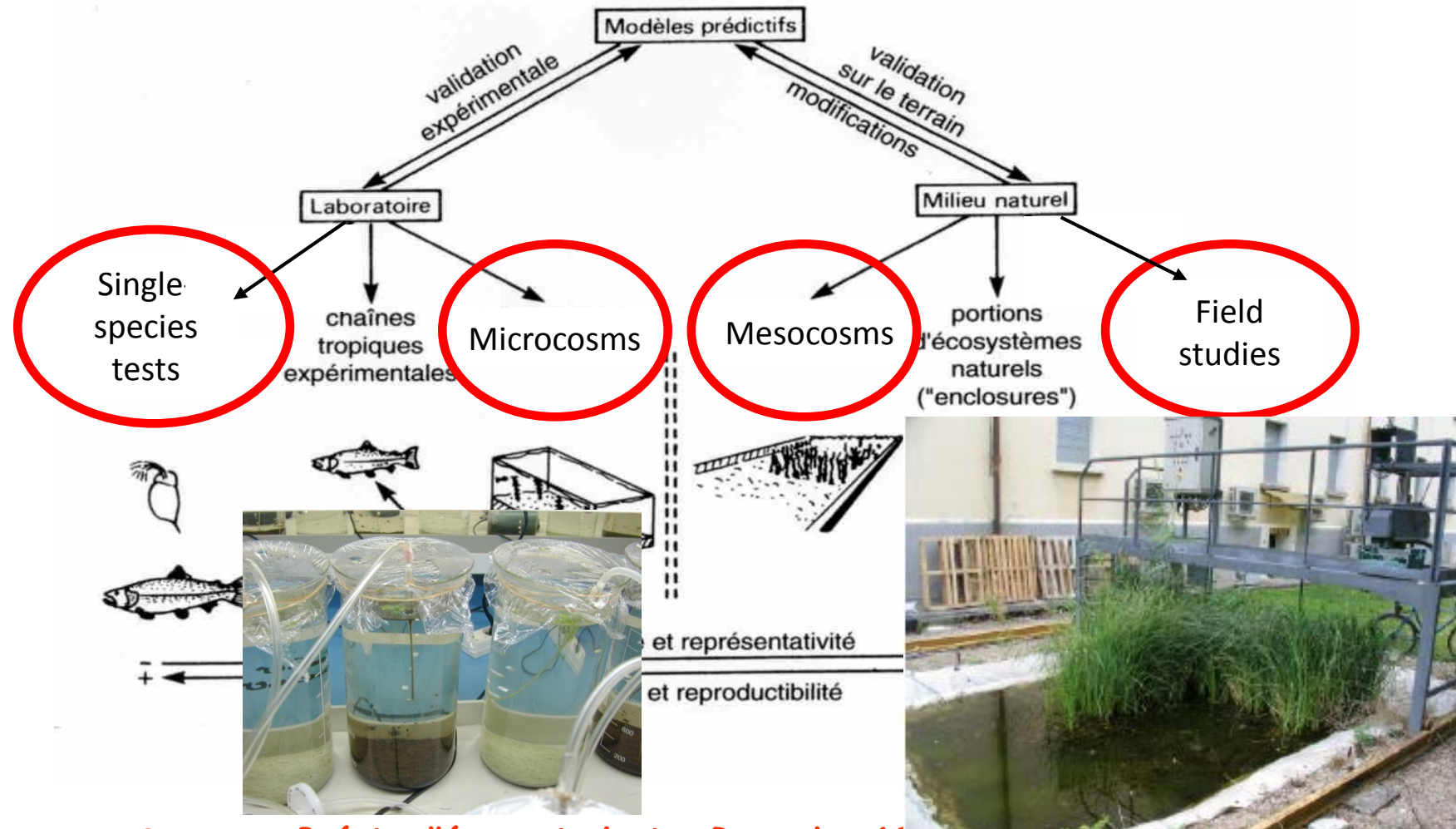
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Research into Radioecology*, Savannah River Ecology  
Laboratory, Aiken, SC , 2-5 October 2016



# *Outline*

- Ecotoxicological risk assessment using laboratory microcosms
- The LEHNA's microcosm (Clément and coll.)
- Why modeling ?
- How modeling ?
- Some results: modeling of the 3-species microcosm under toxic pressure
- Discussion
- Future work and perspectives

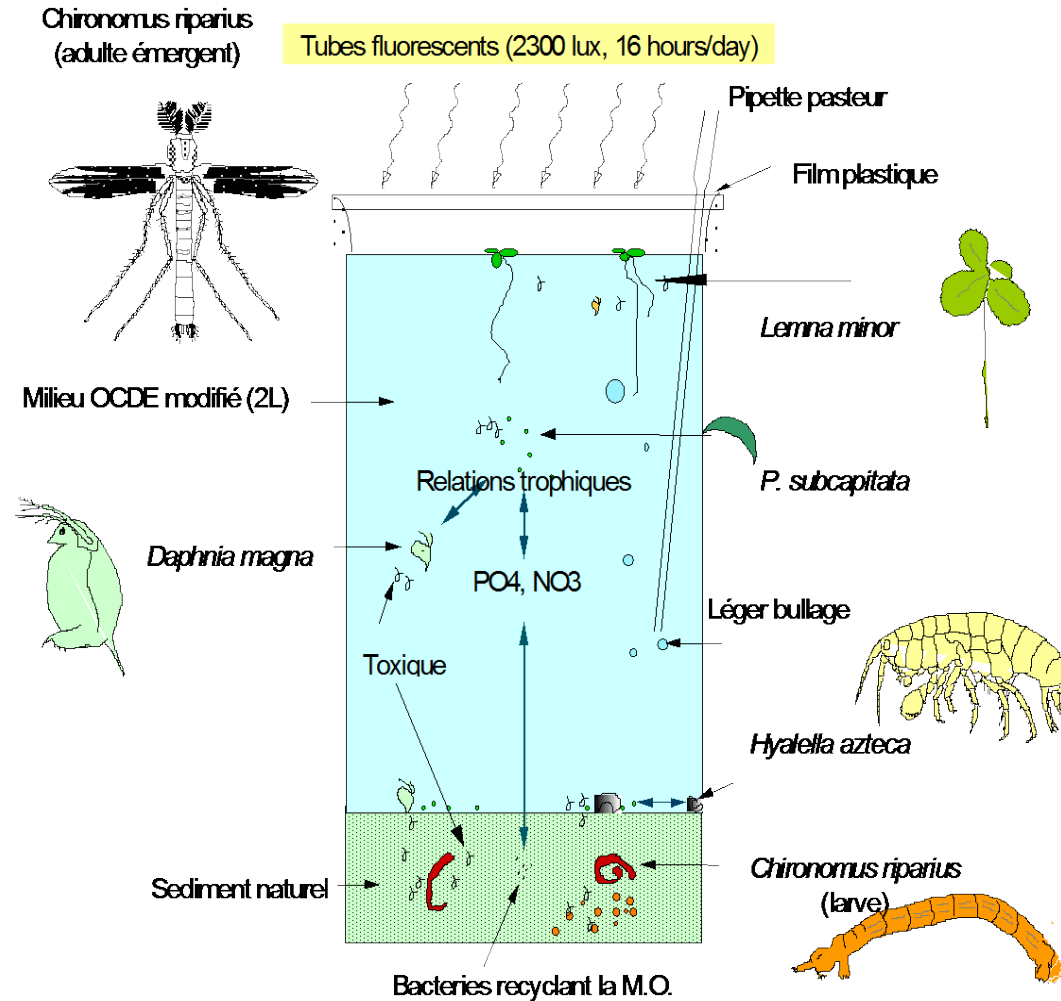
# Ecotoxicological risk assessment using laboratory microcosms



