

Structural sensitivity:

predator-prey models to food webs, through Dynamic Energy Budget theory

Clément Aldebert¹, D. Nerini¹, M. Gauduchon¹, BW. Kooi², JC. Poggiale¹

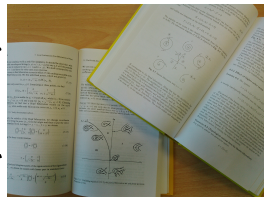
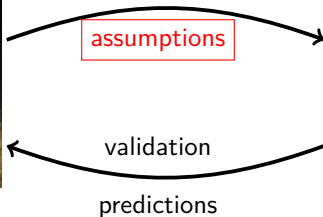
¹ Mediterranean Institute of Oceanography, Aix-Marseille University, France 

² Vrije Universiteit, Amsterdam, Netherlands 

6th September 2016, MPDE'16, Marseille



credit : G. C.



Assumptions $\Rightarrow$ simplifications (e.g. : predation)

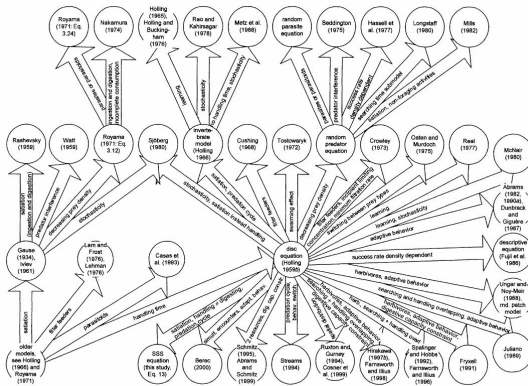
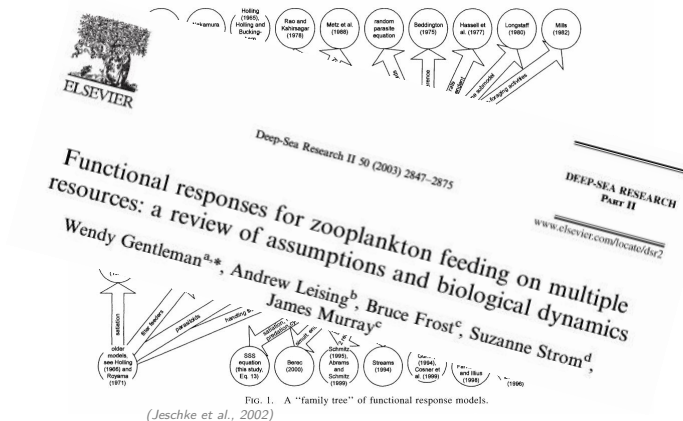


FIG. 1. A "family tree" of functional response models. (Jeschke et al., 2002)

encounter / attack, handling, digestion / metabolism, spatial heterogeneity, individual variability, collective behaviour, ...

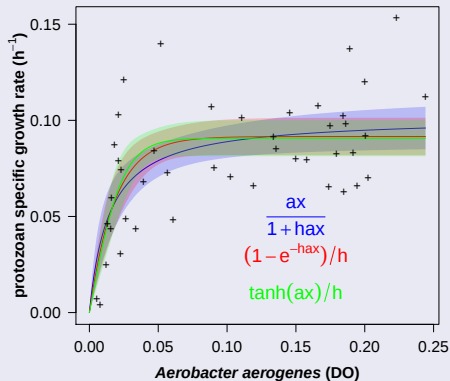
Assumptions $\Rightarrow$ simplifications (e.g. : predation)



encounter / attack, handling, digestion / metabolism, spatial heterogeneity, individual variability, collective behaviour, ...

Modelling predation at population scale

Tetrahymena pyriformis (Ciliate) (Canale et al., 1973)

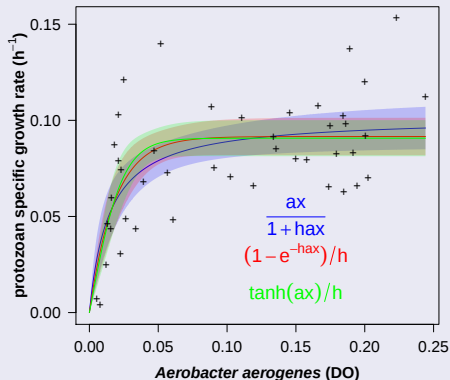


functional response

- amount of prey eaten / unit of predator / time unit

Modelling predation at population scale

Tetrahymena pyriformis (Ciliate) (Canale et al., 1973)

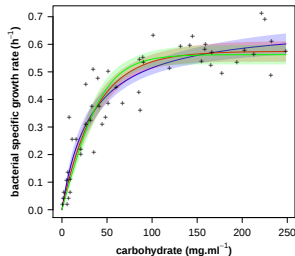


functional response

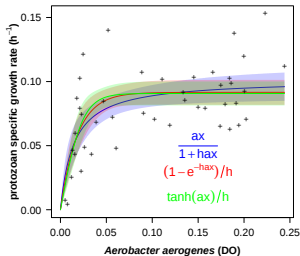
- amount of prey eaten / unit of predator / time unit
- 3 functions with the same mathematical properties $\Rightarrow$ same assumptions on **process shape**
- different assumptions on **underlying mechanisms**

Modelling predation at population scale

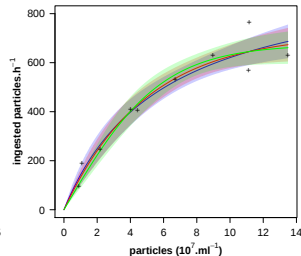
Aerobacter aerogenes (Bacteria) (Canale *et al.*, 1973)



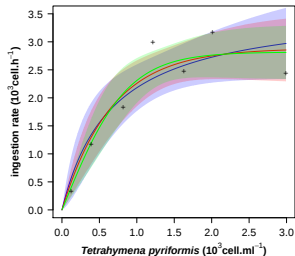
Tetrahymena pyriformis (Ciliate) (Canale *et al.*, 1973)



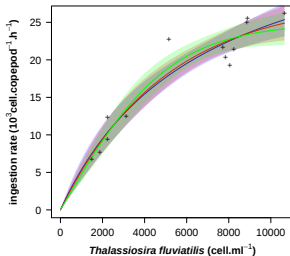
Glaucoma scintillans (Ciliate) (Fenchel, 1980)



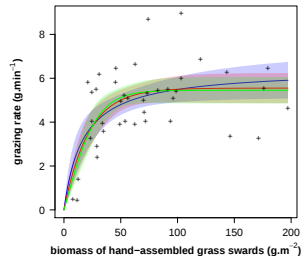
Daphnia magna (McMahon & Rigler, 1965)



Calanus pacificus (Copepod) (Frost, 1972)



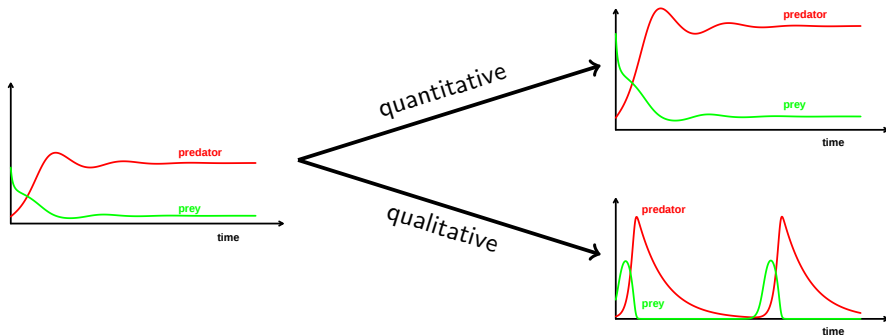
Gazella thomsoni (Wilmshurst *et al.*, 1999)



Structural sensitivity

model change $\Rightarrow$ change in predicted dynamics

- quantitative change (e.g. equilibrium value)
- qualitative change in dynamics (bifurcation) (Kuznetsov, 2004)



Structural sensitivity

model change $\Rightarrow$ change in predicted dynamics

- quantitative change (e.g. equilibrium value)
- qualitative change in dynamics (bifurcation) (Kuznetsov, 2004)

what is the problem ?

- functions having the same mathematical properties, fit data, with biological justification $\Rightarrow$ different predictions

Structural sensitivity

model change $\Rightarrow$ change in predicted dynamics

- quantitative change (e.g. equilibrium value)
- qualitative change in dynamics (bifurcation) *(Kuznetsov, 2004)*

what is the problem ?

- functions having the same mathematical properties, fit data, with biological justification $\Rightarrow$ different predictions
- **functional response** in predator-prey, food chain and biogeochemical models
(Myerscough et al., 1996, Gross et al., 2004, Fussmann & Blasius, 2005, Anderson et al., 2010, Cordoleani et al., 2011, M. Baklouti, pers. comm.)
- infection in a host-pathogen model *(Wood & Thomas, 1999)*
- co-limitation in a multi-nutrient model *(Poggiale et al., 2010)*

Structural sensitivity

model change $\Rightarrow$ change in predicted dynamics

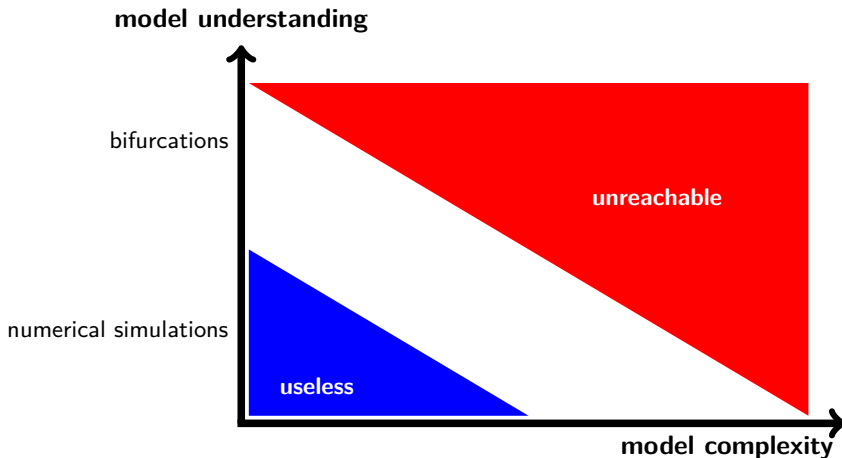
- quantitative change (e.g. equilibrium value)
- qualitative change in dynamics (bifurcation) *(Kuznetsov, 2004)*

what is the problem ?

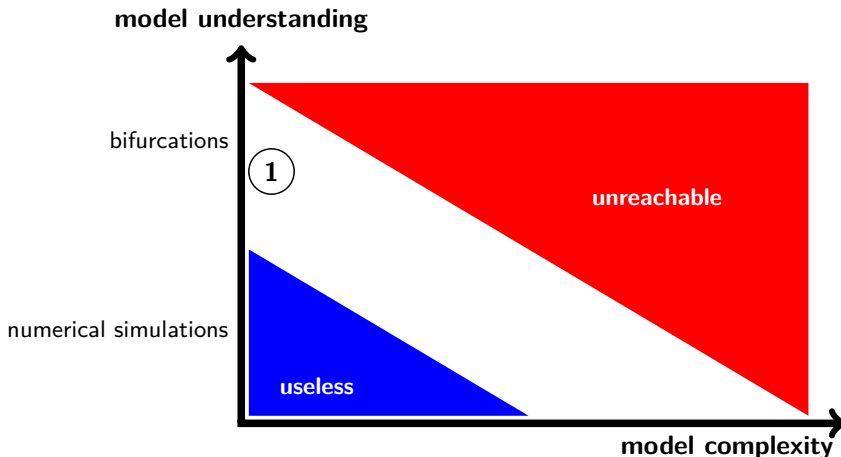
- functions having the same mathematical properties, fit data, with biological justification $\Rightarrow$ different predictions
- **functional response** in predator-prey, food chain and biogeochemical models
(Myerscough et al., 1996, Gross et al., 2004, Fussmann & Blasius, 2005, Anderson et al., 2010, Cordoleani et al., 2011, M. Baklouti, pers. comm.)
- infection in a host-pathogen model *(Wood & Thomas, 1999)*
- co-limitation in a multi-nutrient model *(Poggiale et al., 2010)*

previous studies : few state variables, “simple” dynamics (one stable state)

