

# Nonlinear Dynamics of Complex Ecological Networks (aka food webs) I: Theory

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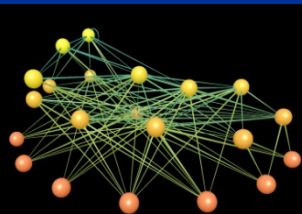
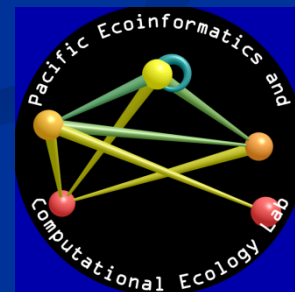
Microsoft Research Cambridge

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[www.FoodWebs.org](http://www.FoodWebs.org)



# Outline

- | Introduction to food webs
- | Why we study food webs
  - | Relationships of diversity and complexity to stability
- | What we have learned about their structure
  - | Niche Model
- | What we have learned about their dynamics
  - | Structure function relationships
- | How can such understanding be applied
  - | Species loss



# Food Webs: Why?

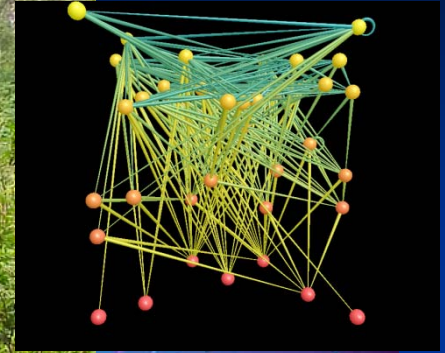
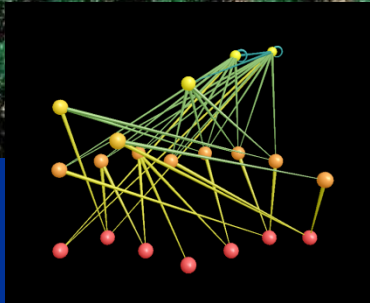
- Generality
  - Incorporates the vast majority of organisms
    - species and biomass
  - Includes the all habitats
    - aquatic, terrestrial, soil, endolythic, hyporeic.
    - substrate bound, free floating
- Basic ecological laws (assumptions):
  - During life, biomass is always created and destroyed.
  - continuous energy consumption and expenditure required
  - All heterotrophs need to eat to live
    - autotrophs are ultimately the only source of food.
- Species' reproductive units share feeding potential
  - evolution

# Darwin's *Origin of Species* (1859)

It is interesting to contemplate a tangled bank,  
clothed with many plants of many kinds,  
with birds singing on the bushes,  
with various insects flitting about,  
and with worms crawling through the damp earth,  
and to reflect that these elaborately constructed forms,  
so different from each other,  
and dependent upon each other in so complex a manner,  
have all been produced by laws acting around us.



Early paradigm: complex  
communities are more stable  
than simple ones (Odum 1953,  
MacArthur 1955, Elton 1958)



Less invasions,  
less species turnover,  
less calamities,...

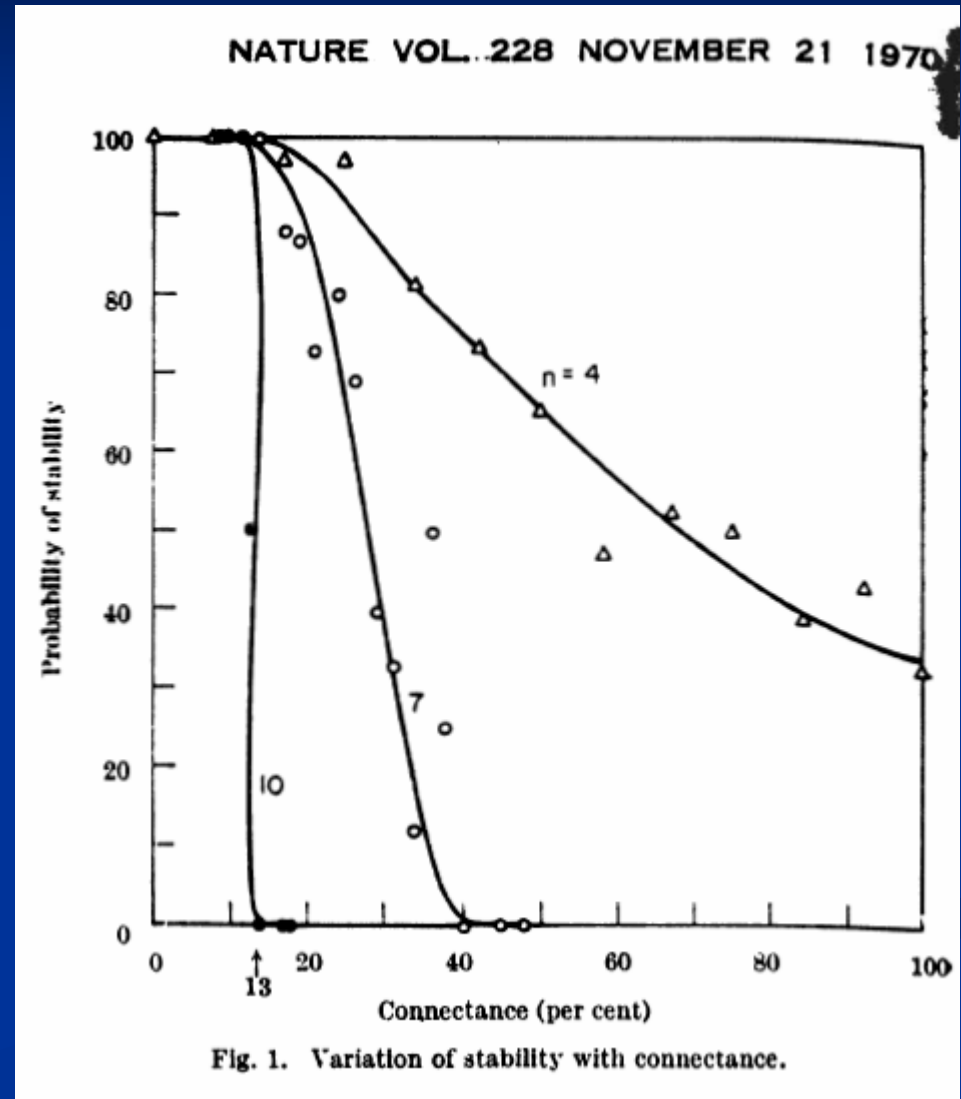


# Change of paradigm: Unstable complex systems

Mathematically, stability  
decreases with system  
diversity (species) and  
complexity (interactions)

Gardner & Ashby 1970 *Nature*  
Biological Computer Laboratory  
University of Illinois

May 1972 *Nature*: Will a Large  
Complex System be Stable



# Diversity-Stability & Connectance

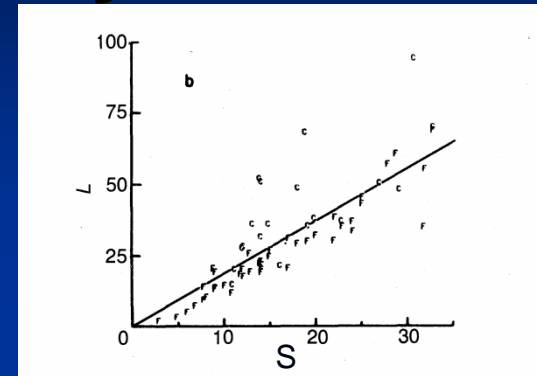
- | MacArthur: Diversity enhances stability via increased complexity (Links per Species)
- | May: Complexity inhibits stability:  $i(SC)^{1/2} < 1$ 
  - “elucidate the devious strategies which make for stability in enduring natural systems”
- |  $C = L/S^2$ ;  $(SC) = L/S$ ,  $L$  = Directed Trophic Links