Source : Précis d'écotoxicologie, Ramade, 1992

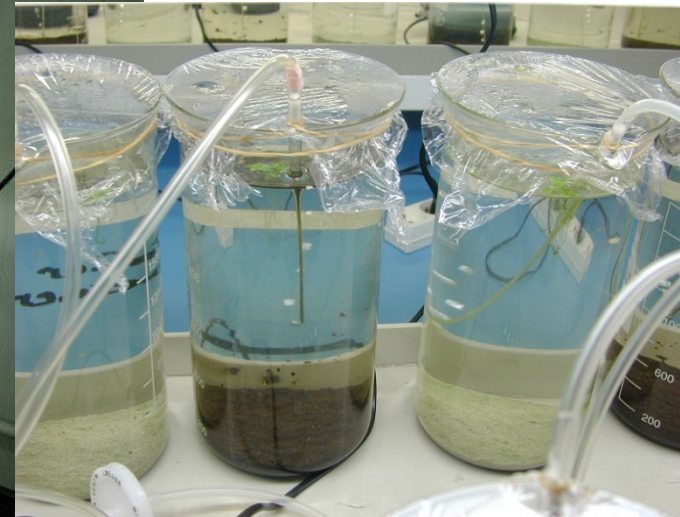
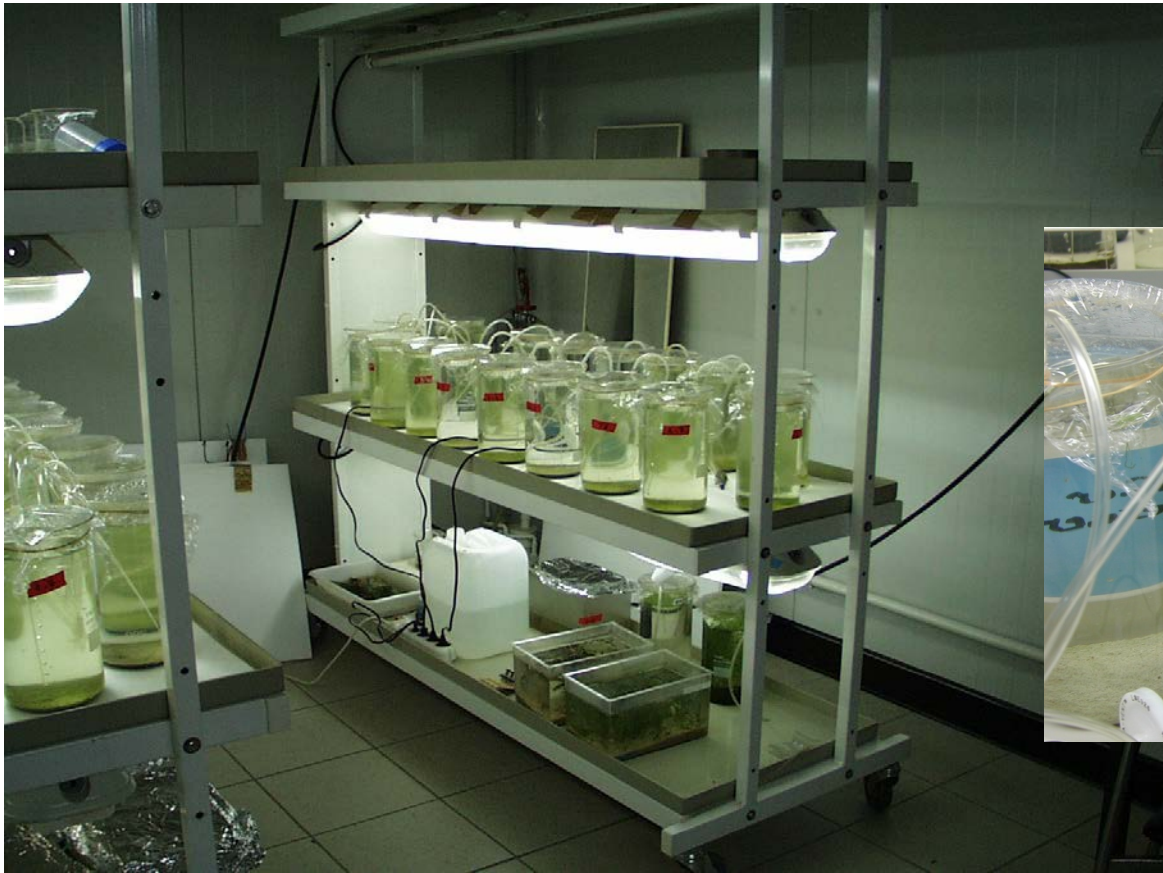
# The LEHNA microcosms (Clément and coll.)

## Volume: 2 L



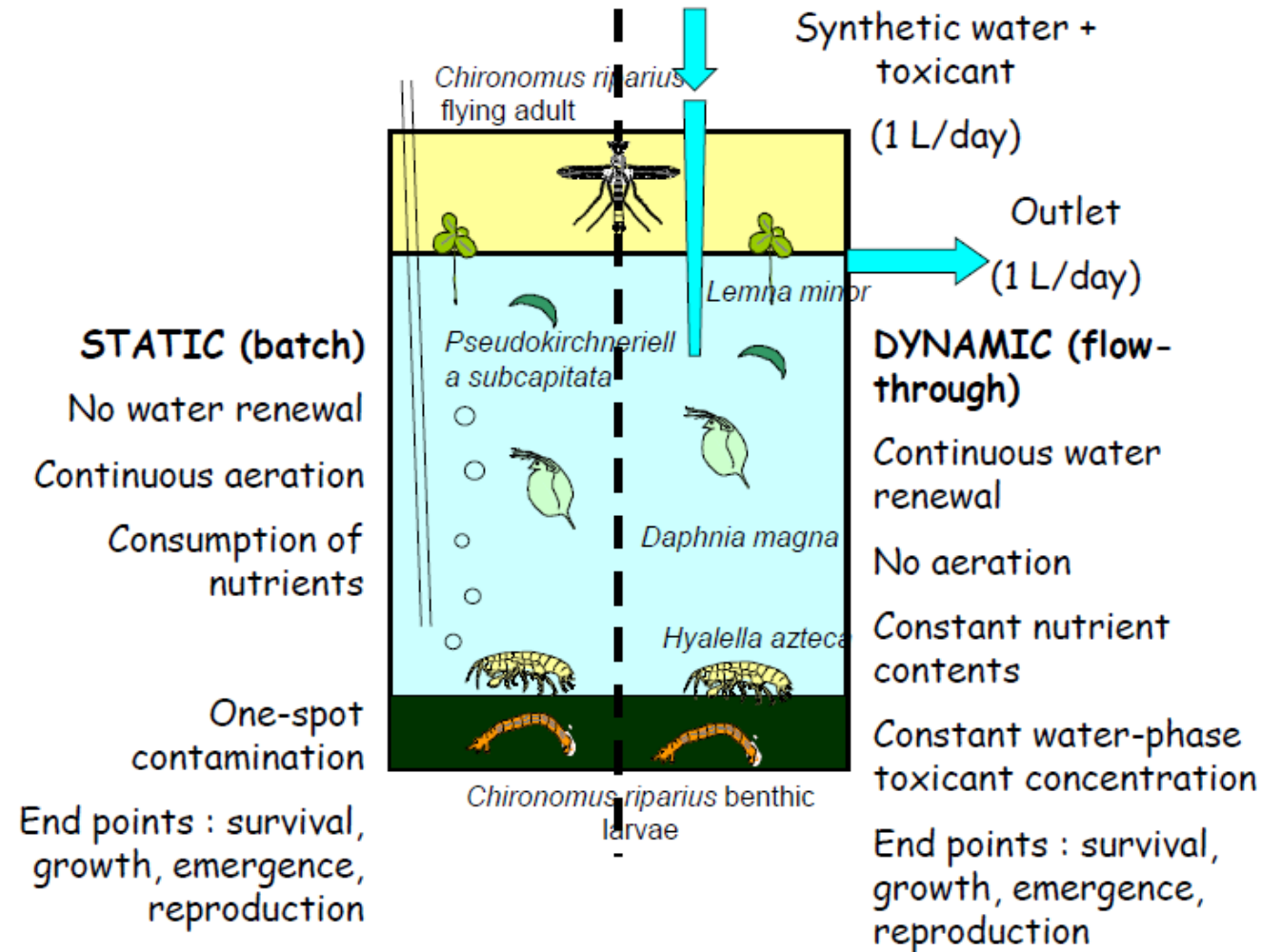
# *The LEHNA microcosms (Clément and coll.)*

**Volume: 2 L**



# The LEHNA microcosms (Clément and coll.)

## Volume : 2 L, static or dynamic



## **Applications**

### **Study of the ecotoxicity of PAH (mixture Phe/Flu/BkFlu; Pyr) spiked sediments**

*CLEMENT B. (2012). Bioavailability of Polycyclic Aromatic Hydrocarbons Studied Through Single-Species Ecotoxicity Tests and Laboratory Microcosm Assays, in Organic Pollutants Ten Years After the Stockholm Convention - Environmental and Analytical Update, Edited by: Tomasz Puzyn and Aleksandra Mostrag-Szlichtyng, ISBN 978-953-307-917-2, Publisher: InTech*