Structural sensitivity : $\pm$ complex models

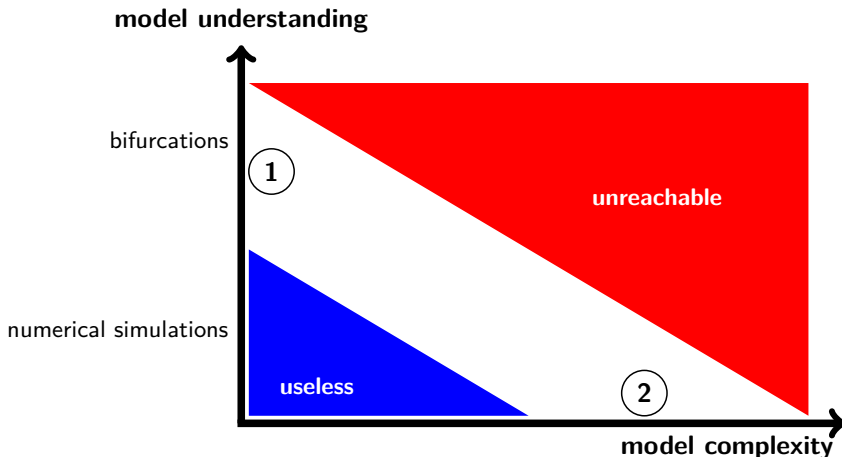


Structural sensitivity : $\pm$ complex models



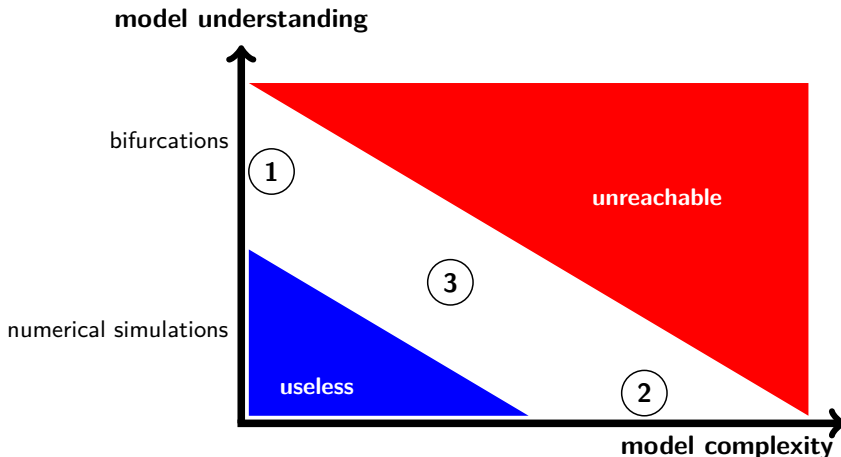
1 predator-prey system : multiple stable states & **resilience**

Structural sensitivity : $\pm$ complex models



- ① predator-prey system : multiple stable states & **resilience**
- ② food webs : predation vs **trophic complexity**

Structural sensitivity : $\pm$ complex models



- ① predator-prey system : multiple stable states & **resilience**
- ② food webs : predation vs **trophic complexity**
- ③ predator-prey system : predation vs details on **metabolism**

Predator-prey model : Bazykin (1998)

$$\begin{cases} \frac{dB_{prey}}{d\bar{t}} = [\lambda \bar{q}^\xi - \alpha - \beta \omega B_{prey}] B_{prey} - \bar{G}^\xi(B_{prey}) B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \\ \frac{dB_{pred}}{d\bar{t}} = [\lambda \bar{G}^\xi(B_{prey}) - \alpha - \beta B_{pred}] B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \end{cases}$$

Predator-prey model : Bazykin (1998)

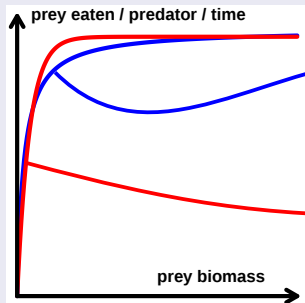
$$\begin{cases} \frac{dB_{prey}}{d\bar{t}} = [\lambda \bar{q}^{\xi} - \alpha - \beta \omega B_{prey}] B_{prey} - \bar{G}^{\xi}(B_{prey}) B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \\ \frac{dB_{pred}}{d\bar{t}} = [\lambda \bar{G}^{\xi}(B_{prey}) - \alpha - \beta B_{pred}] B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \end{cases}$$

Predator-prey model : Bazykin (1998)

$$\begin{cases} \frac{dB_{prey}}{d\bar{t}} = [\lambda \bar{q}^\xi - \alpha - \beta \omega B_{prey}] B_{prey} - \bar{G}^\xi(B_{prey}) B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \\ \frac{dB_{pred}}{d\bar{t}} = [\lambda \bar{G}^\xi(B_{prey}) - \alpha - \beta B_{pred}] B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \end{cases}$$

Predator-prey model : Bazykin (1998)

$$\begin{cases} \frac{dB_{prey}}{d\bar{t}} = [\lambda \bar{q}^\xi - \alpha - \beta \omega B_{prey}] B_{prey} - \bar{G}^\xi(B_{prey}) B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \\ \frac{dB_{pred}}{d\bar{t}} = [\lambda \bar{G}^\xi(B_{prey}) - \alpha - \beta B_{pred}] B_{pred} \left(\frac{M_{pred}}{M_{prey}} \right)^{-0.25} \end{cases}$$



Holling (1959) : handling

$$\bar{G}^H = \frac{a^H B_{prey}}{1 + h^H a^H B_{prey}}$$

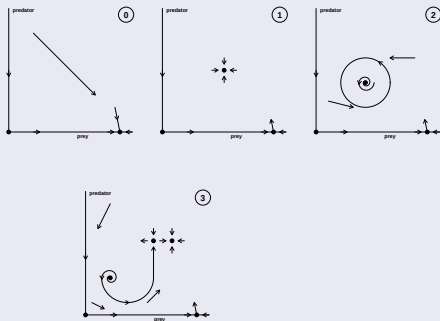
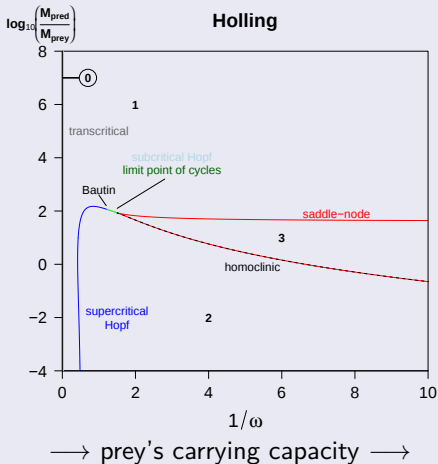
Livlev (1955) : satiation

$$\bar{G}^I = \left(1 - e^{-h^I a^I B_{prey}} \right) / h^I$$

(Aldebert et al., in press a)

Bifurcation diagram with Holling

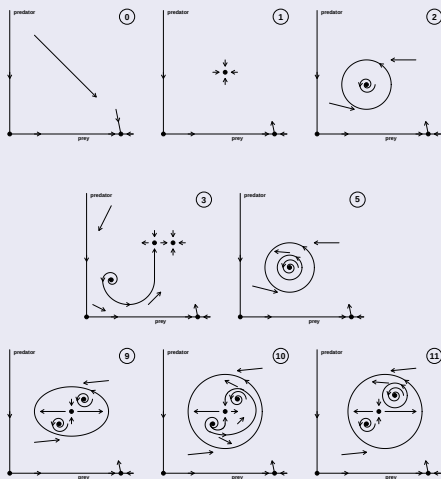
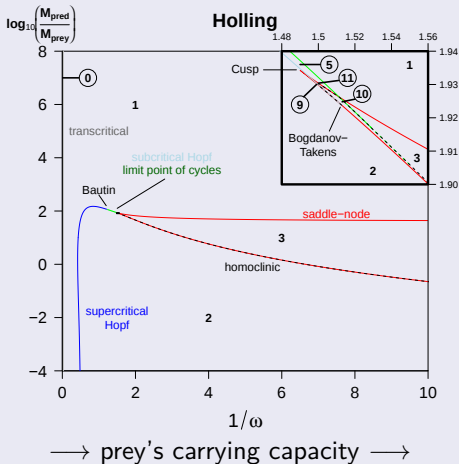
body mass ratio



(modified from Aldebert et al., in press a)

Bifurcation diagram with Holling

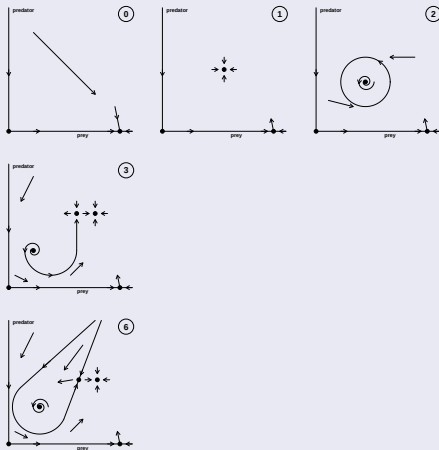
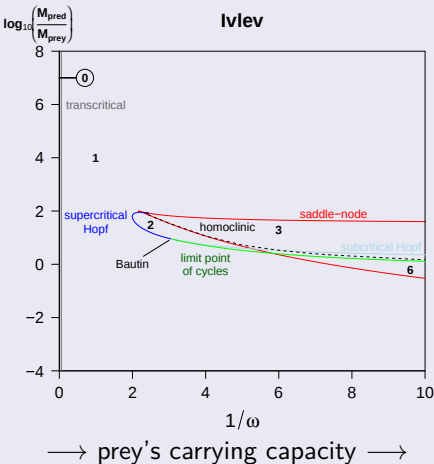
body mass ratio



(modified from Aldebert et al., in press a)

Bifurcation diagram with Ivlev

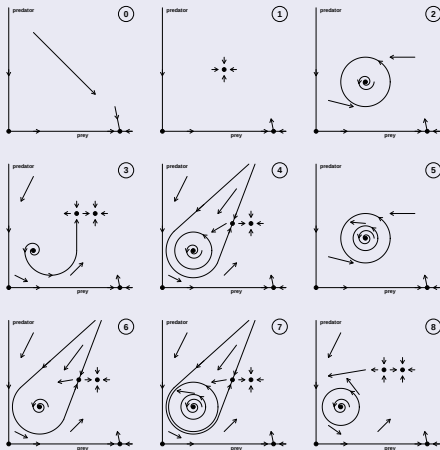
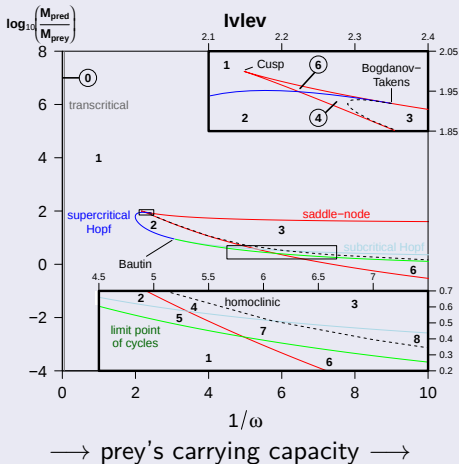
body mass ratio



(modified from Aldebert et al., in press a)

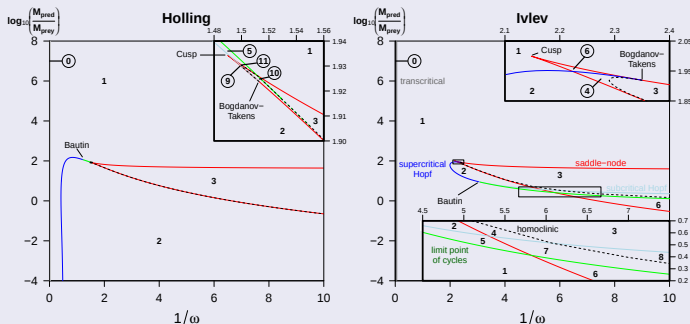
Bifurcation diagram with Ivlev

body mass ratio



(modified from Aldebert et al., in press a)

Bifurcation diagram : Holling vs Ivlev

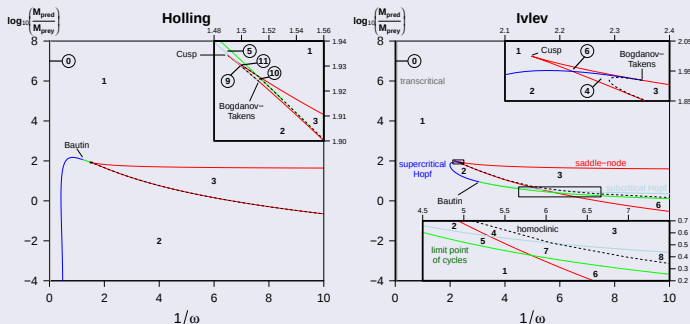


main differences

- stable equilibrium vs stable limit cycle : 26.0 % – 49.4 %

(modified from Aldebert et al., in press a, in prep. b)