# Diversity & Complexity

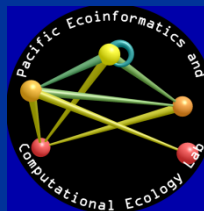
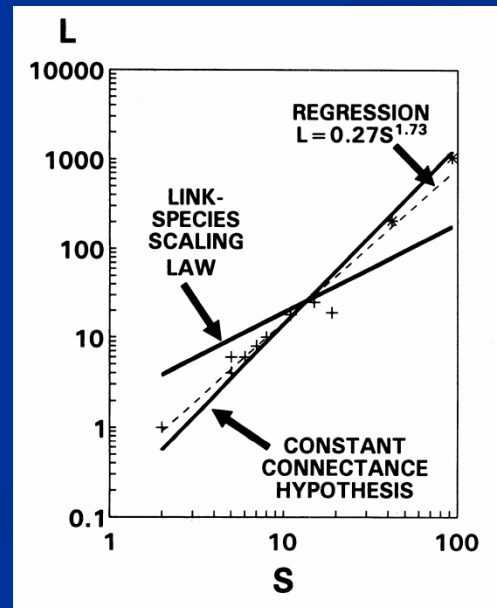
## Link-species Scaling Law $L/S = 2$

Cohen & Brian 1984 *PNAS*



## Constant Connectance Hypothesis $L/S^2 = k$

- Martinez 1992
- *American Naturalist*





# Constant Connectance ( $L/S^2$ ): $S$ is orthogonal to $L/S^2$

- | Taxonomic webs

- | Slope = 2.01

- |  $R^2 = 93\%$

- | Trophic webs

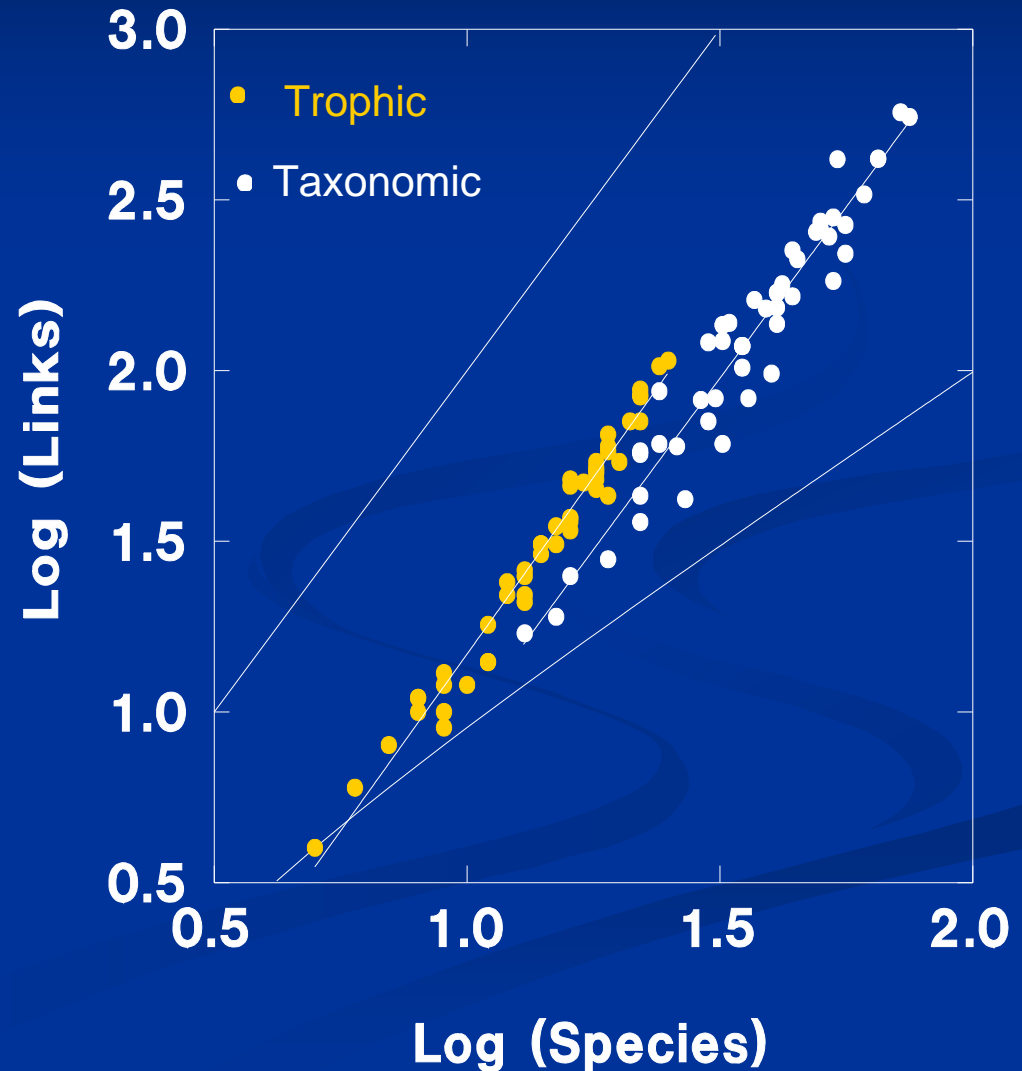
- | Slope = 2.07

- |  $R^2 = 97\%$

2 Versions of Havens'  
50 Pelagic Food Webs

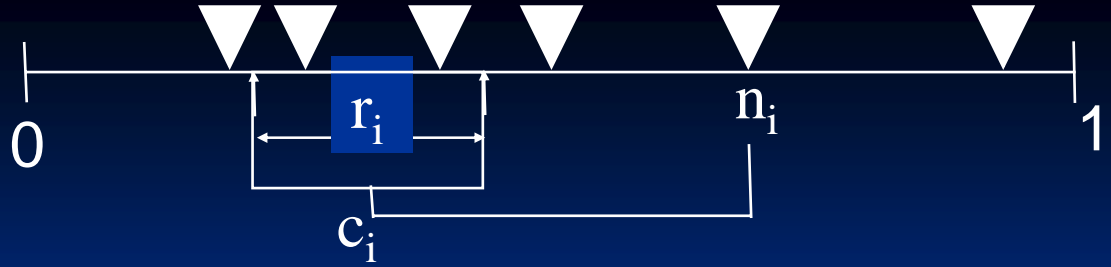
Martinez *Science* 1993.