### **Study of the ecotoxicity of percolates or leachates from various wastes**

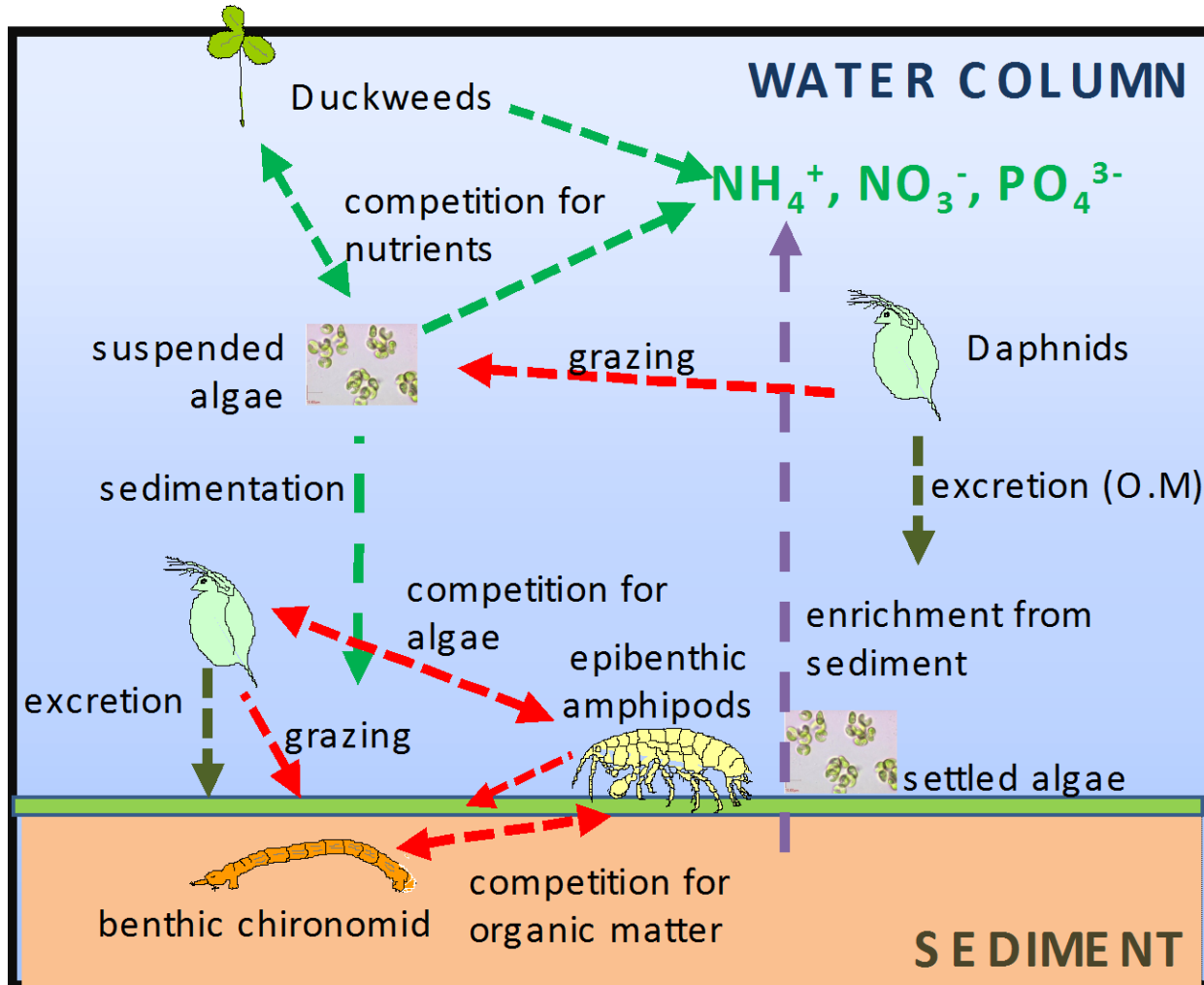
*TRIFFAULT-BOUCHET G., CLEMENT B., BLAKE G. (2005). Ecotoxicological assessment of pollutant flux released from bottom ash reused in road construction, Aquatic Ecosystem Health Management 8 : 405-414.*

### **Risk assessment of various storage or valorization scenarios of dredged sediments (from canals or sea harbours) or road sediments.**

*CLEMENT B., GUILLEN B., XU J., PERRODIN Y. (2014). Ecotoxicological risk assessment of a quarry filling with seaport sediments using laboratory freshwater aquatic microcosms, J Soils Sediments, Vol. 14, Issue 1, 183-195.*

# Why modeling ?

## Ecological complexity

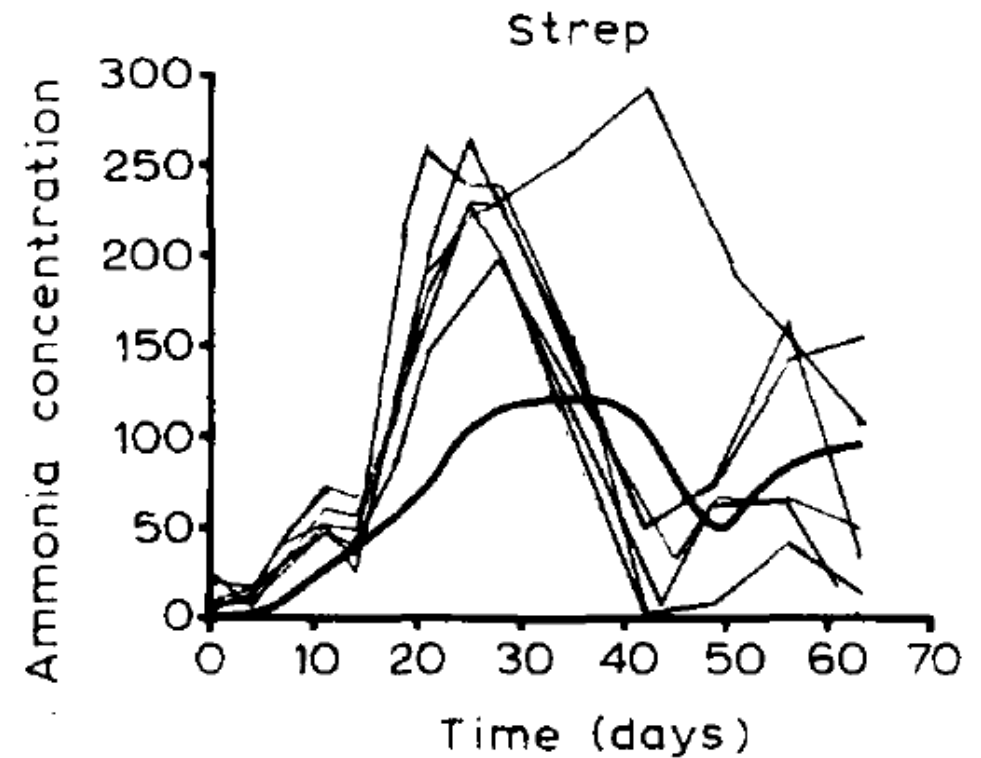
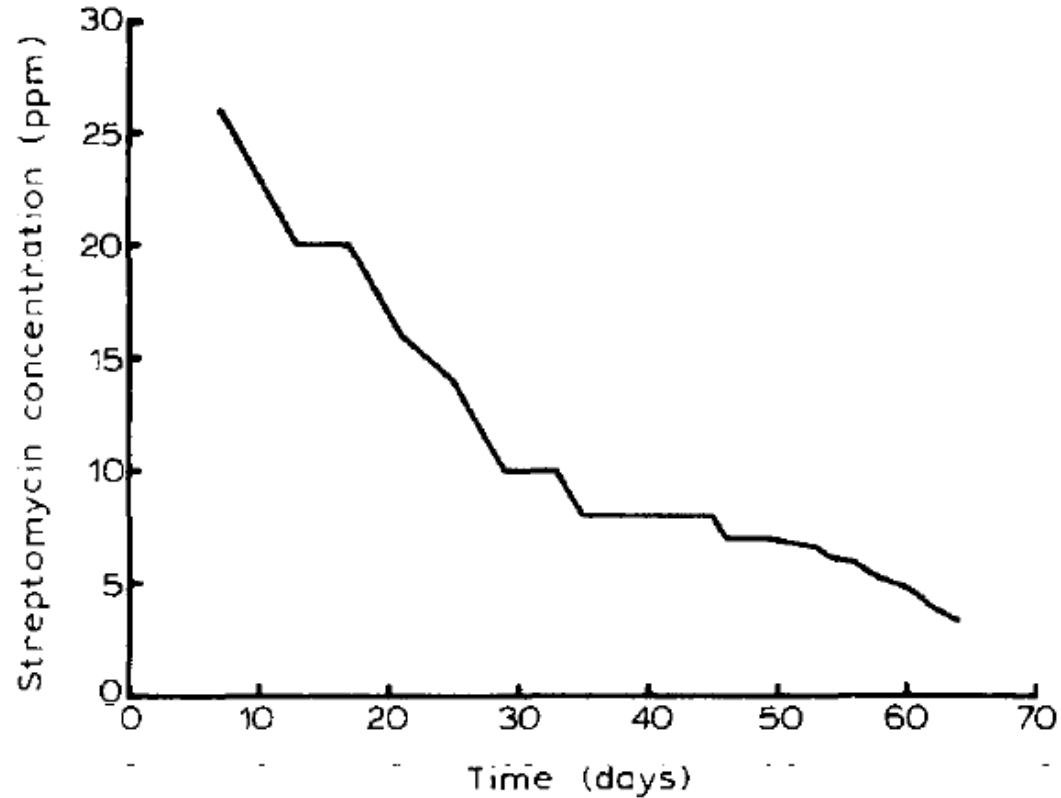