Bifurcation diagram : Holling vs Ivlev



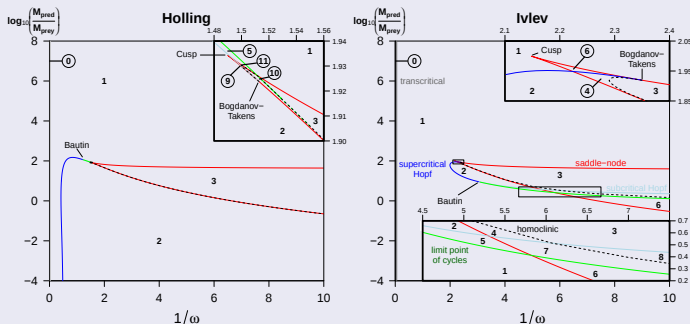
main differences

- stable equilibrium vs stable limit cycle : 26.0 % – 49.4 %
- multiple attractors (up to 3) with Ivlev : 0.1 % – 14.3 %

NEW

(modified from Aldebert et al., in press a, in prep. b)

Bifurcation diagram : Holling vs Ivlev



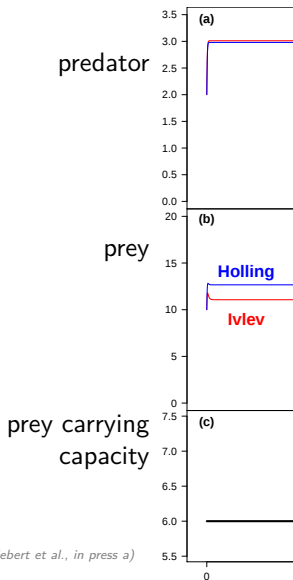
main differences

- stable equilibrium vs stable limit cycle : 26.0 % – 49.4 %
- multiple attractors (up to 3) with Ivlev : 0.1 % – 14.3 %
- continuous switch : degenerated Bogdanov-Takens bifurcation (codim 3)

NEW

(modified from Aldebert et al., in press a, in prep. b)

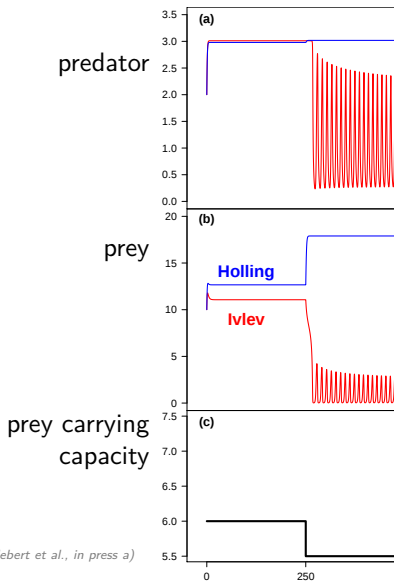
Resilience in changing environmental conditions



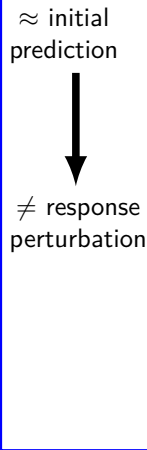
(Aldebert et al., in press a)

$\approx$ initial
prediction

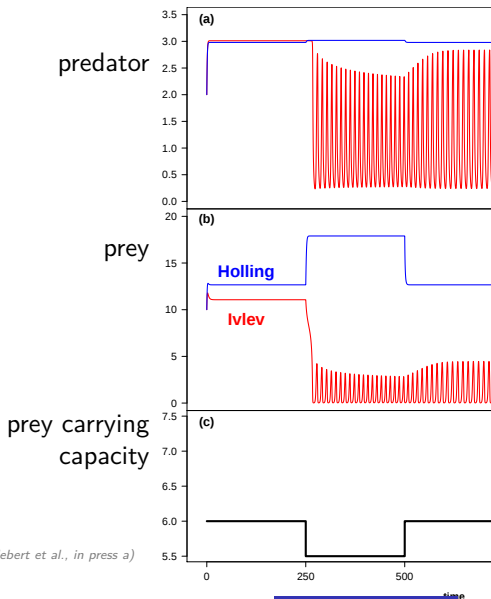
Resilience in changing environmental conditions



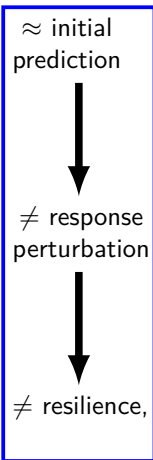
(Aldebert et al., in press a)



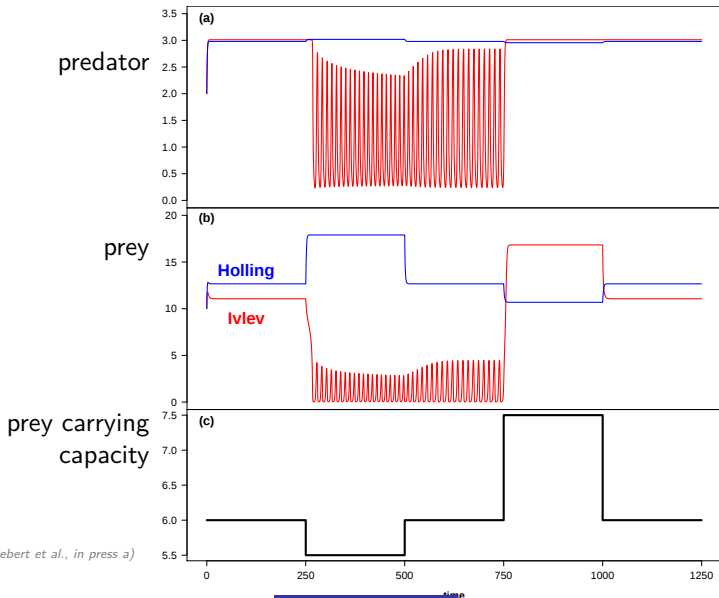
Resilience in changing environmental conditions



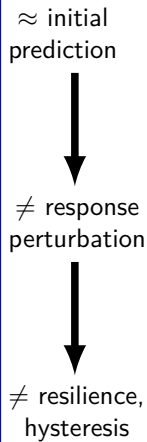
(Aldebert et al., in press a)



Resilience in changing environmental conditions



(Aldebert et al., in press a)



Structural sensitivity in food webs

millions of theoretical networks (20-60 species, connectance : 0.1-0.3)



- randomly built using “niche model” $\Rightarrow$ empirically consistent structural properties (Williams & Martinez, 2000, 2004; Cattin et al., 2004; Allesina et al., 2008)
- structure $\Rightarrow$ build and parameterize a dynamical system

Structural sensitivity in food webs

millions of theoretical networks (20-60 species, connectance : 0.1-0.3)



- randomly built using “niche model” $\Rightarrow$ empirically consistent structural properties (*Williams & Martinez, 2000, 2004; Cattin et al., 2004; Allesina et al., 2008*)
- structure $\Rightarrow$ build and parameterize a dynamical system

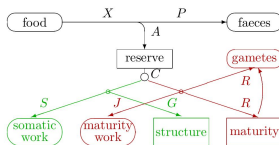
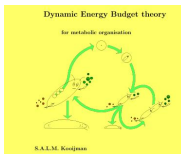
		persistence	equilib. / oscillations
trophic complexity	# species	0.76	NS
	connectance	0.37	0.36
functional response	formulation	-0.17	0.82
	maximum slope	0.12	-0.22
	maximum rate	0.07	0.07

TABLE : correlation coefficients

($\approx 6.10^7$ food webs were simulated to obtain this table)
computational effort : 3 years.processors

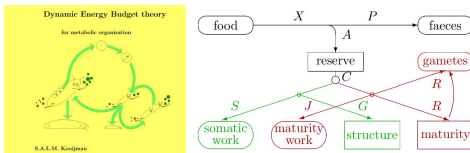
(Aldebert et al., in press b)

Structural sensitivity and metabolism : DEB theory



- focus on the individual, based on mechanistic assumptions on metabolism
- same framework for most species, metabolic classification of species

Structural sensitivity and metabolism : DEB theory



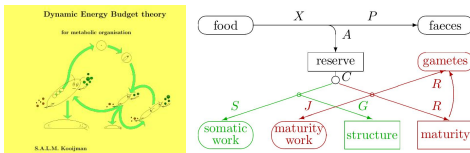
- focus on the individual, based on mechanistic assumptions on metabolism
- same framework for most species, metabolic classification of species

structural sensitivity

- chemostat data $\Rightarrow$ $\pm$ detailed models with a coherent theoretical framework
(Canale et al., 1973, Dent et al., 1976, Kooi & Kooijman, 1994b)
- multiple stable states in DEB model (reserve and maintenance)

(Aldebert et al., in prep. a)

Structural sensitivity and metabolism : DEB theory



- focus on the individual, based on mechanistic assumptions on metabolism
- same framework for most species, metabolic classification of species

structural sensitivity

- chemostat data $\Rightarrow$ $\pm$ detailed models with a coherent theoretical framework
(Canale et al., 1973, Dent et al., 1976, Kooi & Kooijman, 1994b)
- multiple stable states in DEB model (reserve and maintenance)
- influence of **metabolism** > **functional response**
- change of functional response : no new bifurcations (and dynamics) if **minimum of biological realism** (maintenance/mortality, explicit resource)

(Aldebert et al., in prep. a)

Conclusion

- predator-prey model : structural sensitivity affects the type and number of stable states → affects the **predicted resilience** of the system
- trophic complexity → food web persistence,
functional response → food web variability
- DEB : details on metabolism ↘ structural sensitivity to functional response

Concluding remarks and perspectives

Conclusion

- predator-prey model : structural sensitivity affects the type and number of stable states → affects the **predicted resilience** of the system
- trophic complexity → food web persistence, functional response → food web variability
- DEB : details on metabolism ↘ structural sensitivity to functional response

Perspectives (Predictive Ecology group, UZH, Zürich)

- **quantification method** with multiple stable states (ongoing work)
- structural sensitivity and resilience in food webs, other networks
- dealing with **uncertainty in predictions** due to model construction

Thank you for your attention !!!



Contents lists available at [ScienceDirect](#)

Ecological Complexity

journal homepage: www.elsevier.com/locate/ecocom



Original Research Article

Structural sensitivity and resilience in a predator–prey model with density-dependent mortality

C. Aldebert*, D. Nerini, M. Gauduchon, J.C. Poggiale



Contents lists available at [ScienceDirect](#)

Ecological Complexity

journal homepage: www.elsevier.com/locate/ecocom



Original Research Article

Does structural sensitivity alter complexity–stability relationships?