Srinivasan, Dunne, Harte  
& Martinez *Ecology* 2007



# Niche Model

## Final Step 3

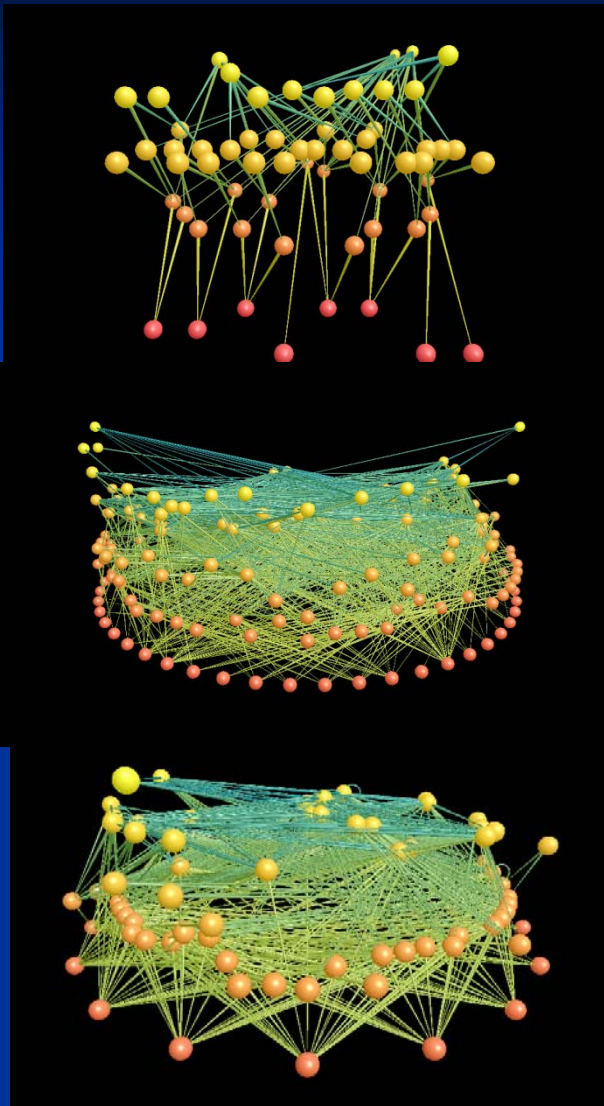


- Step 1: Each species gets uniform random  $n_i$
- Step 2: Each species gets beta random  $r_i$
- Step 3: Each niche range is placed by uniformly choosing a random range center ( $c_i$ ) so that  $r_i/2 < c_i < n_i$
- Establishes relaxed trophic hierarchy while allowing cannibalism and looping

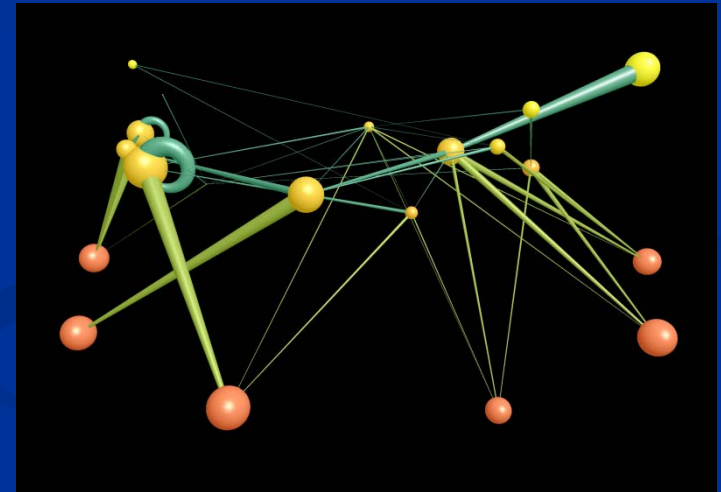


# So what?

- Identified precisely predictable generalities in the trophic architecture among species.
  - virtually all ecosystems share remarkable regularities in how species divvy up feeding within habitats
- Need to explore the functional consequences of these patterns.
- Exploration #1: interaction between network structure and dynamics.



How can  
we model dynamics?



# Nonlinear bioenergetic ecosystem model

The variation of  $B_i$ , the biomass of species  $i$ , is given by:

$$\underbrace{B_i'(t)}_{\substack{\text{Rate of change} \\ \text{in biomass}}} = \underbrace{G_i(B)}_{\substack{\text{Production rate} \\ \text{if species } i \text{ is basal}}} - \underbrace{x_i B_i(t)}_{\substack{\text{Loss of biomass} \\ \text{to metabolism}}} + \sum_{j=1}^n \left( \underbrace{x_i y_{ij} \alpha_{ij} F_{ij}(B) B_i(t)}_{\substack{\text{Gain of biomass} \\ \text{from resource spp.}}} - \underbrace{x_j y_{ji} \alpha_{ji} F_{ji}(B) B_j(t) / e_{ji}}_{\substack{\text{Loss of biomass to} \\ \text{consumer spp.}}} \right)$$

**What factors allow persistence of species in  
dynamical models of complex food webs?  
(the “devious strategies”)**



$$\begin{array}{l} \text{Rate of change} \\ \text{in biomass} \end{array} = \begin{array}{l} \text{Production rate} \\ \text{of basal spp.} \end{array} - \begin{array}{l} \text{Loss of biomass} \\ \text{to metabolism} \end{array} + \left( \begin{array}{l} \text{Gain of biomass} \\ \text{from resource spp.} \end{array} - \begin{array}{l} \text{Loss of biomass to} \\ \text{consumer spp.} \end{array} \right)$$

$$B_i'(t) = G_i(B) - x_i B_i(t) + \sum_{j=1}^n \left( x_i y_{ij} \alpha_{ij} F_{ij}(B) B_i(t) - x_j y_{ji} \alpha_{ji} F_{ji}(B) B_j(t) / e_{ji} \right)$$

### 3 species parameters:

$G_i(B)$  : production rate of basal species  $i$  (Mass/Time)

For primary producers,  $G_i(B) = r_i B_i(t) (1 - B_i(t) / K_i)$ , where

$r_i$  : intrinsic growth rate of species  $i$  (1/Time)

$K_i$  : carrying capacity of species  $i$  (Mass)

$x_i$  : mass-specific metabolic rate of species  $i$  (Mass/Time \* 1/Mass)

### 4 species interaction parameters:

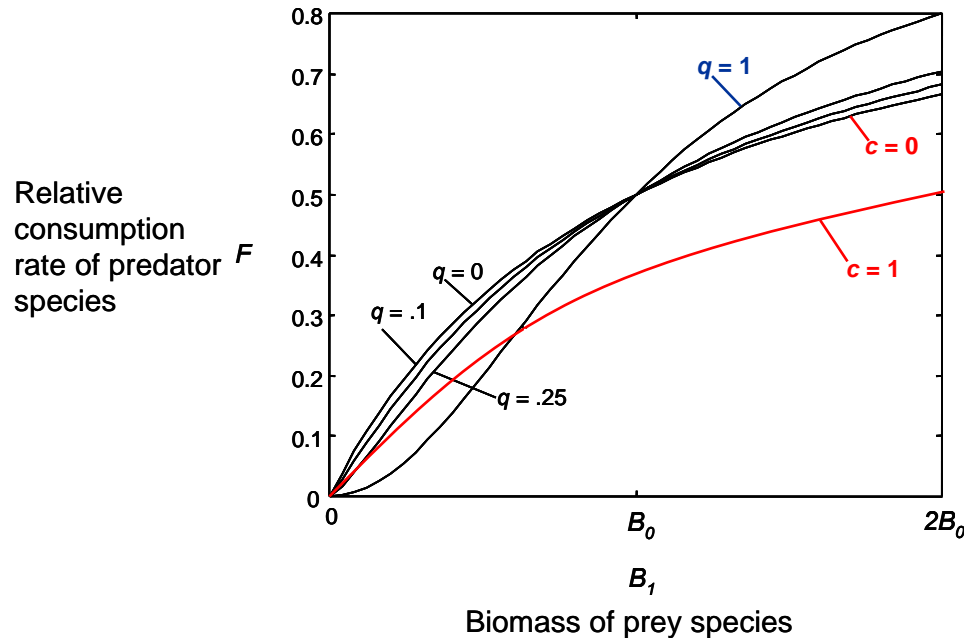
$e_{ji}$  : assimilation efficiency of species  $j$  consuming species  $i$  (fraction of biomass)

$y_{ij}$  : rate of maximum biomass gain by species  $i$  consuming  $j$  normalized by metabolic rate of species  $i$  (Mass/Time / Mass/Time)

$\alpha_{ij}$  : relative preference of species  $i$  for species  $j$  (fraction of diet)  
( $\alpha_{ij} = 0$  for producers and sums to 1 for consumers)

$F_{ij}(B)$  : non-dimensional functional response (based on parameters  $q$  or  $c$ )  
(relative consumption rate of predator species  $i$  consuming prey species  $j$   
as a fraction of the maximum ingestion rate; function of species' biomass)