# Why modeling ?

## Time-varying processes

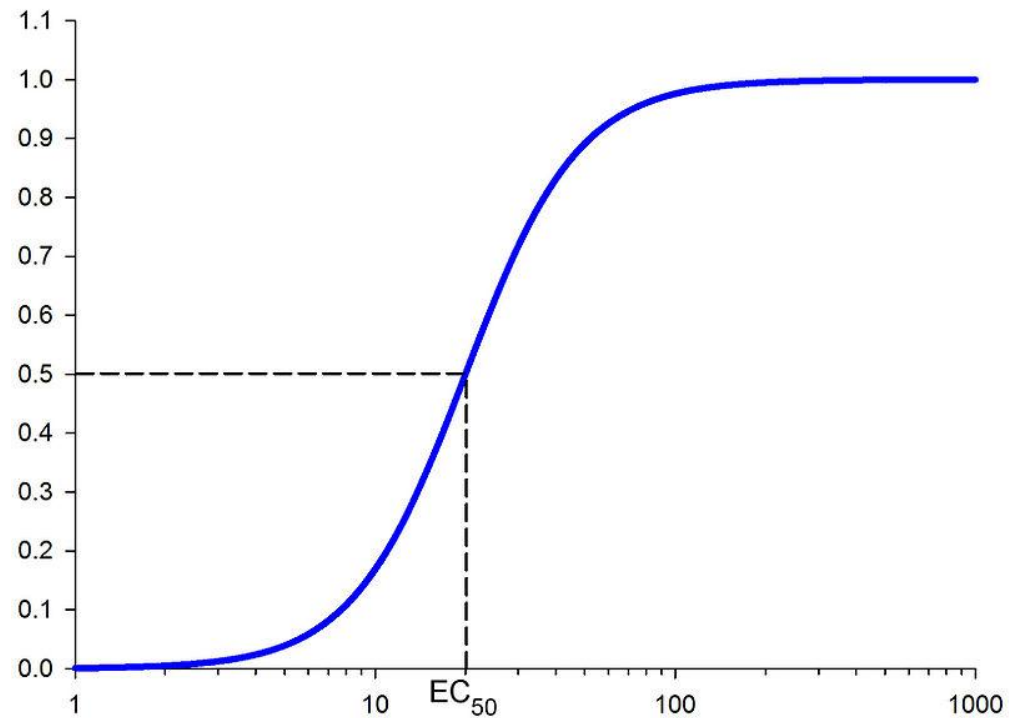
Swartzmann *et al.*, 1989



# *Why modeling ?*

## **Interpretation of effects**

Single-species test: direct link between effect and concentration

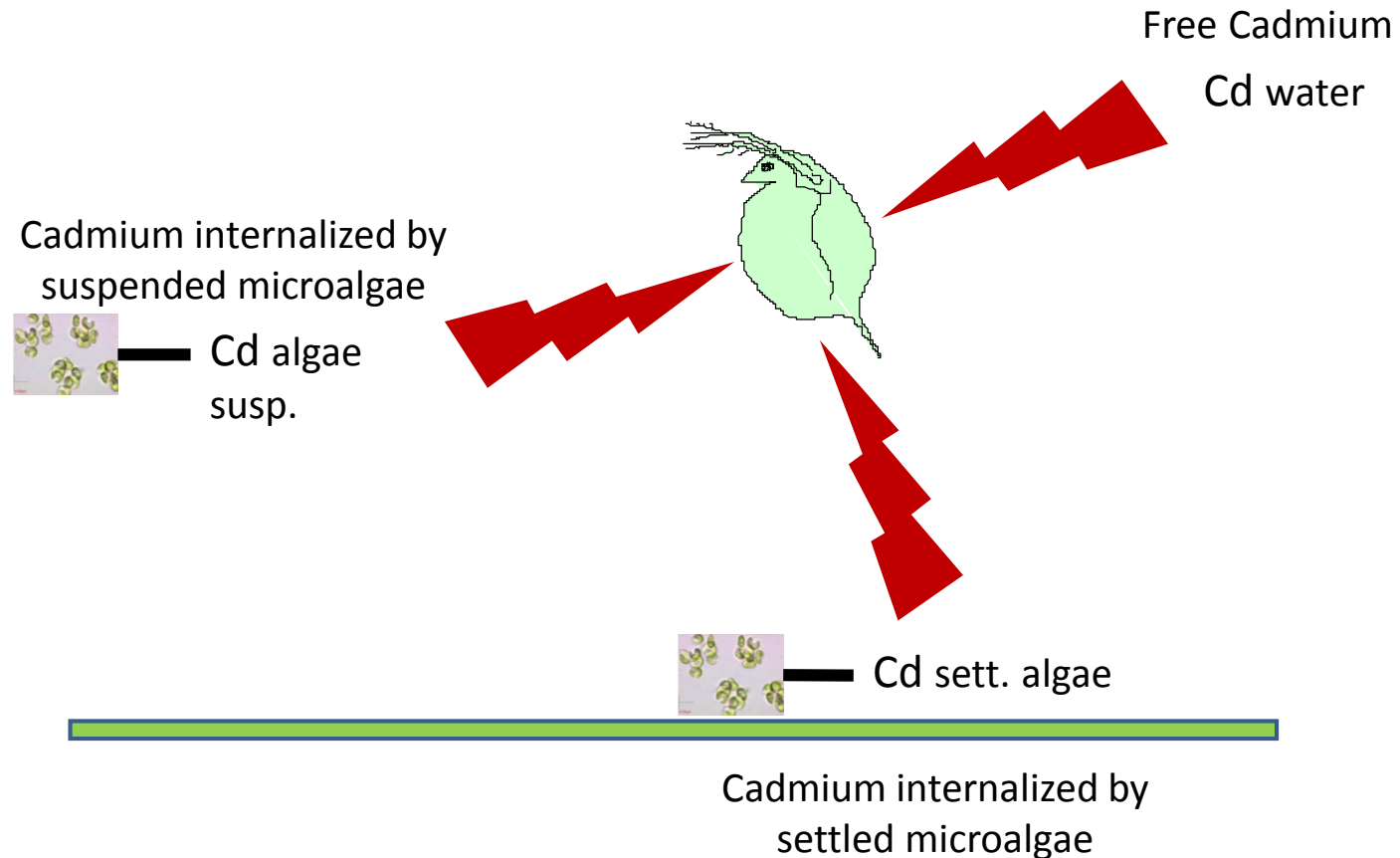


[https://commons.wikimedia.org/wiki/File:Concentration-response\\_curve.jpg](https://commons.wikimedia.org/wiki/File:Concentration-response_curve.jpg)

# Why modeling ?

## Interpretation of effects

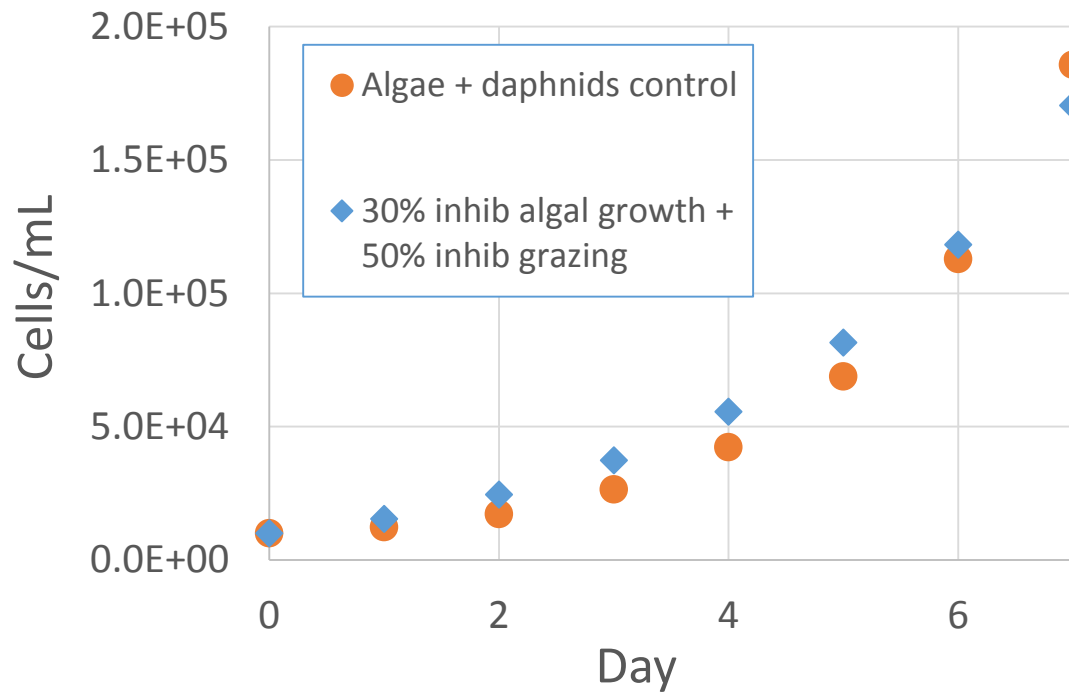
Microcosm assays: possible multiple exposure of one given species



# Why modeling ?

## Interpretation of effects

Microcosm assays: similar observations can be the results of different combinations of effects



Algae + daphnid controls : no effect on algal growth and daphnid grazing, the algal density curve is the result of normal algal growth and grazing

30% inhib algal growth + 50% inhib grazing : the algal density is the result of an effect on both processes