C. Aldebert*, D. Nerini, M. Gauduchon, J.C. Poggiale

EXTRA-SLIDES

Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

(Aldebert et al., in prep b)

Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

Bogdanov-Takens de point triple : forme normale

$\Rightarrow$ forme normale : Bob Kooi

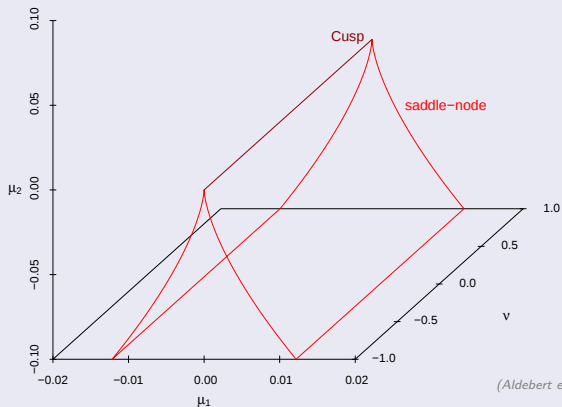
(Baer, Kooi, Kuznetsov, Thieme, 2006)

$$\begin{cases} \frac{d\xi}{dt} = \eta \\ \frac{d\eta}{dt} = -\mu_1 - \mu_2\xi + \nu\eta + \beta\xi\eta - \xi^3 - \eta\xi^2 \end{cases}$$

(Aldebert et al., in prep b)

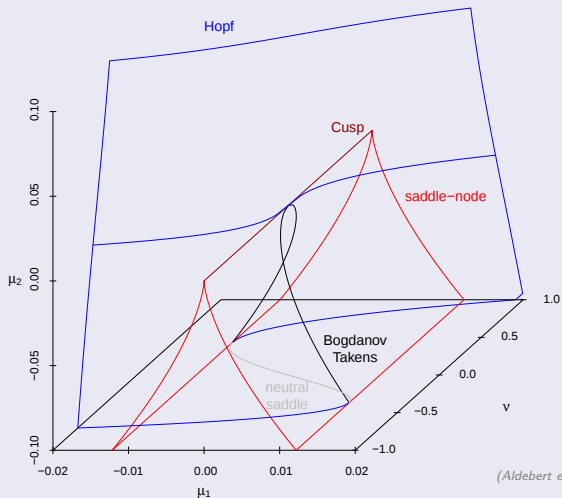
Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

Bogdanov-Takens de point triple : forme normale



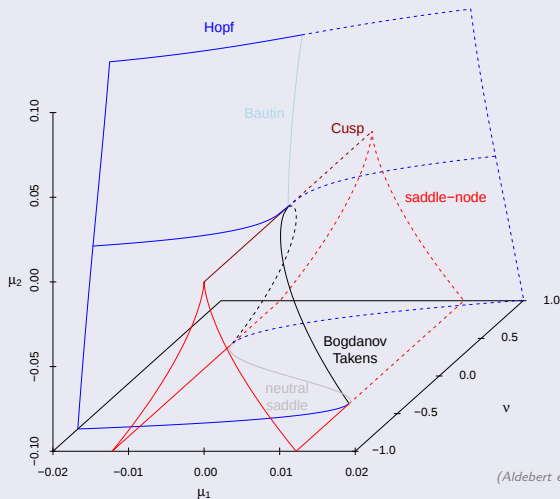
Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

Bogdanov-Takens de point triple : forme normale



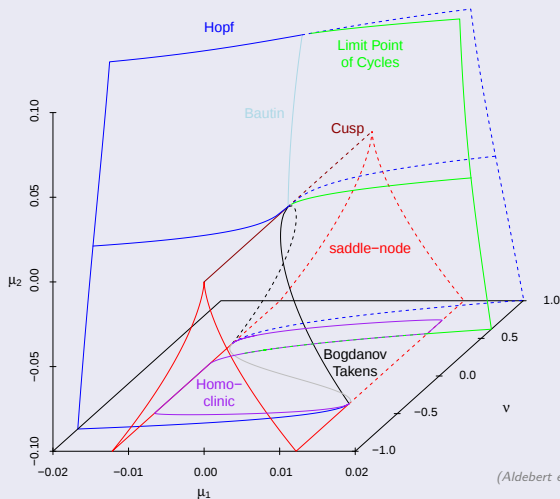
Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

Bogdanov-Takens de point triple : forme normale



Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

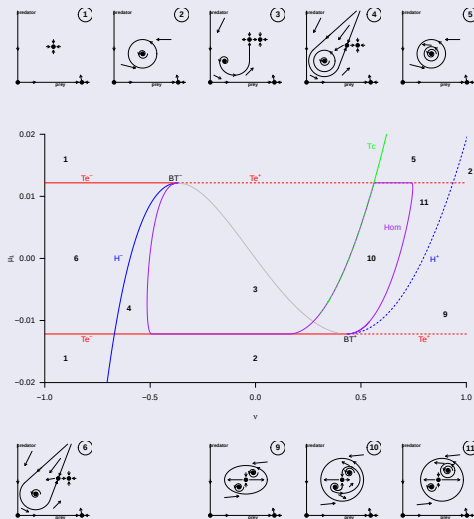
Bogdanov-Takens de point triple : forme normale



(Aldebert et al., in prep b)

Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

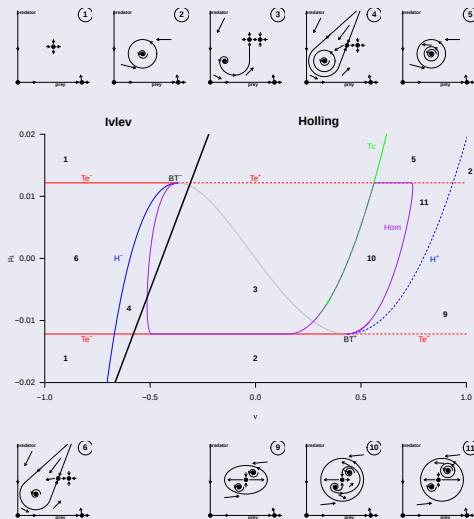
Bogdanov-Takens de point triple : forme normale



(Aldebert et al., in prep b)

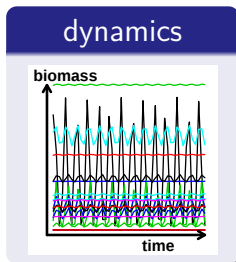
Switch Holling - Ivlev : $\bar{G}^\xi = \xi \bar{G}^H + (1 - \xi) \bar{G}^I$

Bogdanov-Takens de point triple : forme normale

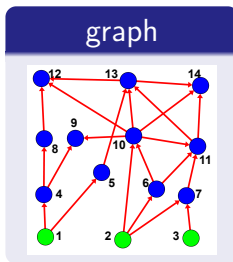


(Aldebert et al., in prep b)

Structural sensitivity vs. complexity-stability



=

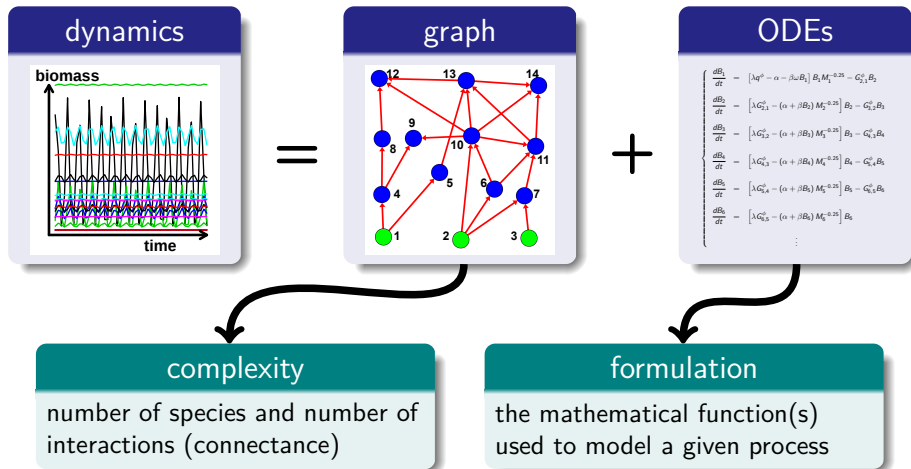


+

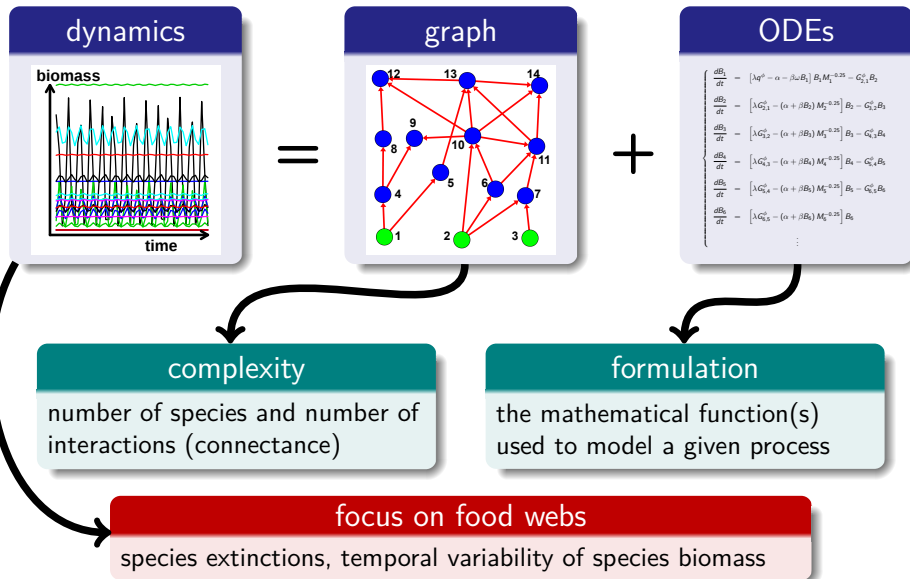
ODEs

$$\left\{ \begin{array}{l} \frac{dB_1}{dt} = [\lambda q^0 - \alpha - \beta B_1] B_1 M_1^{-0.25} - G_{2,1}^0 B_2 \\ \frac{dB_2}{dt} = [\lambda G_{2,1}^0 - (\alpha + \beta B_2) M_2^{-0.25}] B_2 - G_{3,2}^0 B_3 \\ \frac{dB_3}{dt} = [\lambda G_{3,2}^0 - (\alpha + \beta B_3) M_3^{-0.25}] B_3 - G_{4,3}^0 B_4 \\ \frac{dB_4}{dt} = [\lambda G_{4,3}^0 - (\alpha + \beta B_4) M_4^{-0.25}] B_4 - G_{5,4}^0 B_5 \\ \frac{dB_5}{dt} = [\lambda G_{5,4}^0 - (\alpha + \beta B_5) M_5^{-0.25}] B_5 - G_{6,5}^0 B_6 \\ \frac{dB_6}{dt} = [\lambda G_{6,5}^0 - (\alpha + \beta B_6) M_6^{-0.25}] B_6 \\ \vdots \end{array} \right.$$

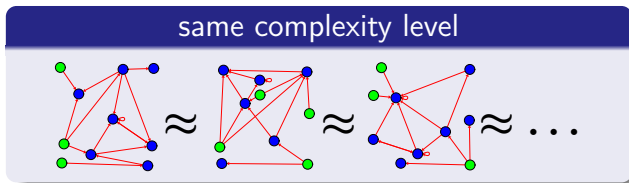
Structural sensitivity vs. complexity-stability



Structural sensitivity vs. complexity-stability

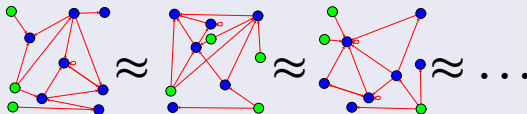


A statistical approach



A statistical approach

same complexity level



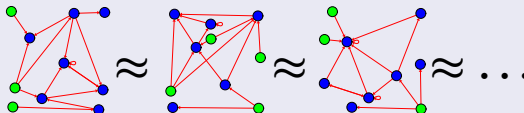
millions of “realistic” food webs

- randomly built using the niche model → structural properties that are empirically consistent (*Williams & Martinez, 2000, 2004; Cattin et al., 2004; Allesina et al., 2008*)
- use the structure to build and parameterize a dynamical system



A statistical approach

same complexity level



millions of “realistic” food webs



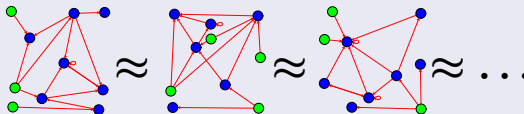
- randomly built using the niche model → structural properties that are empirically consistent (*Williams & Martinez, 2000, 2004; Cattin et al., 2004; Allesina et al., 2008*)
- use the structure to build and parameterize a dynamical system

a bio-energetic model

$$\frac{dB_i}{dt} = \underbrace{\lambda q_i^\phi B_i + \lambda \sum_{j \in R_i} G_{i,j}^\phi B_j}_{\text{gain by primary production or predation}} - \overbrace{\sum_{j \in C_i} G_{j,i}^\phi B_j}^{\text{losses by predation}} - \underbrace{\alpha_i B_i - \beta_i B_i^2}_{\text{mortality and competition}}$$

A statistical approach

same complexity level



millions of “realistic” food webs

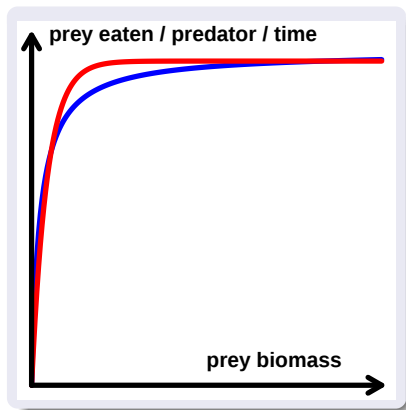


- randomly built using the niche model → structural properties that are empirically consistent (Williams & Martinez, 2000, 2004; Cattin et al., 2004; Allesina et al., 2008)
- use the structure to build and parameterize a dynamical system

