

# Sustaining Ecological Networks and their Services:

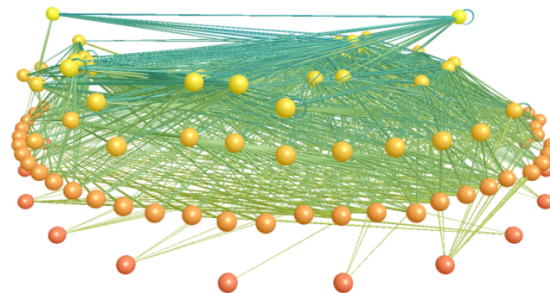
## Network theory of biodiversity and ecosystem function

**Neo D. Martinez**

**Pacific Ecoinformatics and Computational Ecology Lab**

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

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# www.FoodWebs.org

**Eric Berlow**  
Univ. of Cal., Merced



**Ulrich Brose**  
Georg-August-U. Göttingen



**Jennifer Dunne**  
Santa Fe Institute



**Neo Martinez**  
Pacific Ecoinformatics &  
Computational Ecology Lab



**Tamara Romanuk**  
Dalhousie University



**Rich Williams**  
Microsoft Research



**Ilmi Yoon**  
San Francisco State U.



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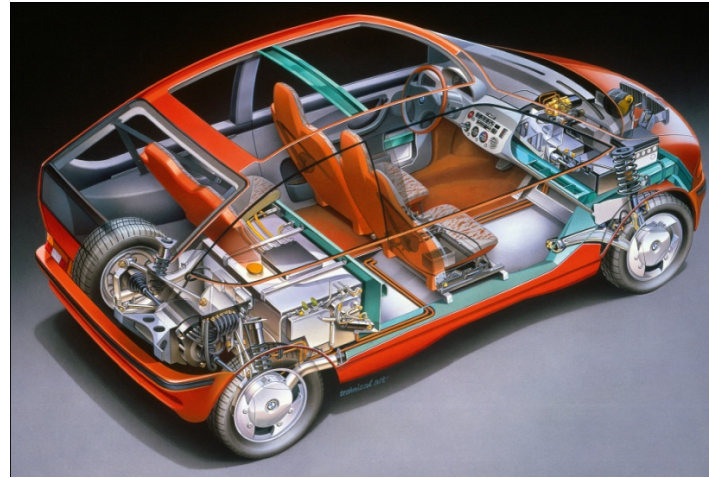
# Darwin's *Origin of Species* (1859)

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.*

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Towards  
a theory  
of  
diversity  
and  
system  
function

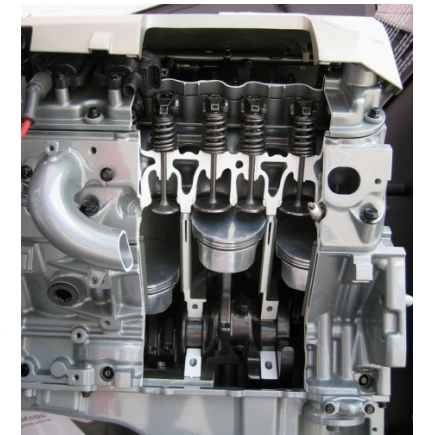
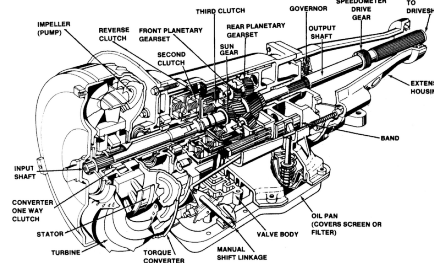
components



Modules/communities

Knowledge:

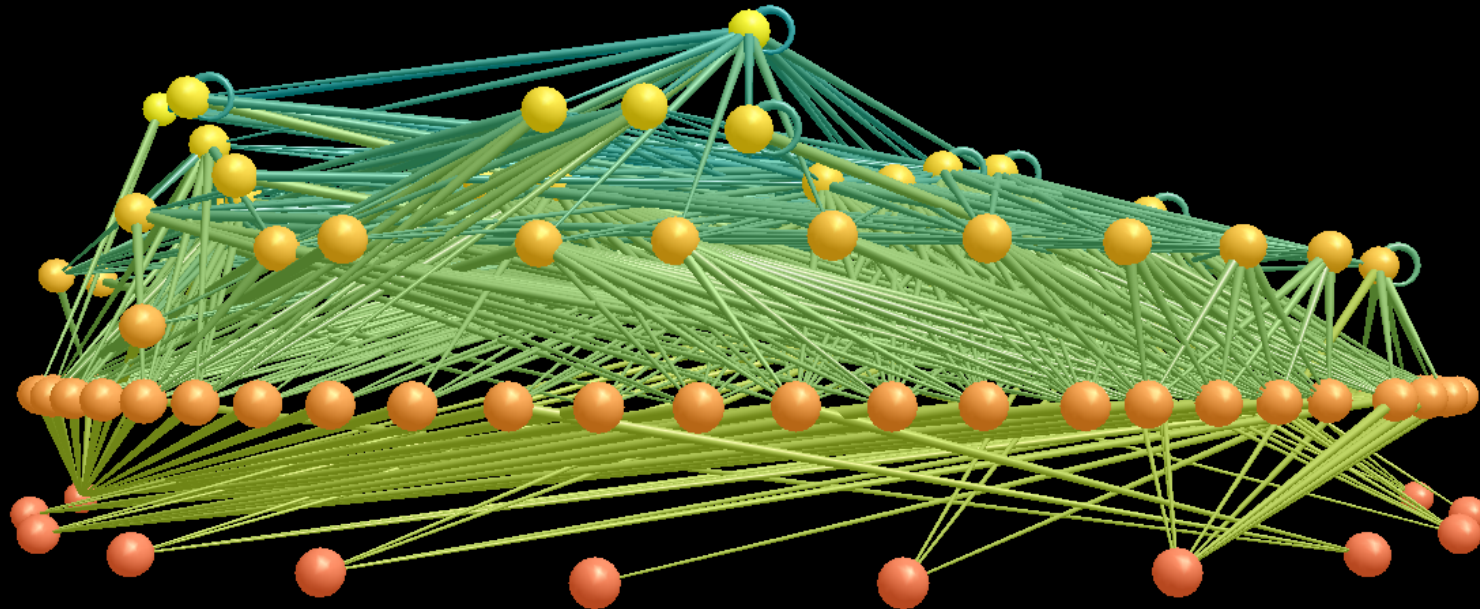
- informs operator
- role of parts
- consequence of loss
- implications of change





# Food-web theory of Biodiversity and Ecosystem function

“Dominant Processes governing biodiversity”  
Consumer-resource interactions  
Network Structure and Function



Martinez (1991) Artifacts or attributes? Effects of resolution on the  
Little Rock Lake food web. *Ecol. Mon.* 61:367-392.