## Gradation from Type II to Type III Functional Response



Addition of Predator Interference to Type II Functional Response:

$$F_{ij}(B) = \frac{B_j(t)^{1+q_{ij}}}{\sum_{k=1}^n \alpha_{ik} B_k(t)^{1+q_{ij}} + B_{0ji}^{1+q_{ij}}}$$

$\alpha$ : relative prey preference of predator species

$B$ : biomass

$B_0$ : half saturation density of prey species when consumed by predator species

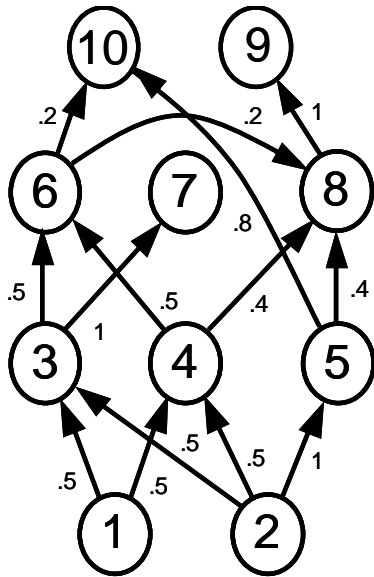
$q$ : controls form of functional response

$q = 0$  (Type II)

$q = 1$  (Type III)

$$F_{ij}(B) = \frac{B_j(t)}{\sum_{k=1}^n \alpha_{ik} B_k(t) + (1 + c_{ij} B_i(t)) B_{0ji}}$$

# 10-species dynamics & functional response

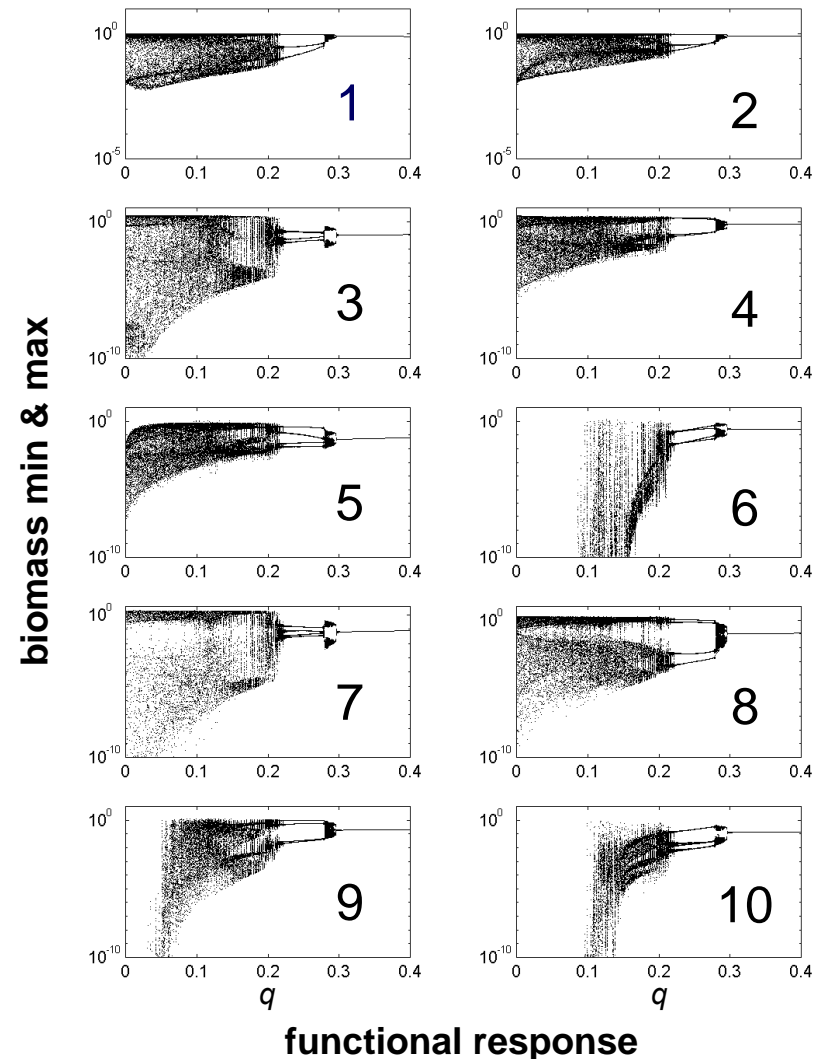


Strong Type II FR  
may stress dynamics  
by increasing feeding  
on rarer species while  
decreasing it on more  
abundant species.

At  $q = 0$  (conventional strong Type II response),  
only 4 taxa display persistent dynamics.

At  $q > 0.15$  (very weak Type III response),  
all 10 taxa are persistent.

At  $q > 0.3$  (weak Type III response),  
all 10 taxa are steady-state.