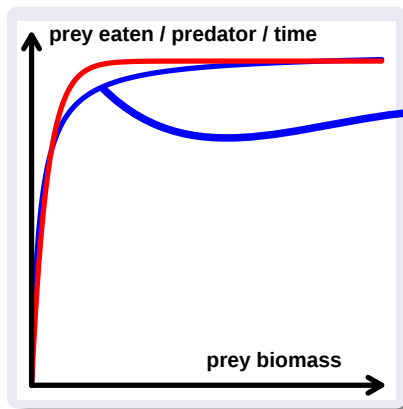
a bio-energetic model

$$\frac{dB_i}{dt} = \underbrace{\lambda q_i^\phi B_i + \lambda \sum_{j \in R_i} G_{i,j}^\phi B_j}_{\text{gain by primary production or predation}} - \overbrace{\sum_{j \in C_i} G_{j,i}^\phi B_j}^{\text{losses by predation}} - \underbrace{\alpha_i B_i - \beta_i B_i^2}_{\text{mortality and competition}}$$

Functional response (type II)



Functional response (type II)



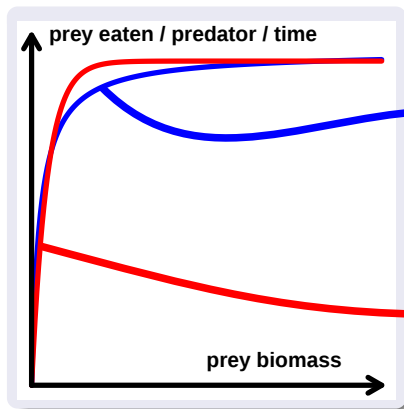
Holling (1959, 1965)

handling time

$$G_{i,j}^H = \frac{a_i^H f_{i,j} B_j}{1 + h_i^H a_i^H T_i}$$

$$T_i = \sum_{j \in R_i} f_{i,j} B_j$$

Functional response (type II)



Holling (1959, 1965)

handling time

$$G_{i,j}^H = \frac{a_i^H f_{i,j} B_j}{1 + h_i^H a_i^H T_i}$$

Ivlev (1955)

digestion

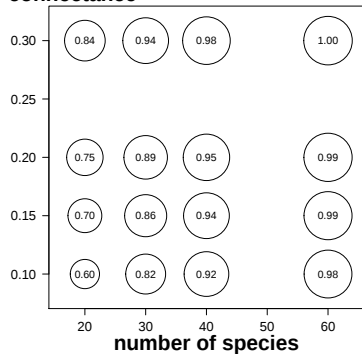
$$G_{i,j}^I = \frac{1}{h_i^I} \left(1 - e^{-h_i^I a_i^I T_i} \right) \frac{f_{i,j} B_j}{T_i}$$

$$T_i = \sum_{j \in R_i} f_{i,j} B_j$$

Fraction of food webs with extinction(s)

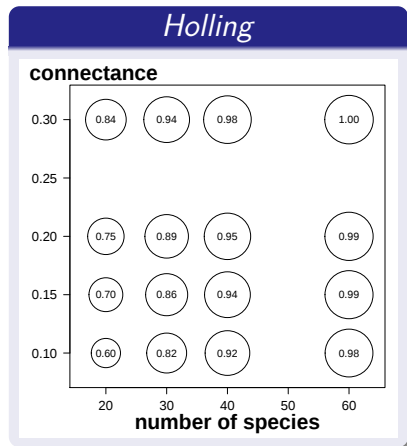
Holling

connectance

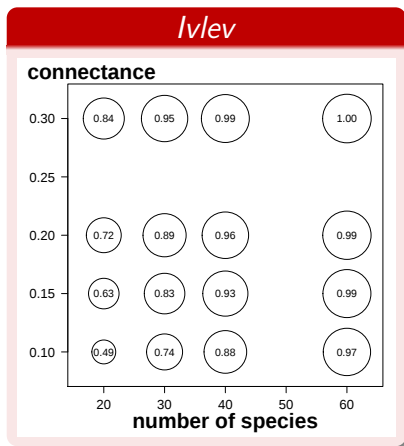


(modified from Aldebert et al., *subm. rev. b*)

Fraction of food webs with extinction(s)

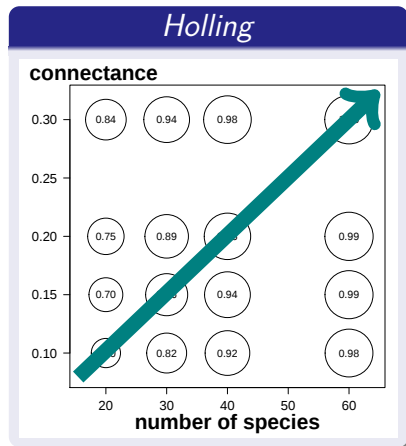


$\approx$

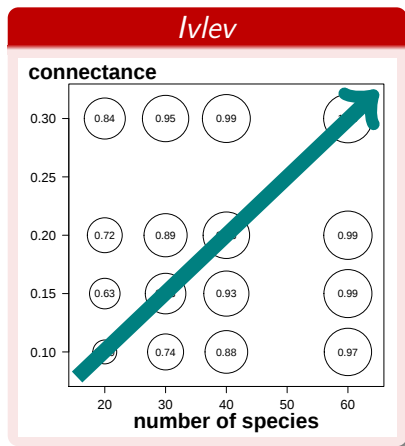


(modified from Aldebert et al., *subm. rev. b*)

Fraction of food webs with extinction(s)



$\approx$



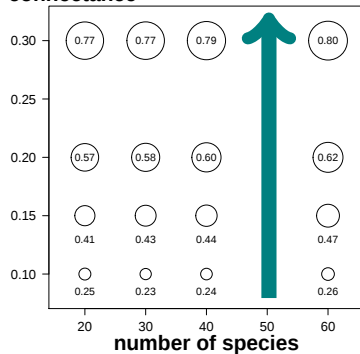
predation fluxes of similar intensity between functional responses

(modified from Aldebert et al., *subm. rev. b*)

Fraction of persistent food webs which reach an equilibrium

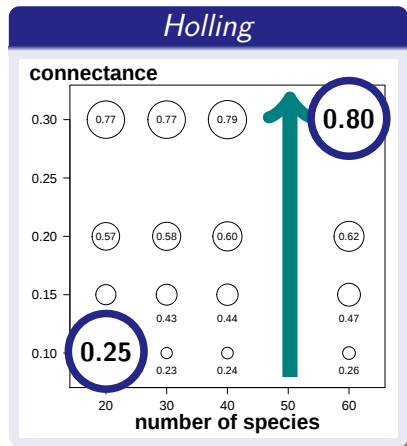
Holling

connectance

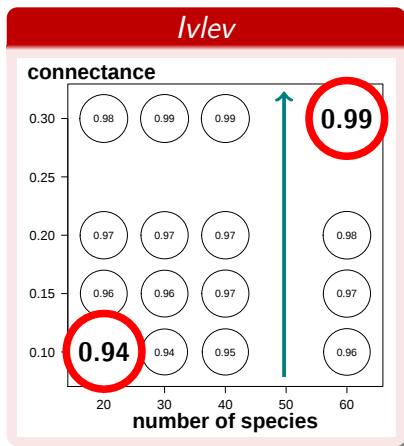


(modified from Aldebert et al., *subm. rev. b*)

Fraction of persistent food webs which reach an equilibrium

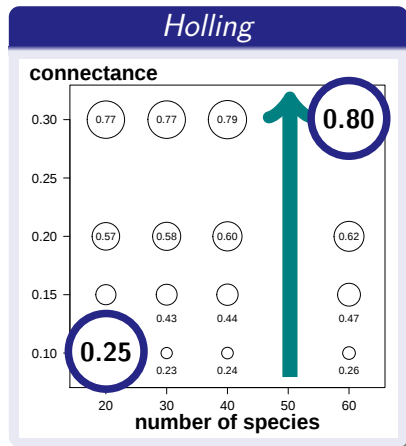


$\neq$

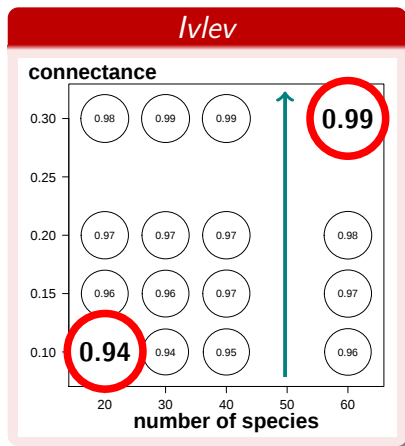


(modified from Aldebert et al., *subm. rev. b*)

Fraction of persistent food webs which reach an equilibrium



$\neq$



!!! formulation $\gg$ complexity !!!

(modified from Aldebert et al., *subm. rev. b*)

Is it a specific case ?

- functional response impact is unaffected by changes in model assumptions (primary production, cannibalism) and measure of persistence/variability
- no way to fit functional responses in order to obtain the same dynamics

Is it a specific case ?

- functional response impact is unaffected by changes in model assumptions (primary production, cannibalism) and measure of persistence/variability
- no way to fit functional responses in order to obtain the same dynamics

	% with extinctions	% → equilibrium
number of species	0.76	NS
connectance	0.37	0.36
maximum slope	0.12	-0.22
maximum rate	0.07	0.07
functional response	-0.17	0.82

TABLE : Correlation coefficients

($\approx 6.10^7$ food webs were simulated to obtain this table)

computational effort : 3 years.processors

Bifurcations in a predator-prey system

same model $\Rightarrow$ the simplest food web

$$\begin{cases} \dot{B}_{prey}(t') &= [\lambda q^\xi - \alpha - \beta \omega B_{prey}] B_{prey} - G^\xi M_{pred}^{0.25} B_{pred} (M_{pred}/M_{prey})^{-0.25} \\ \dot{B}_{pred}(t') &= [\lambda G^\xi M_{pred}^{0.25} - \alpha - \beta B_{pred}] B_{pred} (M_{pred}/M_{prey})^{-0.25} \end{cases}$$

basic properties

- Rosenzweig-MacArthur's model with predator competition

Bifurcations in a predator-prey system

same model $\Rightarrow$ the simplest food web

$$\begin{cases} \dot{B}_{prey}(t') &= [\lambda q^\xi - \alpha - \beta \omega B_{prey}] B_{prey} - G^\xi M_{pred}^{0.25} B_{pred} (M_{pred}/M_{prey})^{-0.25} \\ \dot{B}_{pred}(t') &= [\lambda G^\xi M_{pred}^{0.25} - \alpha - \beta B_{pred}] B_{pred} (M_{pred}/M_{prey})^{-0.25} \end{cases}$$

basic properties

- Rosenzweig-MacArthur's model with predator competition
- with Holling : equiv. to Bazykin's model (1976, Kuznetsov, 2004)
- has 2 trivial equilibria (no predator and with/without prey)

Bifurcations in a predator-prey system

same model $\Rightarrow$ the simplest food web

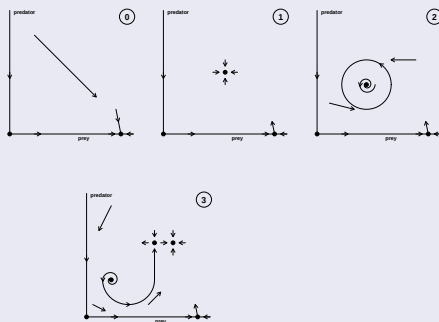
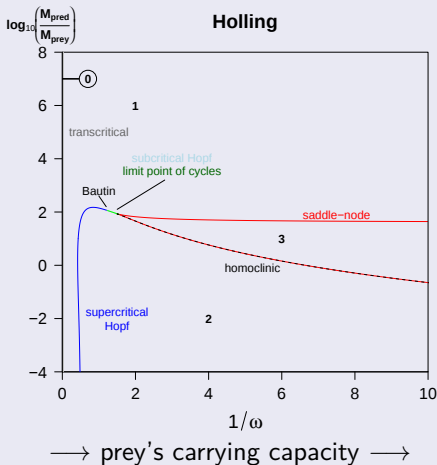
$$\begin{cases} \dot{B}_{prey}(t') &= [\lambda q^\xi - \alpha - \beta \omega B_{prey}] B_{prey} - G^\xi M_{pred}^{0.25} B_{pred} (M_{pred}/M_{prey})^{-0.25} \\ \dot{B}_{pred}(t') &= [\lambda G^\xi M_{pred}^{0.25} - \alpha - \beta B_{pred}] B_{pred} (M_{pred}/M_{prey})^{-0.25} \end{cases}$$

basic properties

- Rosenzweig-MacArthur's model with predator competition
- with Holling : equiv. to Bazykin's model (1976, Kuznetsov, 2004)
- has 2 trivial equilibria (no predator and with/without prey)
- has up to 3 positive equilibria and 2 limit cycles (12 phase portraits)
- exhibits all possible codimension 2 bifurcations in planar systems