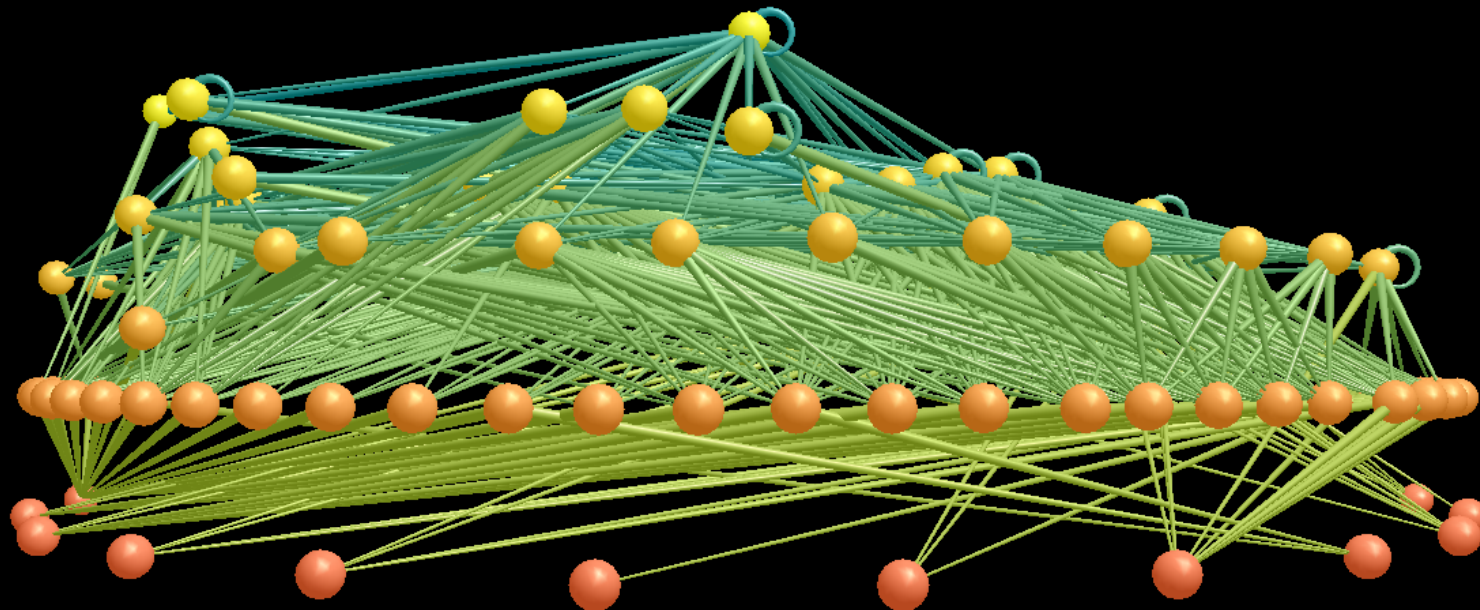
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# Talk Outline

1. complex ecological network theory  
structure  
function
  3. Empirical support among ecosystems
  3. Responses of ecosystems & biodiversity to  
species loss and invasions
  4. Major directions for theory to advance:  
fit specific systems  
include evolution and humans
-

# Food-web Structure Theory

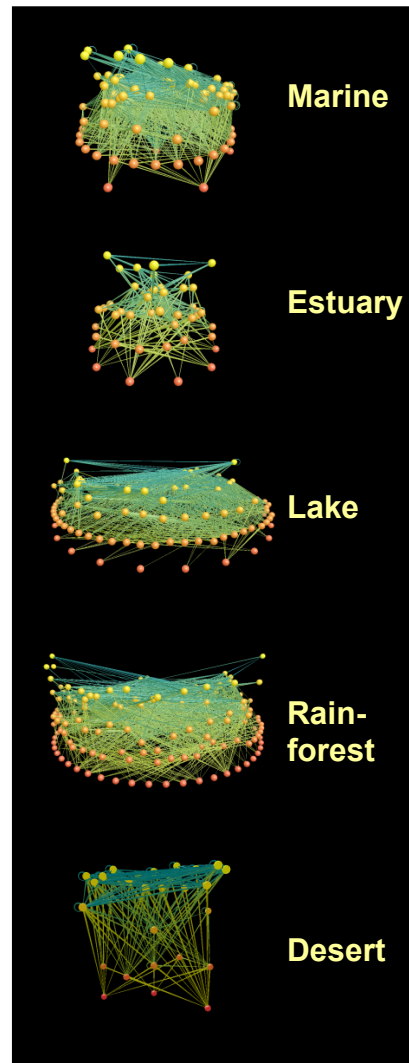
Inputs are Species Diversity and Network Complexity