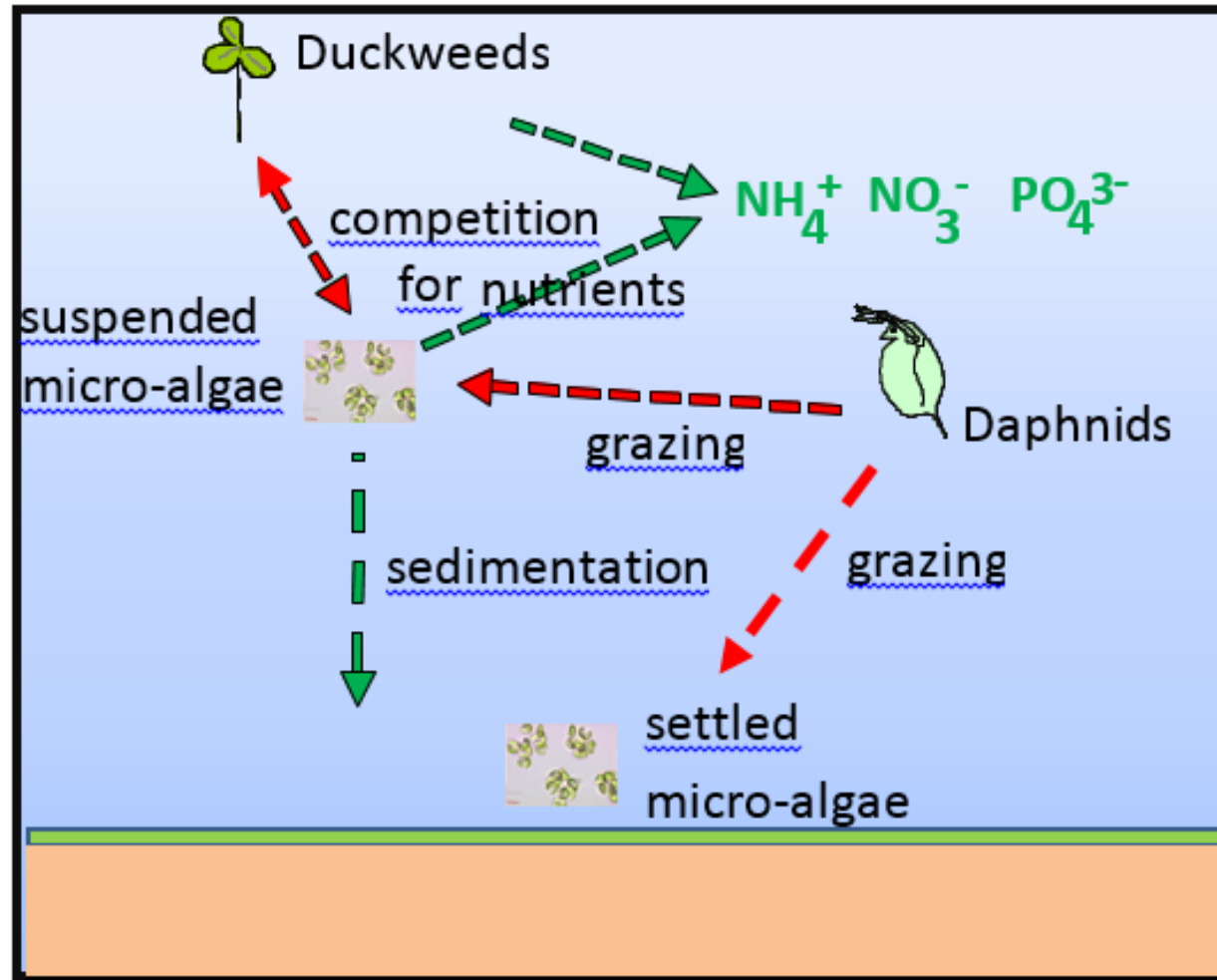
# *Why modeling ?*

## **Benefits of modeling**

- Better understanding of the functioning of the microecosystem and of the observed effects
- Interpretation of experimental observations through parameters values (output)
- Simulations to extrapolate and build new scenarios

# How modeling ?

## Structure of the model of a sub-system



## Processes considered and differential equations (algae + daphnids, no cadmium)

- Logistic growth of micro-algae in the water column ( $N_1$ ) and on the sediment ( $N_2$ )

$$\begin{cases} \frac{dN_1(t)}{dt} = r_1 N_1(t) \left( 1 - \frac{N_1(t)}{K_1(t)} \right) \\ \frac{dN_2(t)}{dt} = r_2 N_2(t) \left( 1 - \frac{N_2(t)}{K_2} \right) \end{cases}$$

$r_i$  = growth rate  
 $K_i$  = carrying capacity

- Settling of algal cells (exponential decay)

$$\frac{dN_1(t)}{dt} = -sN_1(t)$$

# How modeling ?

## Processes considered and differential equations (algae + daphnids, no cadmium)

### Daphnid survival, growth and grazing

$$S(t) = \exp(-ht)$$

Exponential decay of survival rate with time (h: mortality rate)

$$D_s(t) \sim B\left(\frac{S(t)}{S(t-1)}, D_s(t-1)\right)$$

Number of alive daphnids in the system at time t (binomial model)

$$I(t) = L_\infty - (L_\infty - L_0) \exp(-kt)$$

Von Bertalanffy growth model

$$g_1(t) = \begin{cases} f(t) \times \frac{N_1(t)}{V_1(0)} & \text{if } 0 < \frac{N_1(t)}{V_1(0)} \leq I_{\text{lim}} \\ f(t) \times I_{\text{lim}} & \text{if } \frac{N_1(t)}{V_1(0)} > I_{\text{lim}} \end{cases}$$

Ingestion rate  $g_i(t)$  product of filtering rate  $f(t)$  and algal density (i=1 water, i=2 sediment)  
 $f(t)$  function of daphnid size

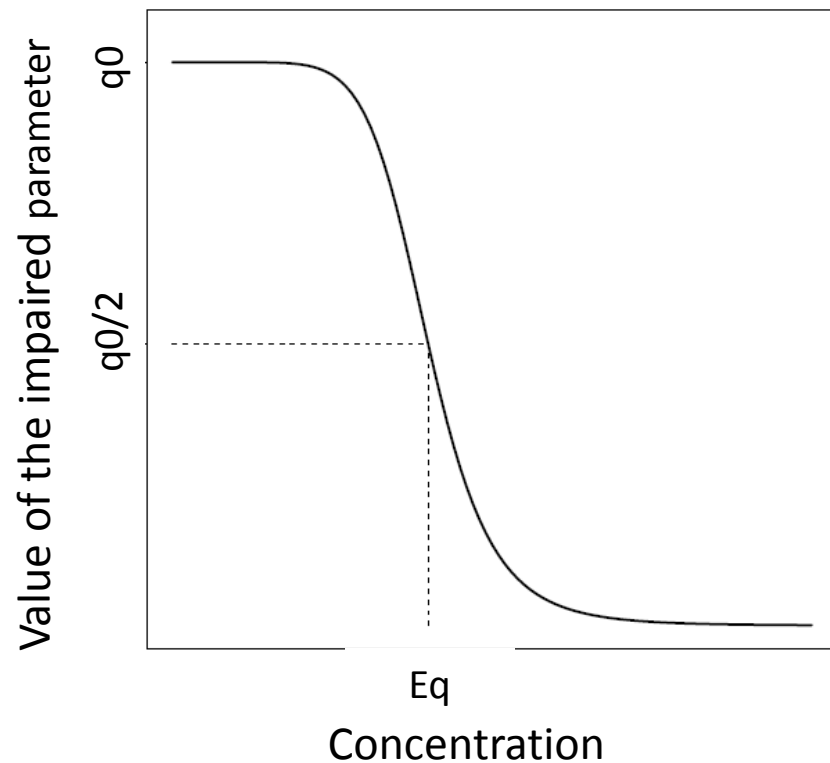
$$f(t) = \alpha L(t)^\nu$$



# How modeling ?

## Processes considered and differential equations (algae + daphnids + cadmium)

Same equations as without cadmium but variables depend on time *and* on Cd concentration



Growth rate (micro-algae, daphnids, duckweeds) and intensity of competition follow a three-parameter log-logistic function :

$$q(C_j) = \frac{q_0}{1 + \left(\frac{C_j}{E_q}\right)^{b_q}}$$

$E_q = EC50$

# How modeling ?

## Processes considered and differential equations (algae + duckweeds + cadmium)

Competition between microalgae and duckweeds taken into account through a Lotka-Volterra type I model; competition intensity supposed affected by Cd

$$\begin{cases} \frac{dN_1(t, C_k)}{dt} = \frac{r_{a0}}{1 + \left(\frac{C_k}{E_{ra}}\right)^{bra}} N_1(t, C_k) \left(1 - \frac{N_1(t, C_k)}{K_1(0) \exp(-st)}\right) - sN_1(t, C_k) - \frac{\eta_0}{1 + \left(\frac{C_k}{E_\eta}\right)^{b_\eta}} N_1(t, C_k) N_d(t, C_k) \\ \frac{dN_2(t, C_k)}{dt} = \frac{r_{a0}}{1 + \left(\frac{C_k}{E_{ra}}\right)^{bra}} N_2(t, C_k) \left(1 - \frac{N_2(t, C_k)}{K_2}\right) + sN_1(t, C_k) \\ \frac{dN_d(t, C_k)}{dt} = \frac{r_{d0}}{1 + \left(\frac{C_k}{E_{rd}}\right)^{br_d}} N_d(t, C_k) \left(1 - \frac{N_d(t, C_k)}{K_d}\right) - \frac{\beta_0}{1 + \left(\frac{C_k}{E_\beta}\right)^{b_\beta}} N_d(t, C_k) N_1(t, C_k) \end{cases}$$