Bifurcation diagram with Holling

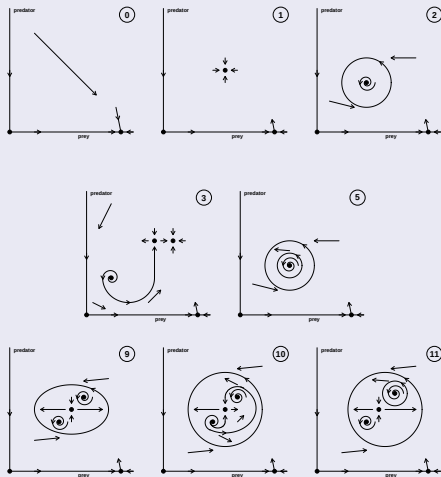
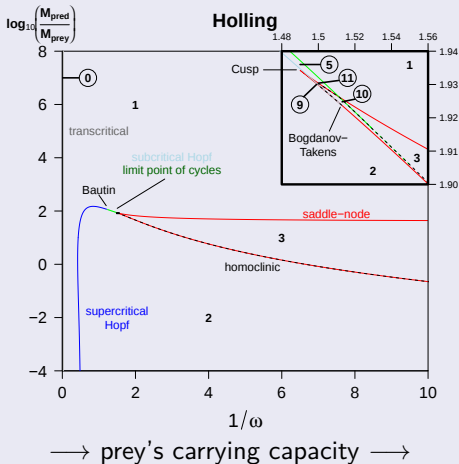
body mass ratio



(modified from Aldebert et al., in press)

Bifurcation diagram with Holling

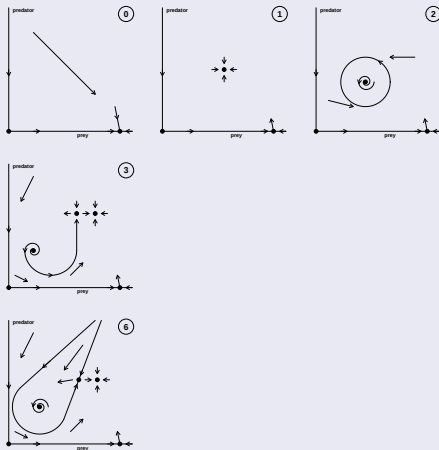
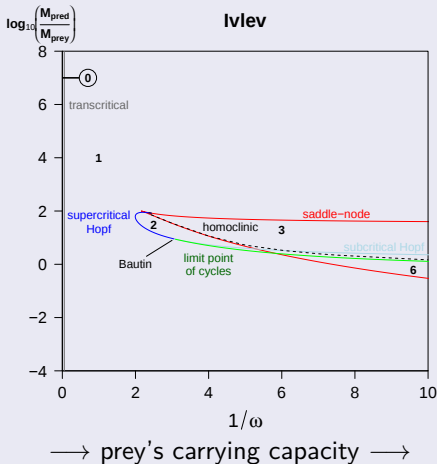
body mass ratio



(modified from Aldebert et al., in press)

Bifurcation diagram with Ivlev

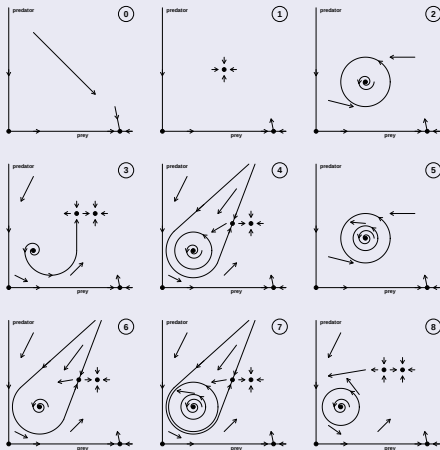
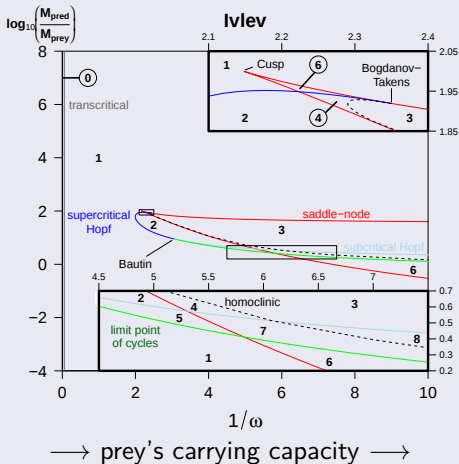
body mass ratio



(modified from Aldebert et al., in press)

Bifurcation diagram with Ivlev

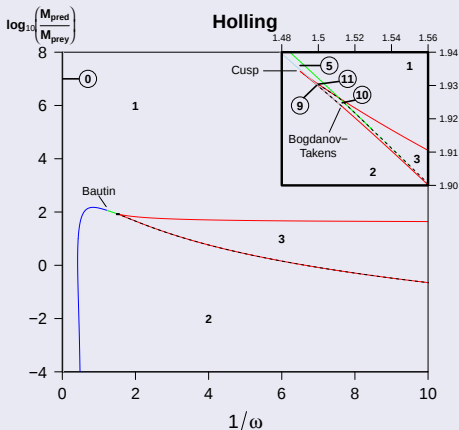
body mass ratio



(modified from Aldebert et al., in press)

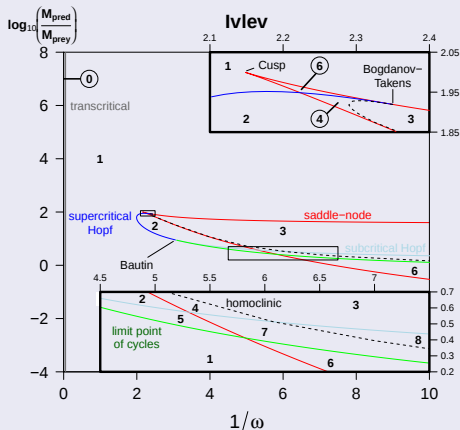
Bifurcation diagram : Holling vs. Ivlev

body mass ratio



→ prey's carrying capacity →

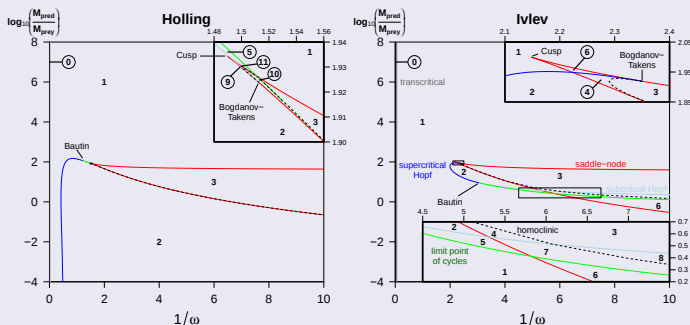
body mass ratio



→ prey's carrying capacity →

(modified from Aldebert et al., in press, in prep.)

Bifurcation diagram : Holling vs. Ivlev

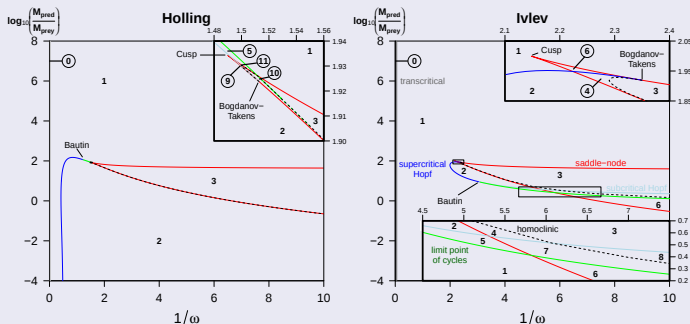


main differences

- stable equilibrium vs stable limit cycle : 26.0 % – 49.4 %
- multiple attractors (up to 3) with Ivlev : 0.1 % – 14.3 %

(modified from Aldebert et al., in press, in prep.)

Bifurcation diagram : Holling vs. Ivlev

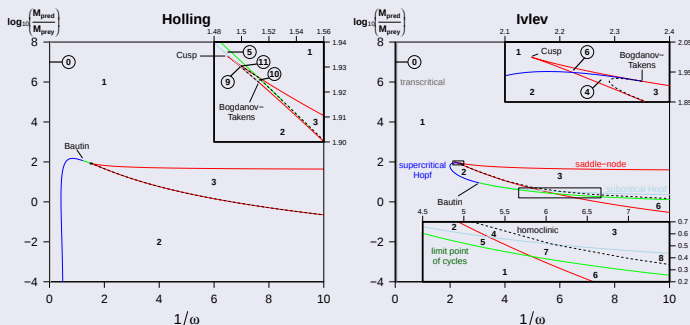


main differences

- stable equilibrium vs stable limit cycle : 26.0 % – 49.4 %
- multiple attractors (up to 3) with Ivlev : 0.1 % – 14.3 %
- mix 80 % Holling + 20 % Ivlev : degenerated Bogdanov-Takens bifurcation

(modified from Aldebert et al., in press, in prep.)

Bifurcation diagram : Holling vs. Ivlev



main differences

- stable equilibrium vs stable limit cycle : 26.0 % – 49.4 %
- multiple attractors (up to 3) with Ivlev : 0.1 % – 14.3 %**
- mix 80 % Holling + 20 % Ivlev : degenerated Bogdanov-Takens bifurcation

(modified from Aldebert et al., in press, in prep.)

Generalized modelling : predator-prey system

general idea

- consider a family of models
- derive the Jacobian matrix

(modified from Aldebert et al., in press)

Generalized modelling : predator-prey system

general idea

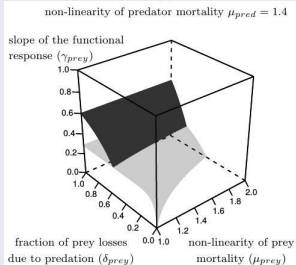
- consider a family of models
- derive the Jacobian matrix
- re-write it with generalized parameters with an ecological meaning (e.g. non-linearity of prey's intrinsic mortality)
- these parameters describe the local behavior near an equilibrium

(modified from Aldebert et al., in press)

Generalized modelling : predator-prey system

general idea

- consider a family of models
- derive the Jacobian matrix
- re-write it with generalized parameters with an ecological meaning (e.g. non-linearity of prey's intrinsic mortality)
- these parameters describe the local behavior near an equilibrium
- for any positive equilibrium of a model : its stability is a function of gen. param.

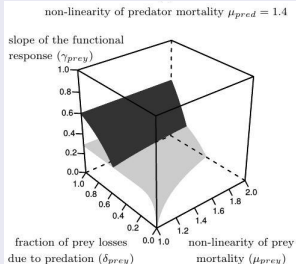


(modified from Aldebert et al., in press)

Generalized modelling : predator-prey system

general idea

- consider a family of models
- derive the Jacobian matrix
- re-write it with generalized parameters with an ecological meaning (e.g. non-linearity of prey's intrinsic mortality)
- these parameters describe the local behavior near an equilibrium
- for any positive equilibrium of a model : its stability is a function of gen. param.