Species Diversity ( $S$ ) = 92, Connectance ( $C=L/S^2$ ) = 0.12

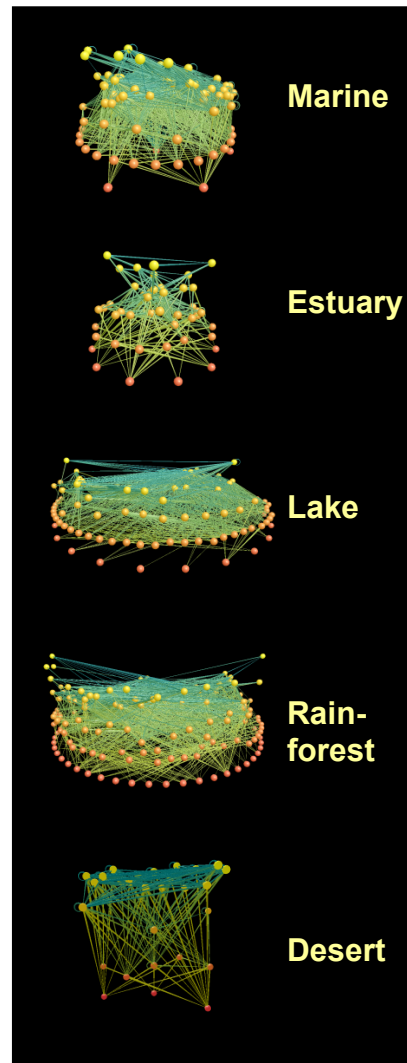
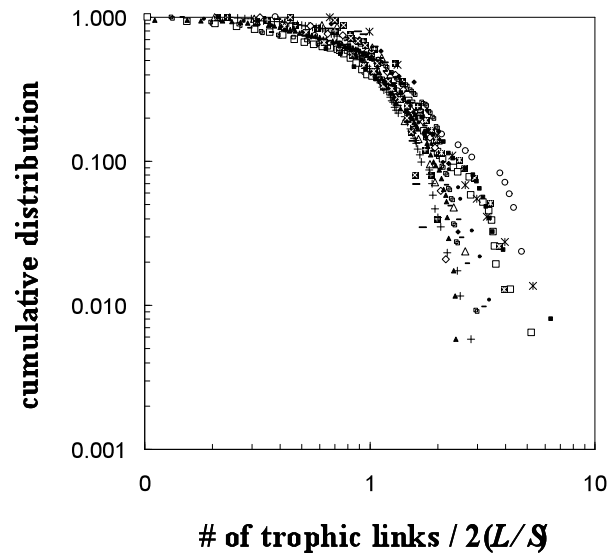
Martinez (1991) Artifacts or attributes? Effects of resolution on the Little Rock Lake food web. *Ecol. Mon.* 61:367-392.

# Apparent Complexity

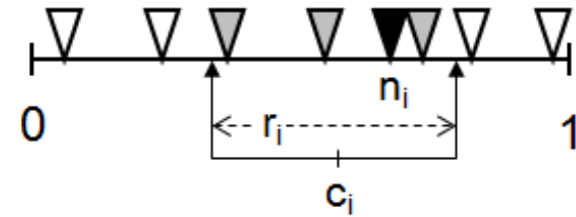


# Underlying Simplicity

Normalized Data for 16Wwebs



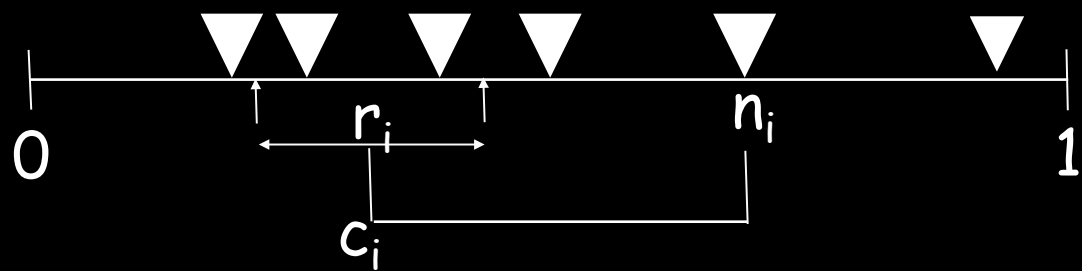
The Niche Model



Two Parameters ( $C, S$ )  
Simple Link Distribution Rules  
Predicts Network Structure