# How modeling ?

## Processes considered and differential equations (algae + duckweeds + daphnids + cadmium)

Growth rate of daphnids depends on Cd concentration, daphnid survival expressed using the No Effect Concentration (NEC)

$$\left\{ \begin{array}{l} \frac{dN_1(t, C_j)}{dt} = r_a(C_j) \times N_1(t, C_j) \times \left( 1 - \frac{N_1(t, C_j)}{K_1(0) \exp(-s \times t)} \right) - s \times N_1(t, C_j) - D_1(t, C_j) \times g_1(t, C_j) \\ \frac{dN_2(t, C_j)}{dt} = r_a(C_j) \times N_2(t, C_j) \times \left( 1 - \frac{N_2(t, C_j)}{K_2} \right) + s \times N_1(t, C_j) \\ - (D_s(t, C_j) - D_1(t, C_j)) \times g_2(t, C_j) \\ \frac{dN_d(t, C_j)}{dt} = r_d(C_j) \times N_d(t, C_j) \times \left( 1 - \frac{N_d(t, C_j)}{K_d} \right) - \beta(C_j) \times N_d(t, C_j) \times N_1(t, C_j) \\ L(t, C_j) = L_\infty - (L_\infty - L_0) \times \exp(-k(C_j) \times t) \\ S(t, C_j) = \exp(-(m_0 + k_s \times \max(0, C_j - NEC)) \times t) \end{array} \right.$$

# How modeling ?

## Use of Bayesian inference for the solving of equations

$Y = f(\theta)$   $Y$  = data (observations, eg algal density, and variables (eg time, Cd concentration, ...)  
 $\theta$  = parameters to estimate (eg growth rate, survival rate, ...)

Aim : to find  $P(\theta|Y)$  the *a posteriori* distribution of  $\theta$  when data are known

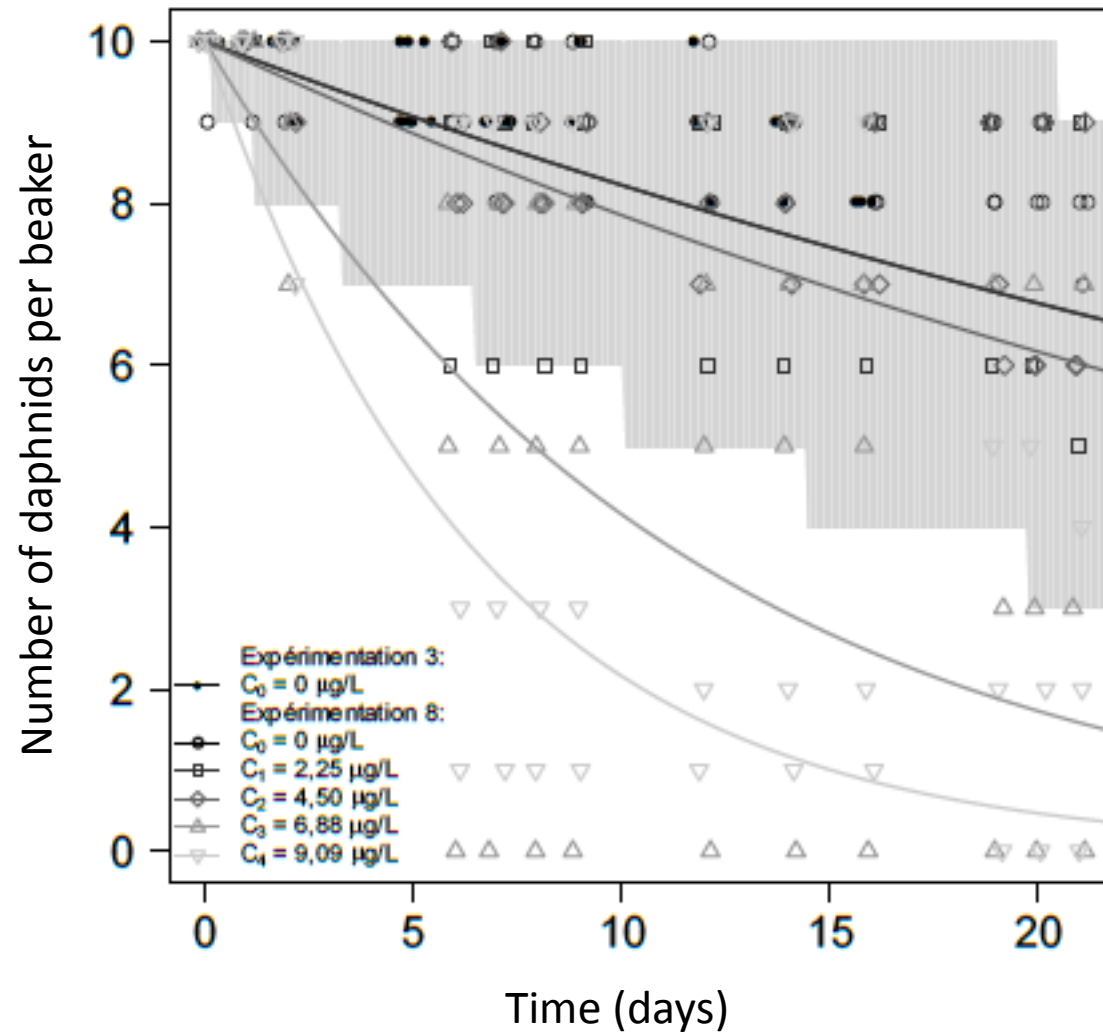
Bayes theorem :  $P(\theta) \times P(Y|\theta) \sim P(\theta|Y)$

$P(\theta)$  = *a priori* distribution of  $\theta$  , what is known on parameters before knowing data

$P(Y|\theta)$  = likelihood of data under model assumption

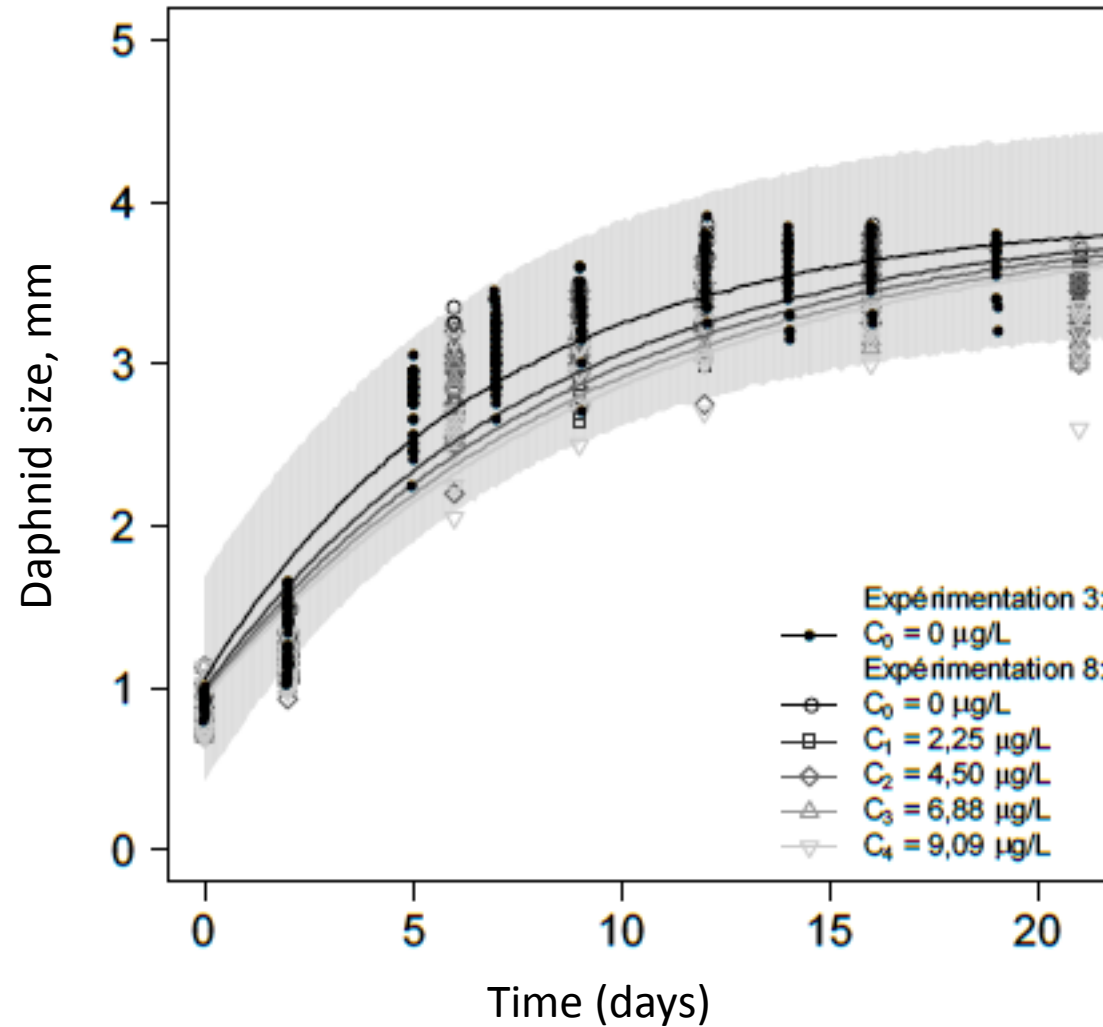
Computation : Monte Carlo Markov Chains (MCMC) + software JAGSS and library rjags of R