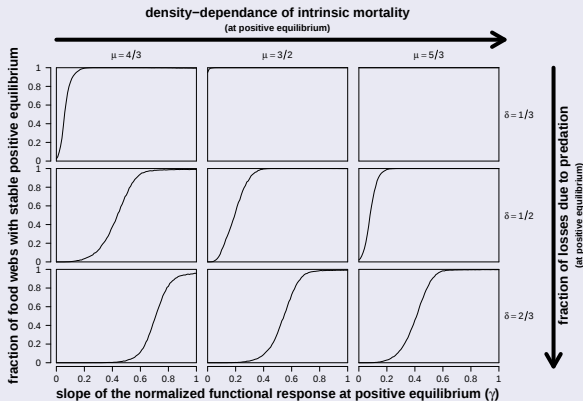


5 parameters, stabilizing factors

- high density-dependent intrinsic mortality, low losses through predation
- high slope of the functional response near equilibrium

(modified from Aldebert et al., in press)

Generalized modelling : food webs

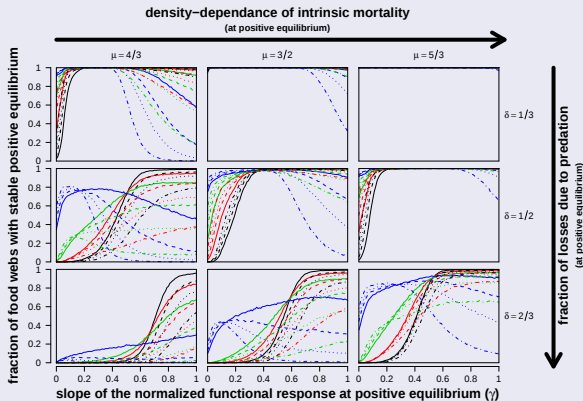


number of species :
20

connectance :
0.10

(modified from Aldebert et al., *subm. rev. b*)

Generalized modelling : food webs

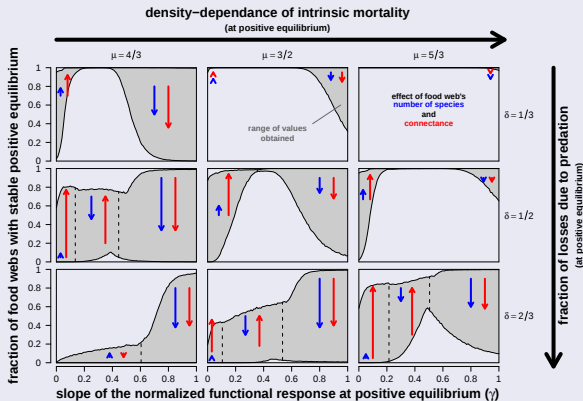


number of species :
20, 30, 40, 60
(line type)

connectance :
0.10, 0.15, 0.20, 0.30
(line color)

(modified from Aldebert et al., *subm. rev. b*)

Generalized modelling : food webs

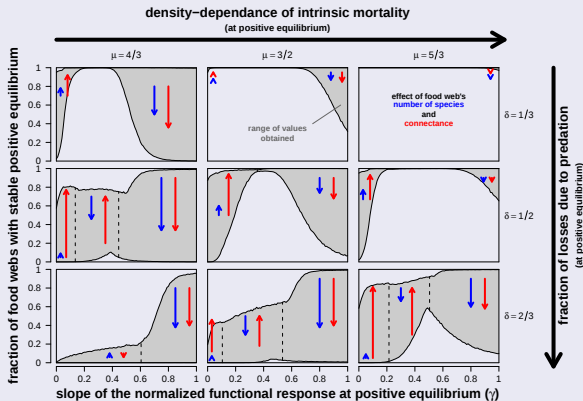


number of species :
20, 30, 40, 60

connectance :
0.10, 0.15, 0.20, 0.30

(modified from Aldebert et al., *subm. rev. b*)

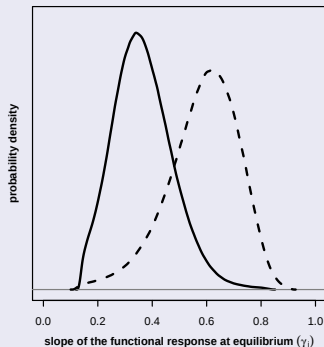
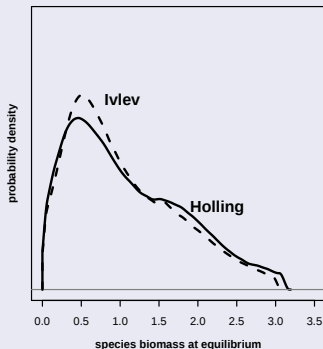
Generalized modelling : food webs



- stabilizing effect of a higher slope of the functional response
- robust to changes in model assumptions (primary production, cannibalism)

(modified from Aldebert et al., *subm. rev. b*)

Generalized parameters as indicators in food webs



food webs at positive equilibrium

- same species biomass and generalized parameters distributions
- except for the slope of the functional response (higher with Ivlev)

(modified from Aldebert et al., *subm. rev. b*)

Structural sensitivity : ongoing works

more physiological details : DEB models

- a family of bi-trophic food chain models (explicit resource) in chemostat

(Aldebert et al., in prep)

Structural sensitivity : ongoing works

more physiological details : DEB models

- a family of bi-trophic food chain models (explicit resource) in chemostat
- “low” sensitivity to the functional response (no qualitative changes)
- qualitative changes seems to occur when less details are considered

(Aldebert et al., in prep)

Structural sensitivity : ongoing works

more physiological details : DEB models

- a family of bi-trophic food chain models (explicit resource) in chemostat
- “low” sensitivity to the functional response (no qualitative changes)
- qualitative changes seems to occur when less details are considered

structural sensitivity quantification

- Cordoleani *et al.* (2011) : compare a distance between models (formulation and/or parameter values) with a distance (Hausdorff) between asymptotic dynamics (1 attractor in each model)

(Aldebert *et al.*, in prep)

Structural sensitivity : ongoing works

more physiological details : DEB models

- a family of bi-trophic food chain models (explicit resource) in chemostat
- “low” sensitivity to the functional response (no qualitative changes)
- qualitative changes seems to occur when less details are considered

structural sensitivity quantification

- Cordoleani *et al.* (2011) : compare a distance between models (formulation and/or parameter values) with a distance (Hausdorff) between asymptotic dynamics (1 attractor in each model)
- extend this approach to deal with multiple attractors
- different metrics underlying different kinds of sensitivity : average futur, dynamical richness, potential for hysteresis phenomena

(Aldebert *et al.*, in prep)

Structural sensitivity : ongoing works

more physiological details : DEB models

- a family of bi-trophic food chain models (explicit resource) in chemostat
- “low” sensitivity to the functional response (no qualitative changes)
- qualitative changes seems to occur when less details are considered

structural sensitivity quantification

- Cordoleani *et al.* (2011) : compare a distance between models (formulation and/or parameter values) with a distance (Hausdorff) between asymptotic dynamics (1 attractor in each model)
- extend this approach to deal with multiple attractors
- different metrics underlying different kinds of sensitivity : average futur, dynamical richness, potential for hysteresis phenomena
- develop an approach (and indicators) to quantify if a given model can be more sensitive to parameter values or formulation

(Aldebert *et al.*, in prep)

Structural sensitivity : ongoing works

more physiological details : DEB models

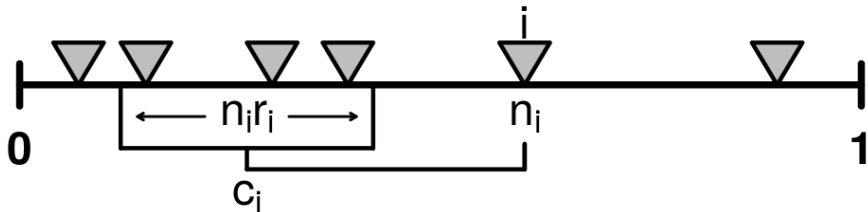
- a family of bi-trophic food chain models (explicit resource) in chemostat
- “low” sensitivity to the functional response (no qualitative changes)
- qualitative changes seems to occur when less details are considered

structural sensitivity quantification

- Cordoleani *et al.* (2011) : compare a distance between models (formulation and/or parameter values) with a distance (Hausdorff) between asymptotic dynamics (1 attractor in each model)
- extend this approach to deal with multiple attractors
- different metrics underlying different kinds of sensitivity : average futur, dynamical richness, potential for hysteresis phenomena
- develop an approach (and indicators) to quantify if a given model can be more sensitive to parameter values or formulation

(Aldebert *et al.*, in prep)

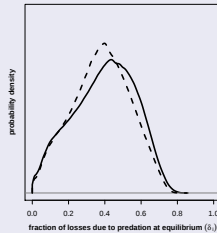
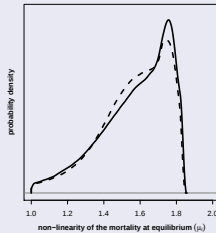
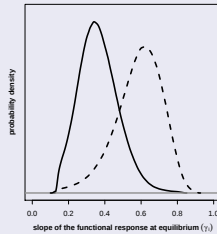
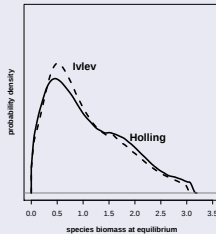
The niche model (*Williams & Martinez, 2000, 2004*)



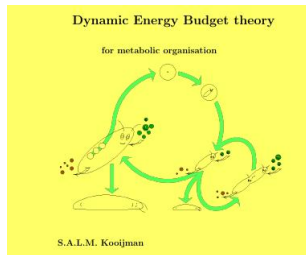
based on the principle of ecological niche (*Hutchinson, 1957*)

- the segment $[0, 1]$ summarizes the ∞ -dimensional niche space
- the niche indice n_i summarizes species i 's ecological niche
- the relative width of species i 's feeding range r_i depends on connectance
- c_i is the center of species i 's feeding range
- species i feeds on all species who belong to its feeding range $[c_i \pm \frac{n_i r_i}{2}]$
- species with an empty feeding range are defined as primary producers
- more complex models (e.g. with $\pm$ discontinuous feeding range) are based on the niche model

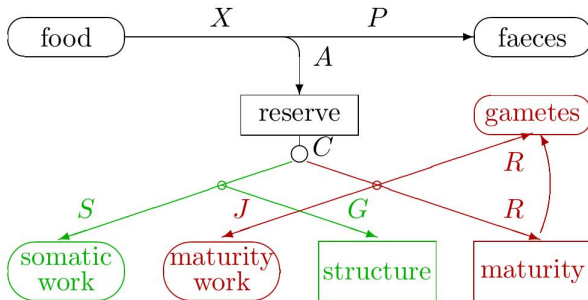
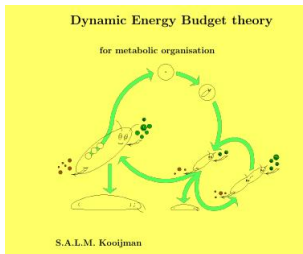
Generalized modelling : food webs



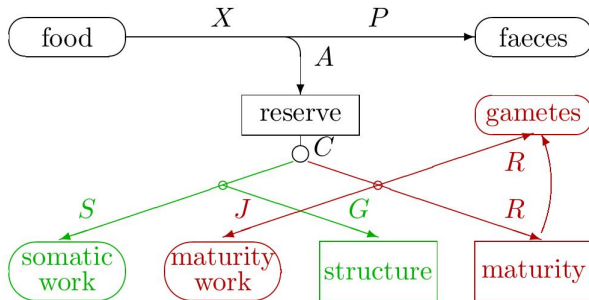
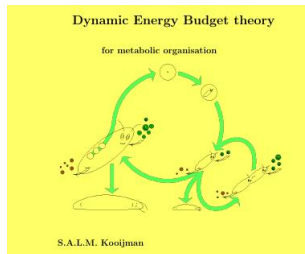
Dynamic Energy Budgets theory



Dynamic Energy Budgets theory

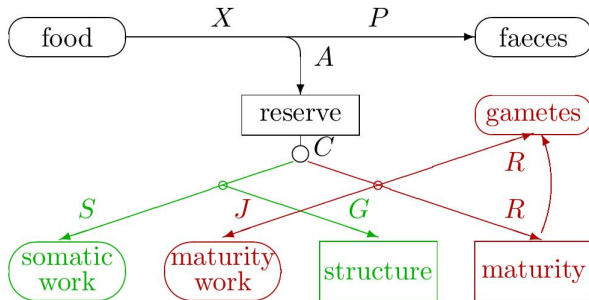
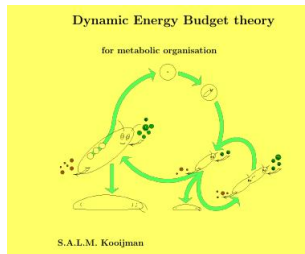