Williams & Martinez (2000) Simple rules yield complex food webs. *Nature* 404:180-183.  
Dunne, Williams & Martinez (2002) Food-web structure and network theory. *PNAS* 99:12917-12922.





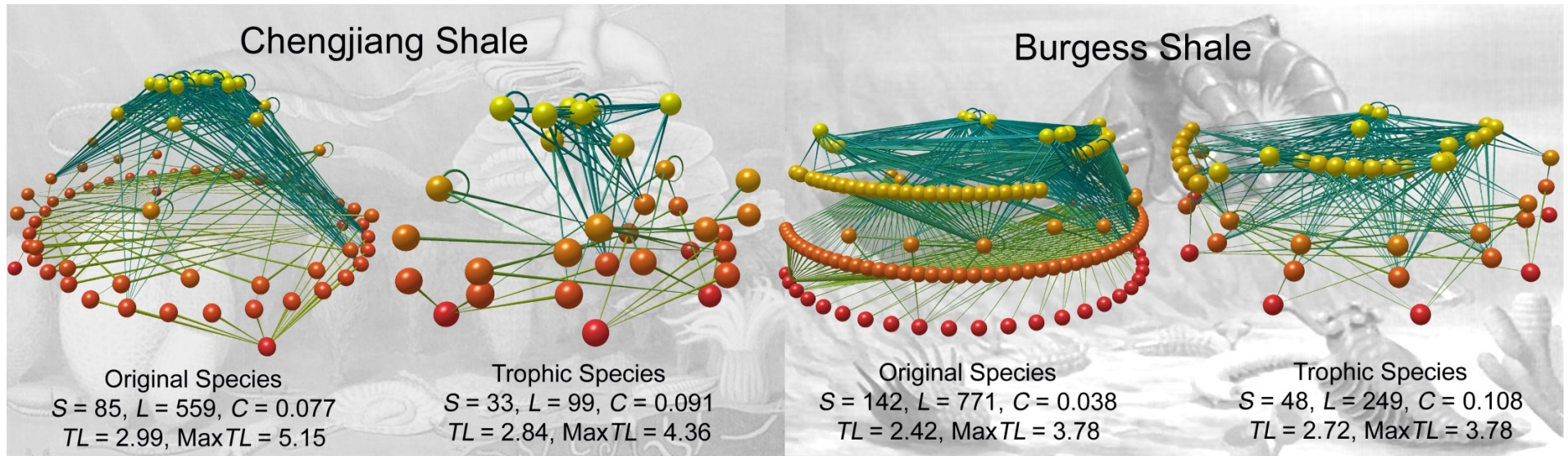
## Niche Model: Input $S$ & $C$ , 3 Rules

- Rule 1: Each of  $S$  species gets uniform random  $n_i$
- Rule 2: Each species gets assigned a random “feeding range” ( $r_i$ )  $0 \leq r_i \leq 1$ 
  - chosen from a beta function (mean of  $2C$ ) multiplied by the species niche value ( $n_i$ ).
- Step 3: Range is placed by uniformly choosing a random range center ( $c_i$ ) so that  $r_i/2 < c_i < n_i$