Generate binary network with structural network model



Scale biological rates with negative quarter power-law



Parameterize network model of population dynamics

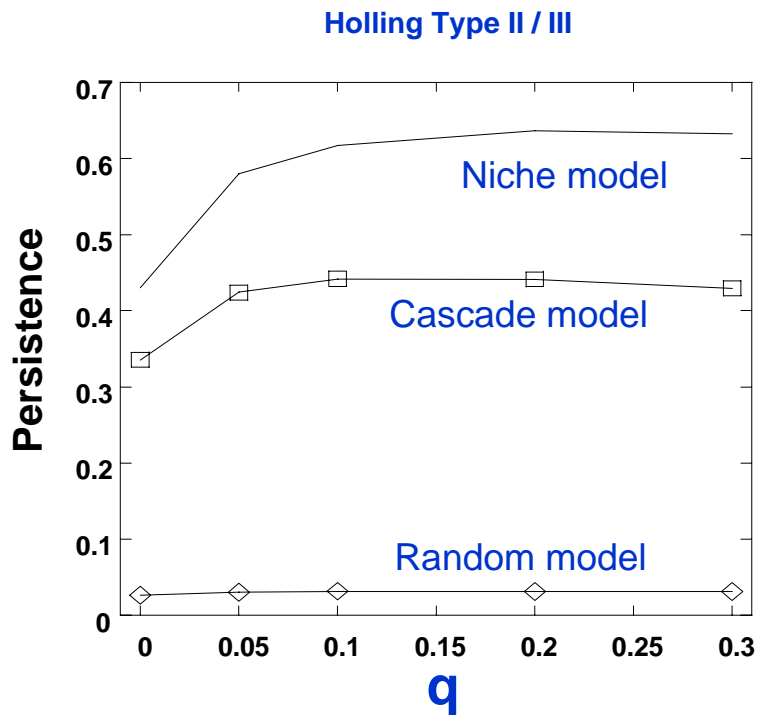


Simulate nonlinear population dynamics

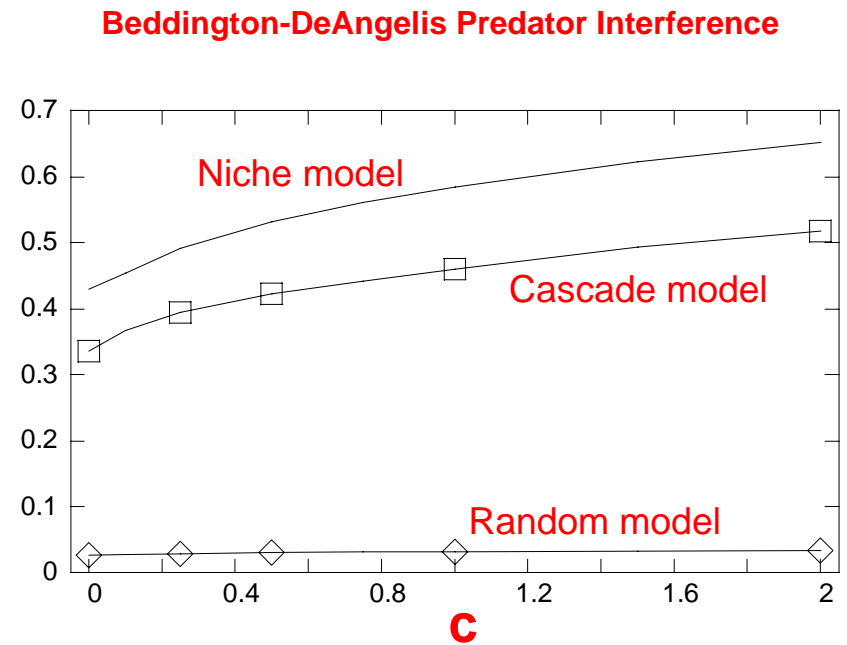


Measure stability as probability of species persistence

# Stabilization of Dynamics of Ecological Networks ( $S=30$ , $C=0.15$ ) with Functional Responses



↖ Effects of Structure on Dynamics ↗

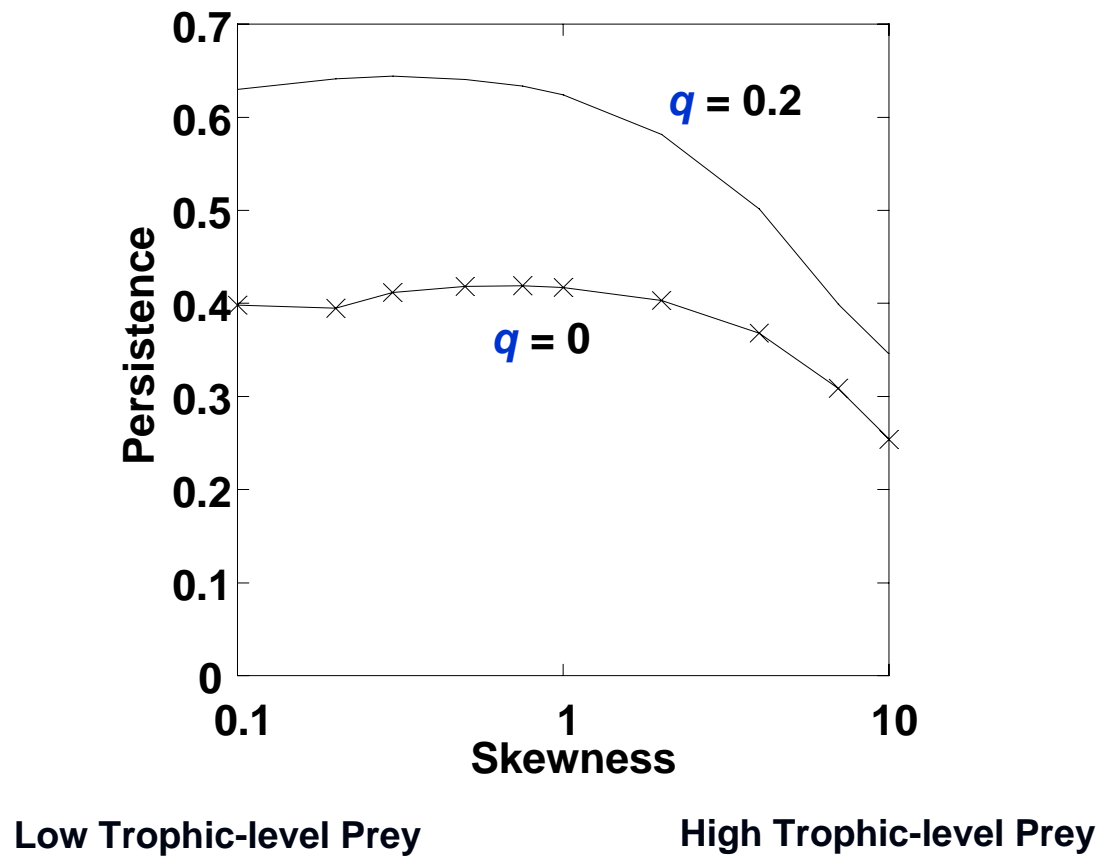


← Effects of Dynamics on Structure →

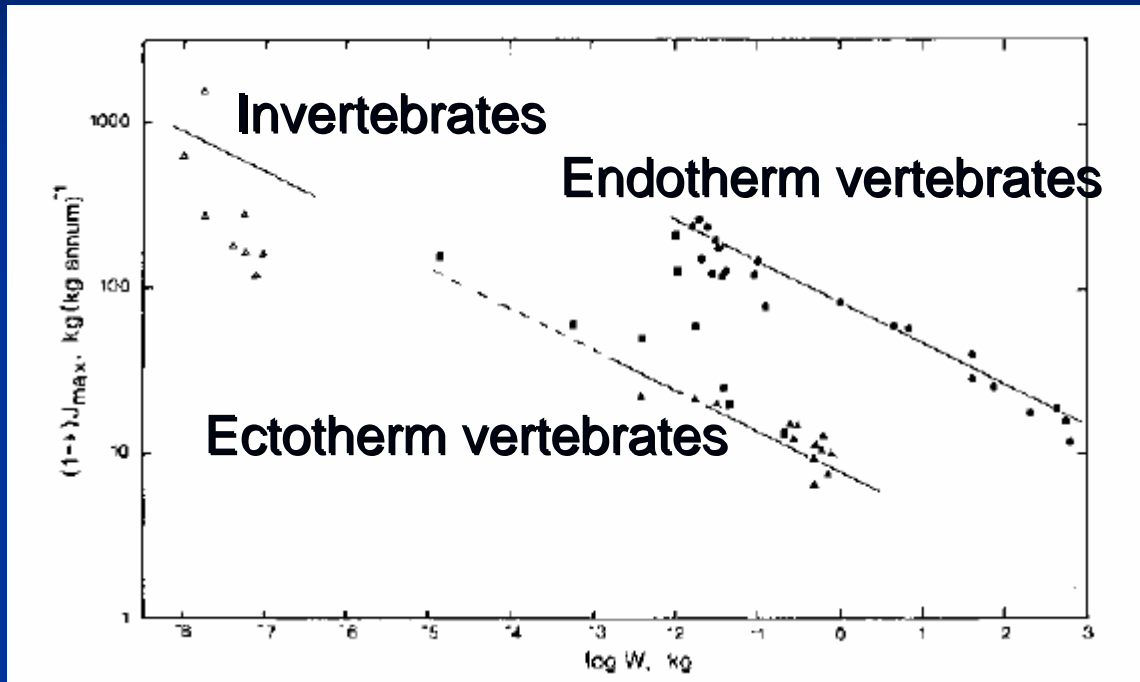




# Effects of Omnivore Feeding Preference among Trophic Levels



# Power law allometric scaling relationships

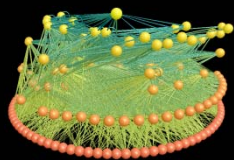


Different metabolic types of species:

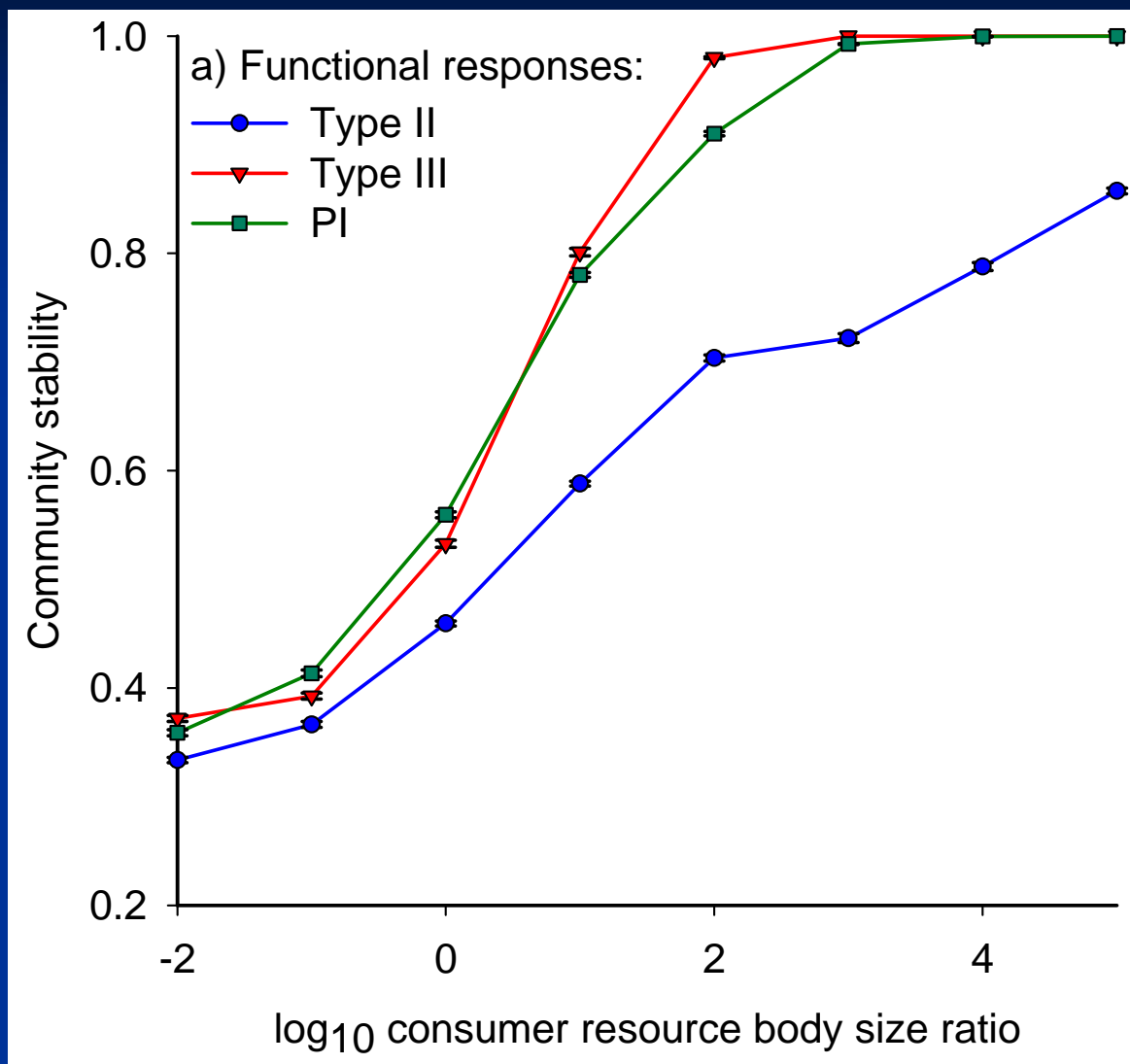
- same -0.25 exponent
- different constants

From: Yodzis & Innes  
1992 *Am. Nat.*

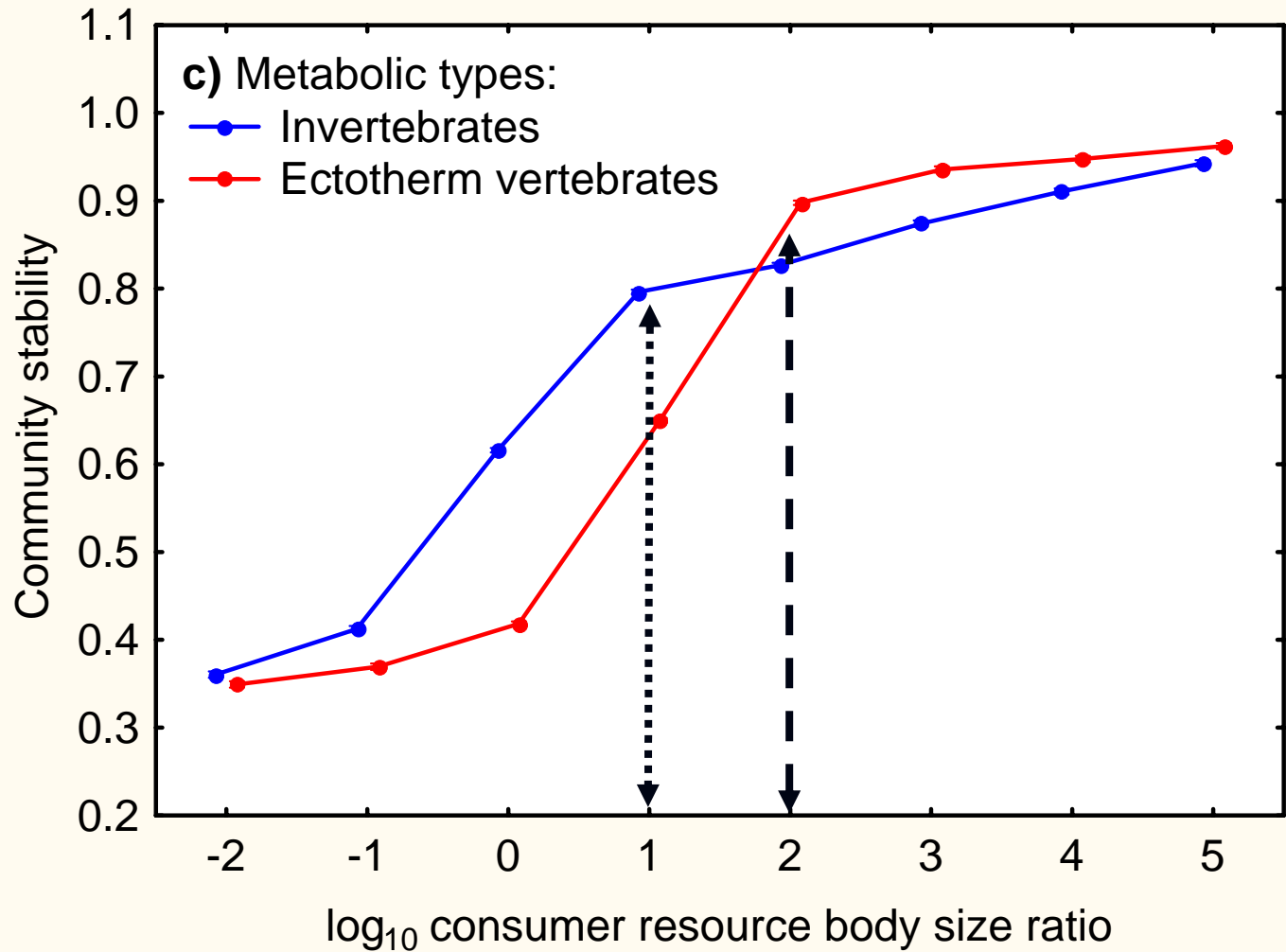
Biological rates scale with a negative quarter power-law with species' body masses (West et al. 1997 *Science*, Enquist et al. 1999 *Nature*, West et al 1999 *Nature*)