# Some results: modeling of the 3-species microcosm



**Daphnid survival** under Cd exposure: observed data, quantiles at 50% of simulated data (curves), 95%-credibility bands of control

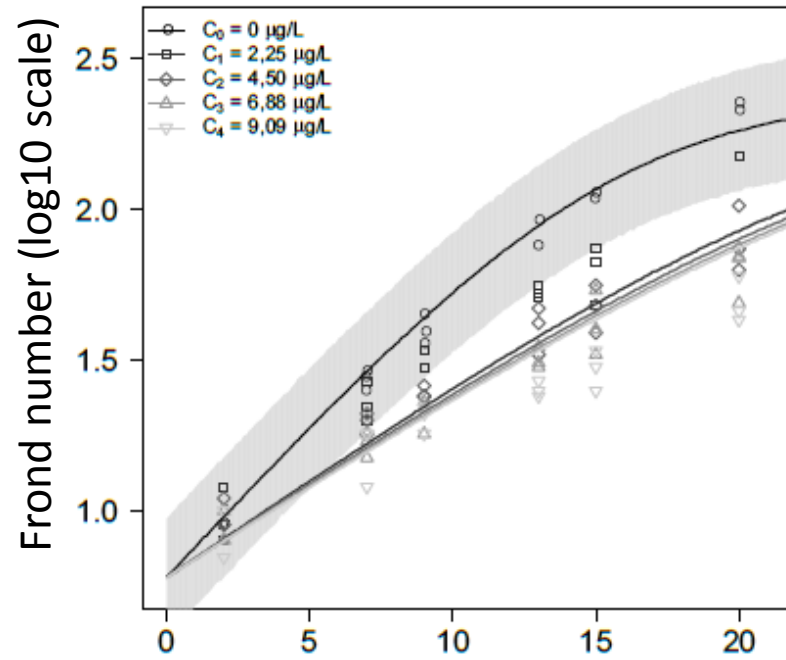
# Some results: modeling of the 3-species microcosm



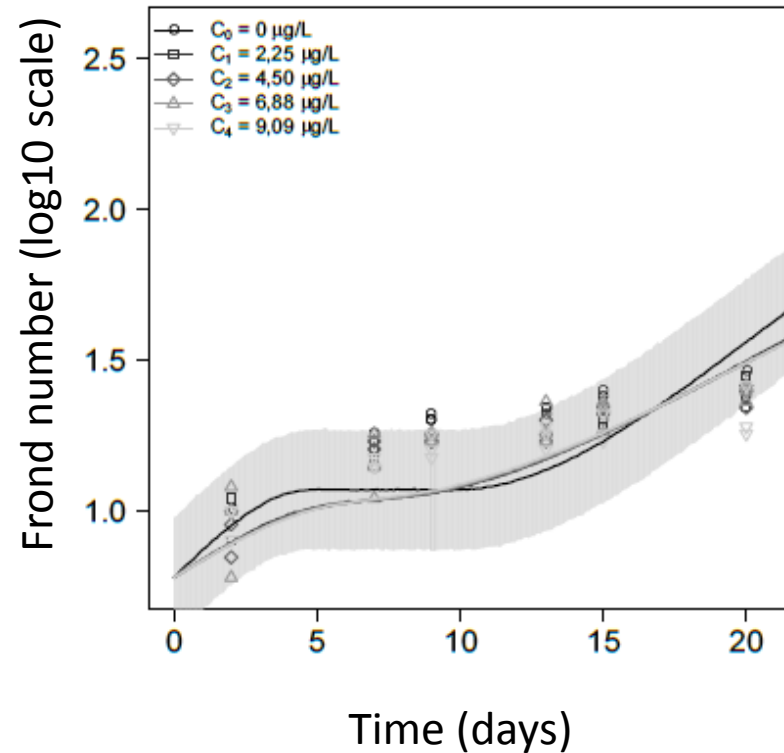
**Daphnid size** under Cd exposure: observed data, quantiles at 50% of simulated data (curves)

# Some results: modeling of the 3-species microcosm

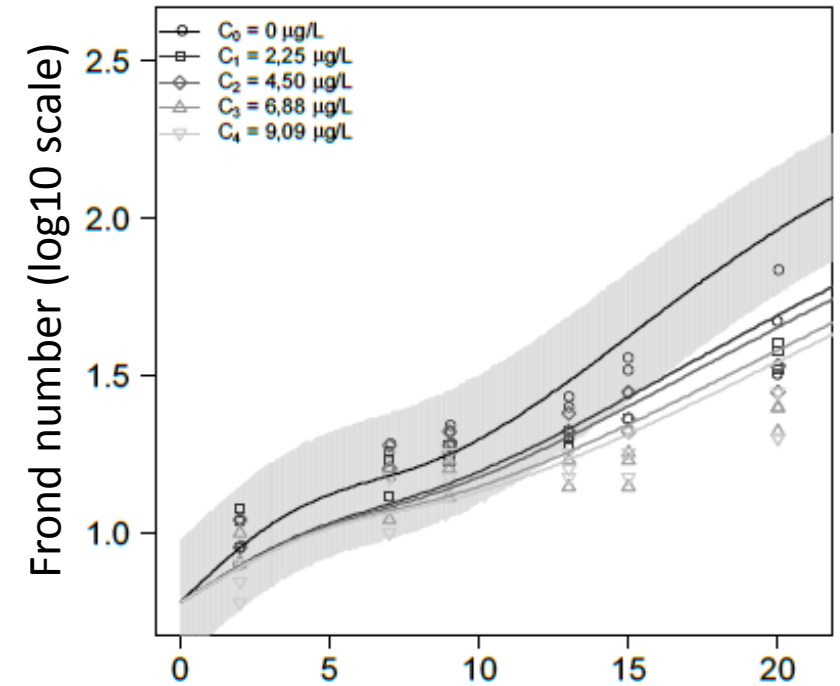
## Duckweeds alone



## Duckweeds + algae

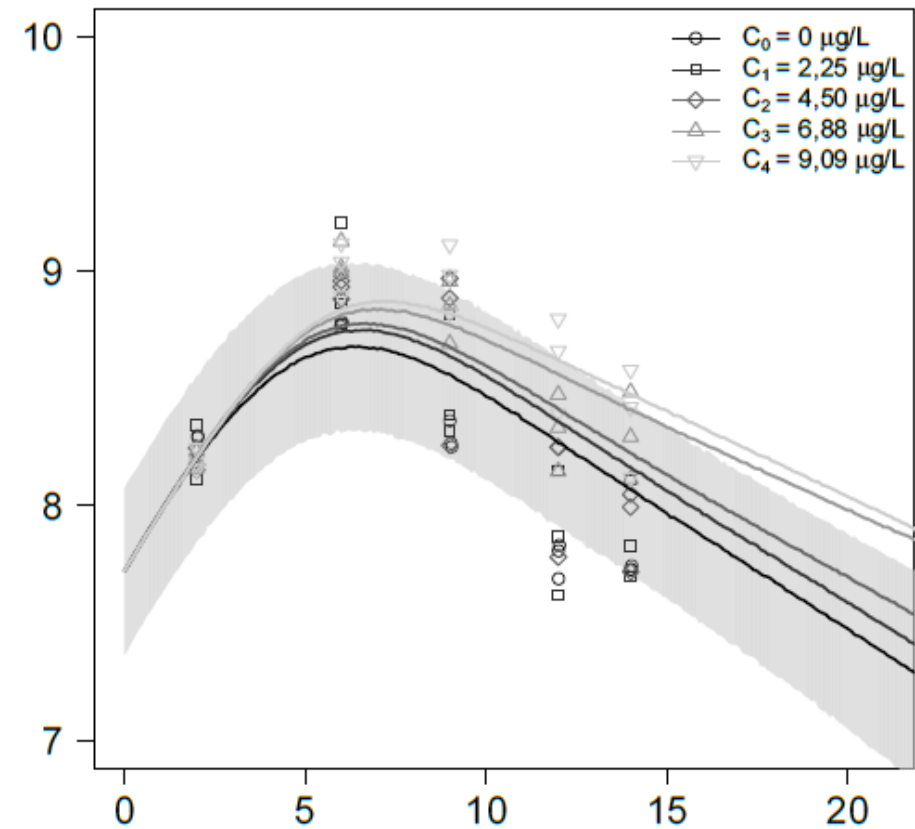
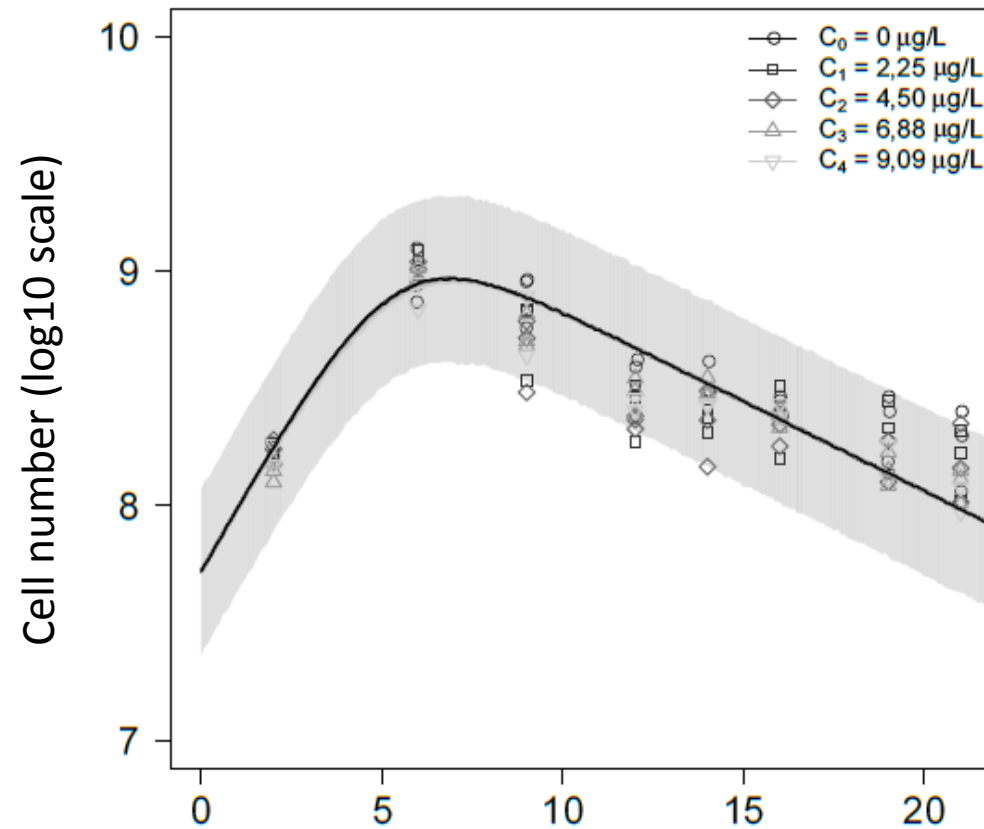