# Empirical Support

- Niche model does very well
  - 19 webs, 16 network properties each (Dunne *et al.* 2004)
- Gets degree distributions right (Stouffer *et al.* 2005)
- New models limited (Williams & Martinez 2008, Allesina *et al.* 2008)
  - Fixing the intervality problem creates others...
  - Improved testing: Normality assumption replaced with model distributions, Max Likelihood
- Applies to Paleowebs (Dunne *et al.* 2008, *PLoS Biology*)
  - Number nodes that are: Herbivores, Carnivores, Omnivores, Cannibals, etc.
  - Network properties: mean length, variability and number of food chains

# Paleofoodwebs

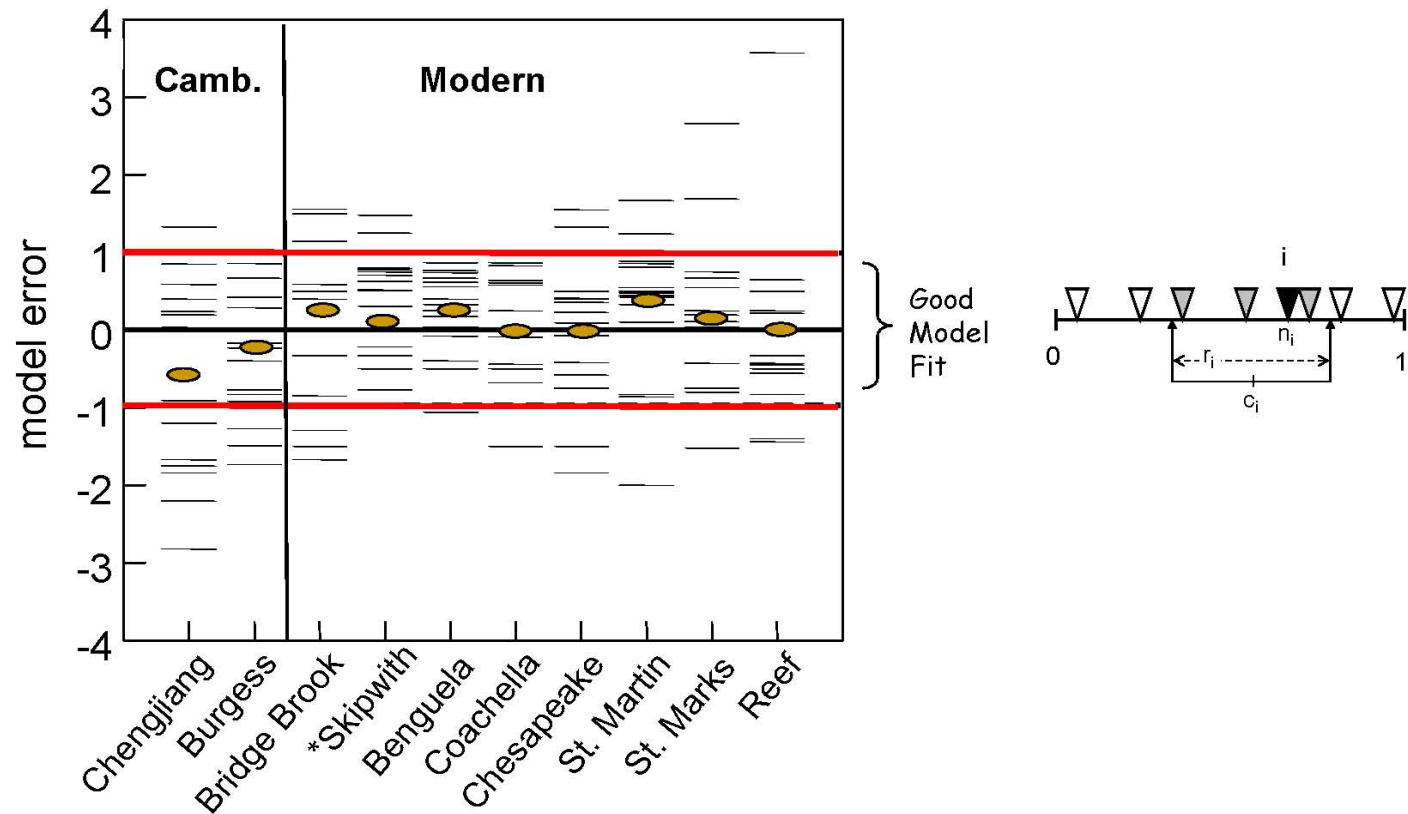


**Compilation and  
Network Analyses  
of Cambrian  
Food Webs**  
Dunne, Williams,  
Martinez, Wood &  
Erwin et al. 2008  
*PLoS Biology*



## Niche model errors

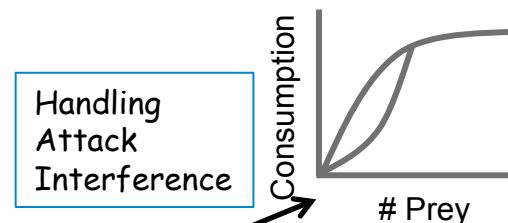
Model Errors for 17 properties for 10 food webs



Results generally robust to removal of uncertain links

## Bioenergetic model for complex food webs

### Extending Yodzis & Innes 1992



$$\frac{dB_i(t)}{dt} = G_i(B) - x_i B_i(t) + \sum_{j=1}^n \left( \frac{(x_j y_{ji} \alpha_{ji} F_{ji}(B) B_j(t) - x_i y_{ij} \alpha_{ij} F_{ij}(B) B_i(t))}{e_{ji}} \right)$$

Rate of change in biomass = Production rate of basal spp. - Loss of biomass to metabolism + (Gain of biomass from resource spp. - Loss of biomass to consumer spp.)

Time evolution of species' biomasses in a food web result from:

- Basal species grow via a carrying capacity, resource competition, or Tilman/Huisman models