# Complex ecological networks



**Results qualitatively robust to variation in Functional Responses**

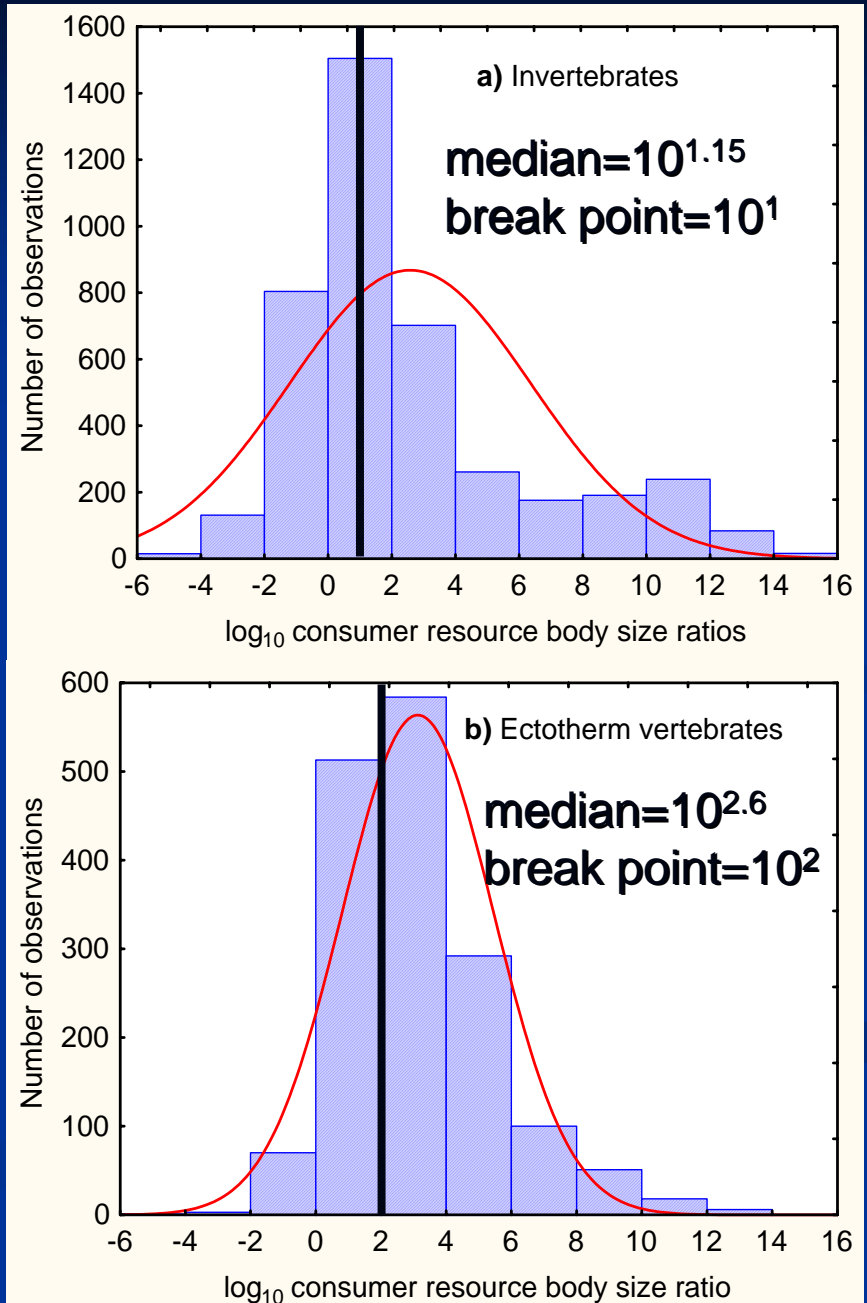




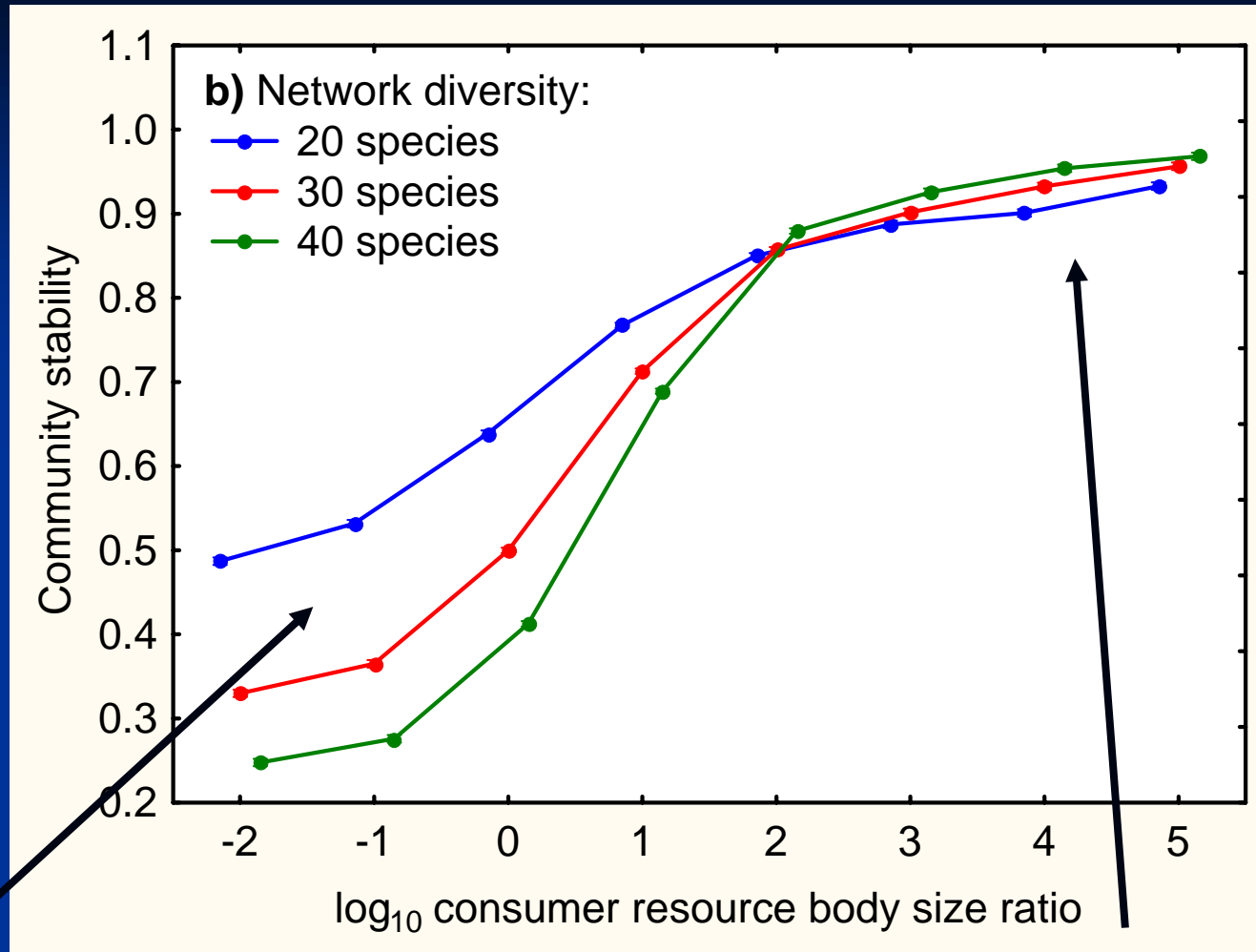
Global data base on  
natural body size ratios

Data for 3887 invertebrate  
predators and 1501  
ectotherm vertebrate  
predators