## Duckweeds + algae + daphnids



**Dynamics of duckweeds alone, with algae and with algae and daphnids: observed data, quantiles at 50% of simulated data (curves), 95%-credibility bands of control**

# Some results: modeling of the 3-species microcosm

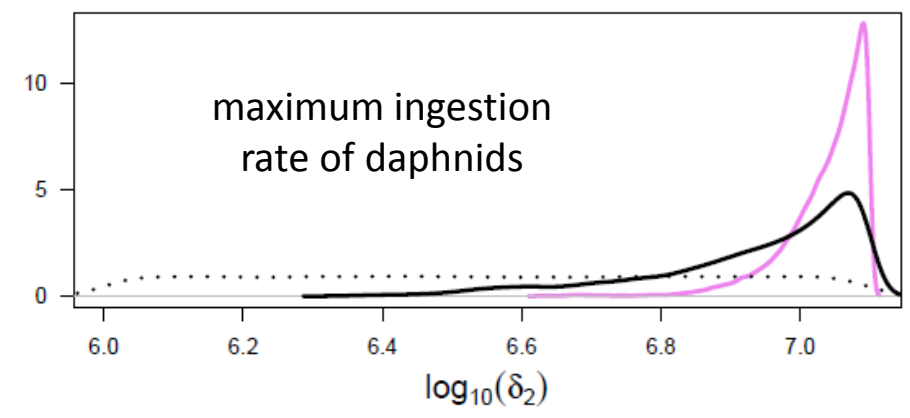
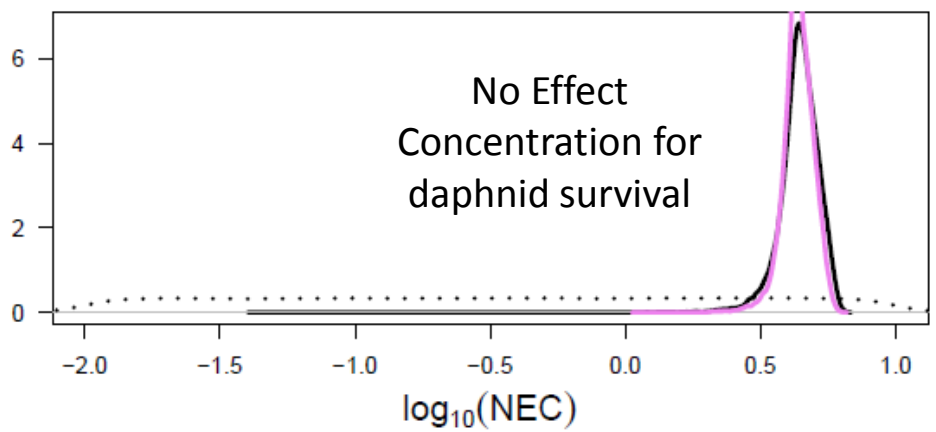
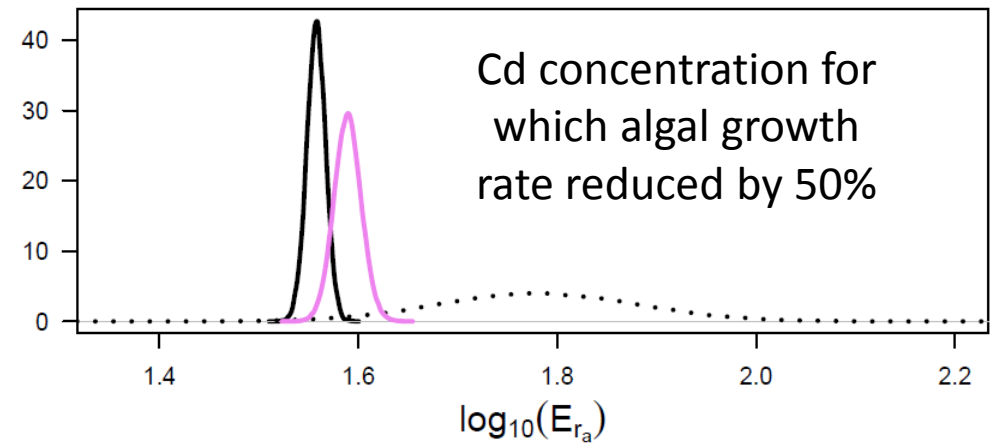
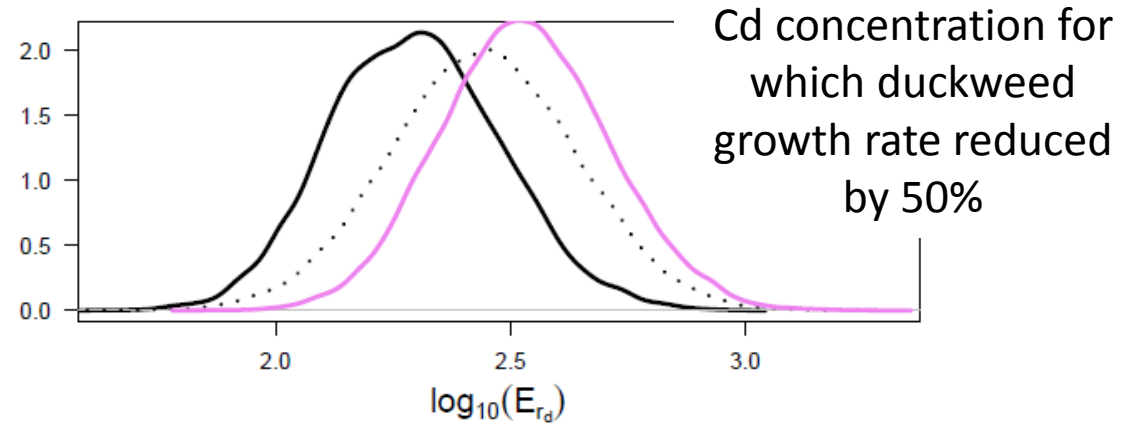


Time (days)

**Dynamics of algae with duckweeds and with duckweeds and daphnids: observed data, quantiles at 50% of simulated data (curves), 95%-credibility bands of control**



# Some results: modeling of the 3-species microcosm



***A priori* (dotted line) and *a posteriori* (models I and II) distributions of some parameters (out of 31) estimated using all available data**

# Discussion

## **Positive points:**

- microcosm functioning and interactions under Cd pressure successfully modeled
- critical effect concentrations and their uncertainties determined
- modeling improves understanding of microcosm response
- coupling experiments and modeling by iterative process → improvement of assay protocols, of experimental design

## **Limits and difficulties:**

- variability of microcosm assays (inter and intra)
- some processes not easily described: daphnid grazing activity for example

## *Future work and perspectives*

- Continuing modeling of the whole microcosm
- Taking into account daphnid reproduction
- Integrating processes such as nutrient dynamics, chemical speciation, uptake of chemical by organisms.

# Main references

BILLOIR E., DELHAYE H., CLÉMENT B., DELIGNETTE-MULLER M. L., CHARLES S., « Bayesian modelling of daphnid responses to time-varying cadmium exposure in laboratory aquatic microcosms », *Ecotoxicology and Environmental Safety*, n° 74, p. 693-702, 2011.

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LAMONICA D., CLÉMENT B., CHARLES S., LOPES C., « Modelling algae-duckweed interaction under chemical pressure within a laboratory microcosm », *Ecotoxicology and Environmental Safety*, n° 128, p. 252-265, 2016.

**THANK YOU FOR YOUR ATTENTION**