Dynamic Energy Budgets theory



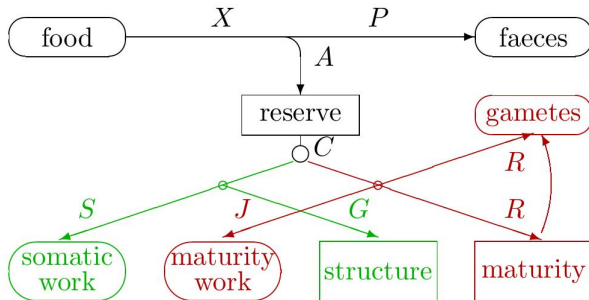
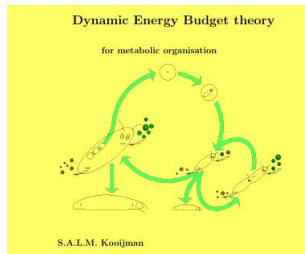
- focus on the individual, based on mechanistic assumptions on metabolism

Dynamic Energy Budgets theory



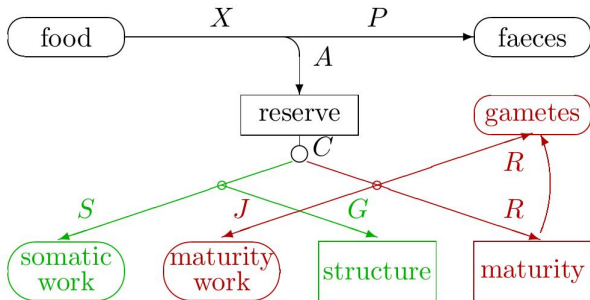
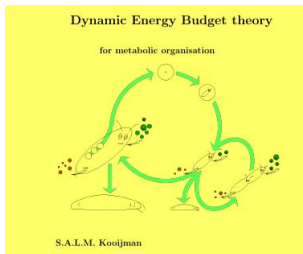
- focus on the individual, based on mechanistic assumptions on metabolism
- same framework for most species, metabolic classification of species

Dynamic Energy Budgets theory



- focus on the individual, based on mechanistic assumptions on metabolism
- same framework for most species, metabolic classification of species
- theory allows to build more or less detailed models within a coherent theoretical framework

Dynamic Energy Budgets theory



- focus on the individual, based on mechanistic assumptions on metabolism
- same framework for most species, metabolic classification of species
- theory allows to build more or less detailed models within a coherent theoretical framework
- unicellular organisms : upscaling to population dynamics is easy

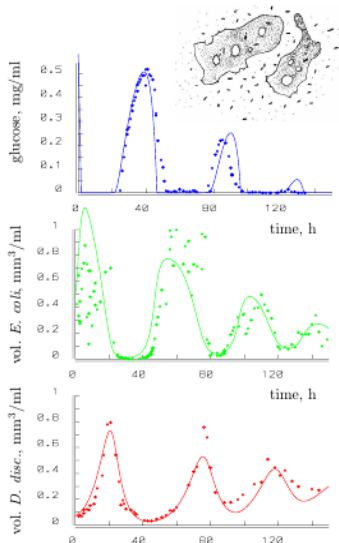
DEB model for a bitrophic food chain in chemostat

(data from Dent *et al.*, 1976; model from Kooi & Kooijman, 1994) (fig 9.15, p 358)

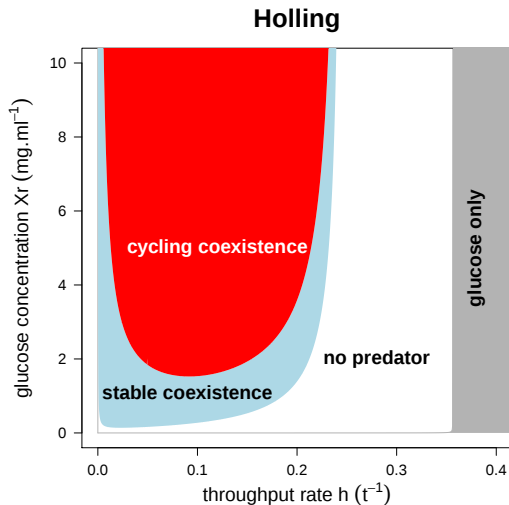
$X_0(0)$	0.433		mg ml ⁻¹
$X_1(0)$	0.361	$X_2(0)$	0.084 mm ³ ml ⁻¹
$e_1(0)$	1	$e_2(0)$	1
K_1	0.40	K_2	0.18
g_1	0.86	g_2	4.43
k_M^1	0.008	k_M^2	0.16
k_E^1	0.67	k_E^2	2.05
j_{XAm}^1	0.65	j_{XAm}^2	0.26
			$\frac{\mu\text{g}}{\text{ml}}, \frac{\text{mm}^3}{\text{ml}}$
			h^{-1}
			$\frac{\text{mg}}{\text{mm}^3 \text{ h}}, \text{h}^{-1}$

$$\begin{aligned} \frac{d}{dt}e_1 &= k_E^1(f_1 - e_1); \quad f_1 = \frac{X_0}{K_1 + X_0} \\ \frac{d}{dt}e_2 &= k_E^2(f_2 - e_2); \quad f_2 = \frac{X_1}{K_2 + X_1} \\ \frac{d}{dt}X_0 &= \dot{h}(X_r - X_0) - f_1 j_{XAm}^1 X_1 \\ \frac{d}{dt}X_1 &= \left(\frac{k_M^1 e_1 - k_M^1 g_1}{e_1 + g_1} - \dot{h} \right) X_1 - f_2 j_{XAm}^2 X_2 \\ \frac{d}{dt}X_2 &= \left(\frac{k_M^2 e_2 - k_M^2 g_2}{e_2 + g_2} - \dot{h} \right) X_2 \end{aligned}$$

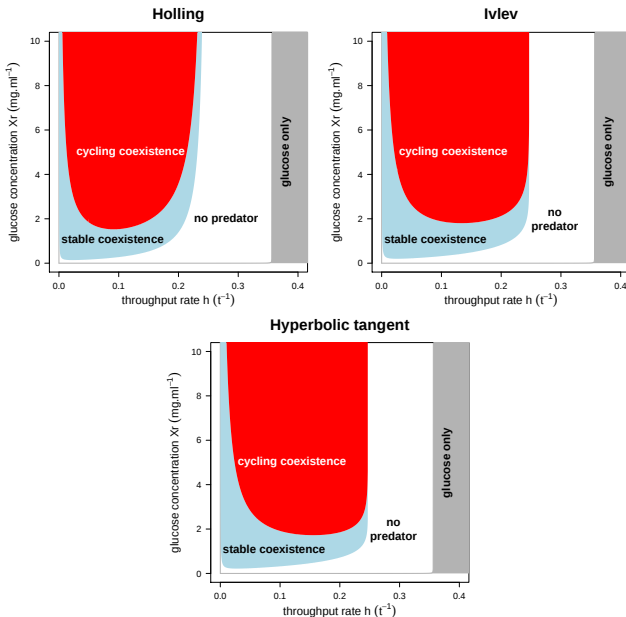
V1-morph, $\kappa \rightarrow 1$, predator feed on prey's structure, fixed environment



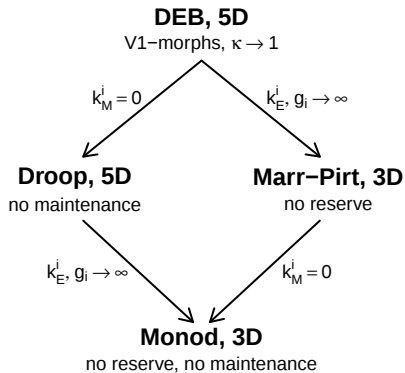
Structural sensitivity in this DEB model



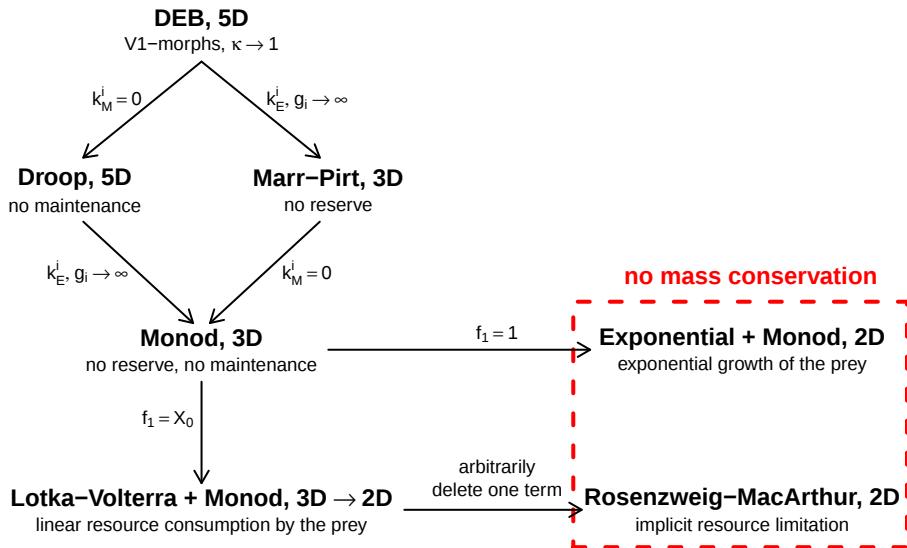
Low structural sensitivity in this DEB model



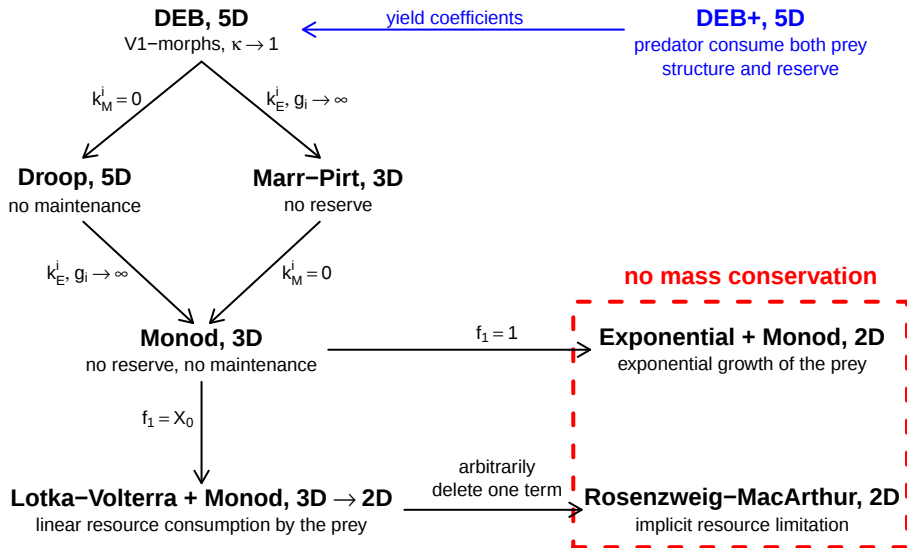
A family tree of DEB models



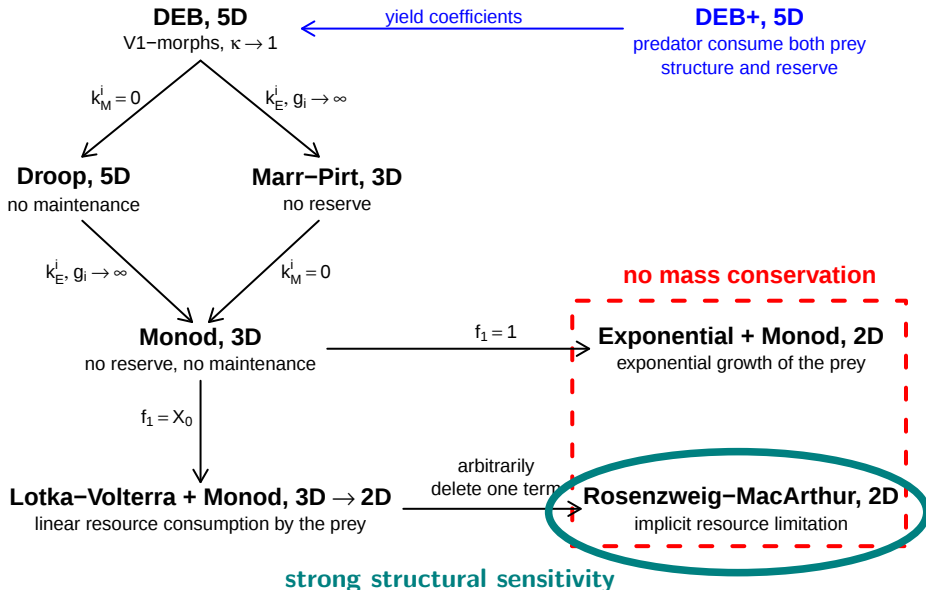
A family tree of DEB models



A family tree of DEB models



A family tree of DEB models



A family tree of DEB models