Geometric mean body size  
ratios are above break  
points

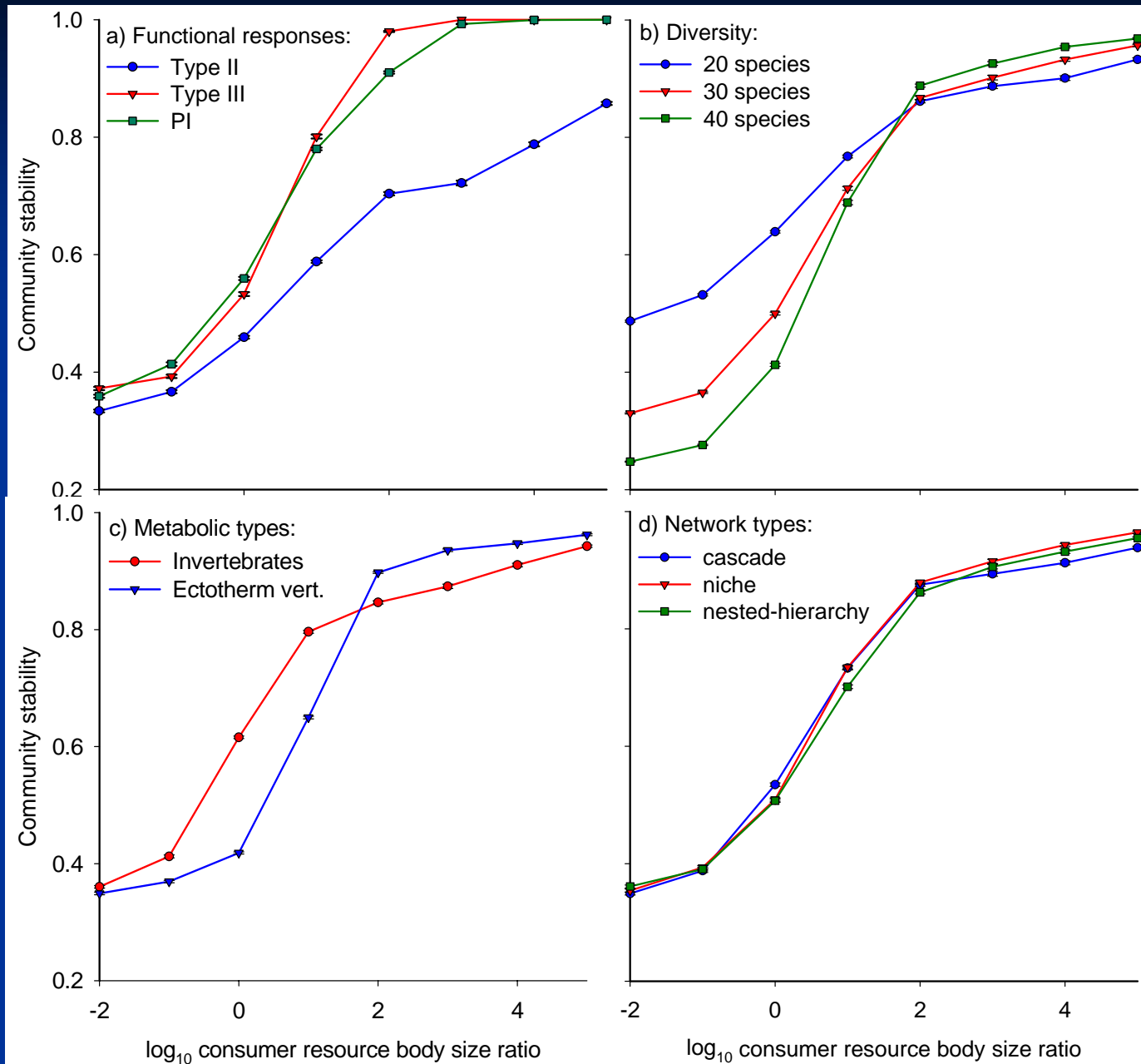


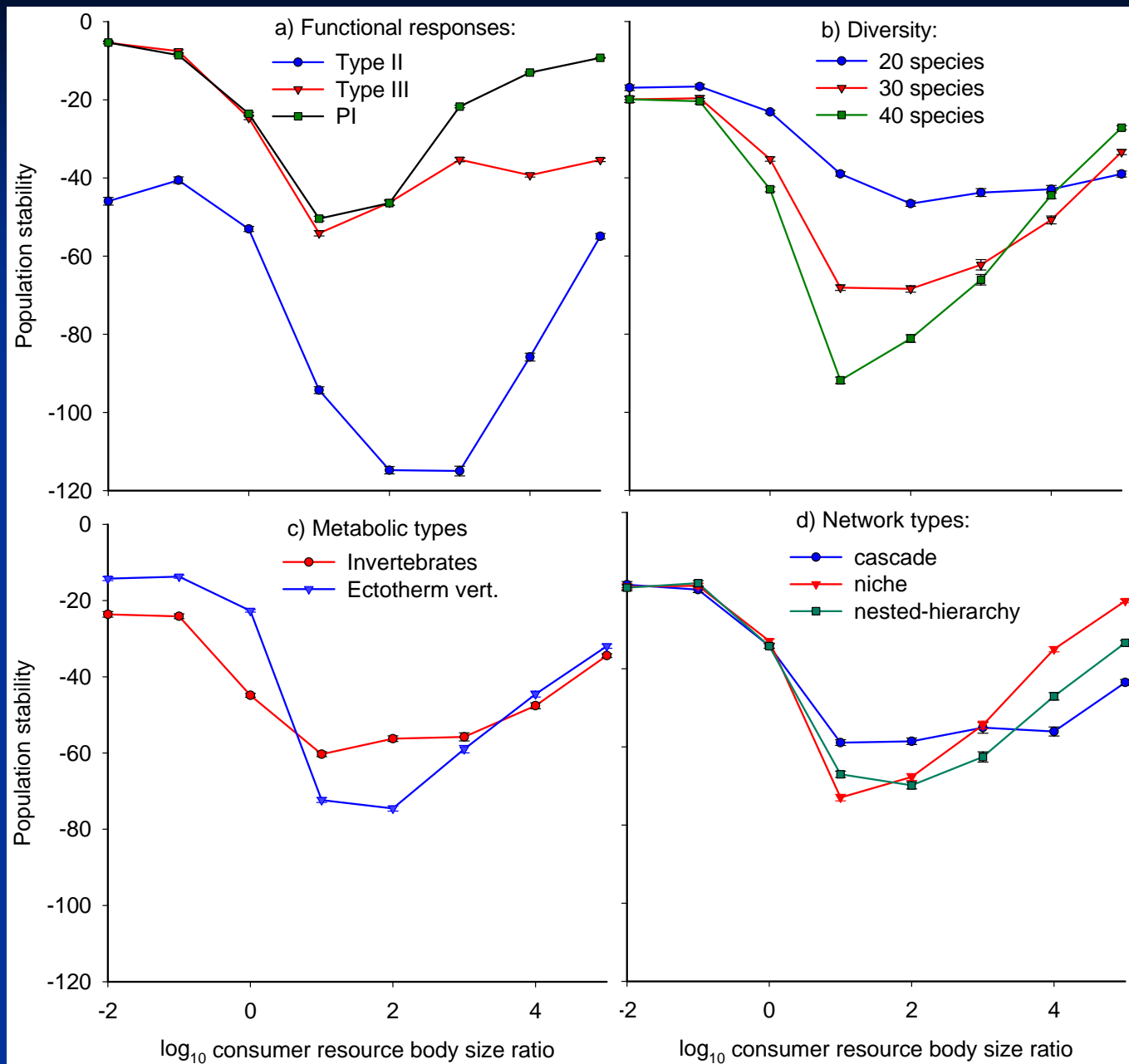




Negative diversity stability  
relationships under uniform  
body size distributions

Positive diversity stability  
relationships under natural  
body size distributions





DEVIOUS STRATEGIES CONTINUED:

# **ALLOMETRIC DEGREE DISTRIBUTIONS**



# **“Devious Strategies” that increase overall species persistence**

- **Non-random network topology**
  - especially empirically well-corroborated niche model structure
- **Non-type II functional responses**
  - stabilizes chaotic & cyclic dynamics
  - more ecologically plausible & empirically supported
- **Consumption weighted to low trophic levels**
  - eat low on the food chain!
- **Predator/prey body-size ratios**
- **Allometric Degree Distributions**