- Other species grow according to feeding rates and assimilation efficiencies ( $e_{ji}$ )
- All species lose energy due to metabolism ( $x_i$ ) and consumption
- Functional responses determine how consumption rates vary
- Rates of production and metabolism ( $x_i$ ) scale with body size
- Metabolism specific maximum consumption rate ( $y_{ij}$ ) scales with body type

Yodzis & Innes (1992) Body size and consumer-resource dynamics. *Amer. Nat.* 139:1151-1175.

Williams & Martinez (2004) Stabilization of chaotic and non-permanent food web dynamics. *Eur. Phys. J. B* 38:297-303.



# Theory predicts Population Dynamics and Evolution: 2 species in the lab

**letters to nature**

REPORTS

## Crossing the Hopf Bifurcation in a Live Predator-Prey System

Gregor F. Fussmann,<sup>1\*</sup> Stephen P. Ellner,<sup>1,2</sup> Kyle W. Shertzer,<sup>2</sup> Nelson G. Hairston Jr.<sup>1</sup>

17 NOVEMBER 2000 VOL 290 SCIENCE

## Rapid evolution drives ecological dynamics in a predator-prey system

Takehito Yoshida<sup>+</sup>, Laura E. Jones<sup>+</sup>, Stephen P. Ellner<sup>+</sup>, Gregor F. Fussmann<sup>†‡</sup> & Nelson G. Hairston Jr.<sup>+</sup>

<sup>+</sup> Department of Ecology and Evolutionary Biology, Cornell University, Ithaca, NY 14853, USA

NATURE | VOL 424 | 17 JULY 2003 |

*Journal of Animal Ecology* 2002  
71, 802–815

## Predator-prey cycles in an aquatic microcosm: testing hypotheses of mechanism

KYLE W. SHERTZER<sup>\*</sup>, STEPHEN P. ELLNER<sup>†</sup>, GREGOR F. FUSSMANN<sup>‡</sup>  
and NELSON G. HAIRSTON JR.<sup>†</sup>

OPEN ACCESS Freely available online

PLOS BIOLOGY

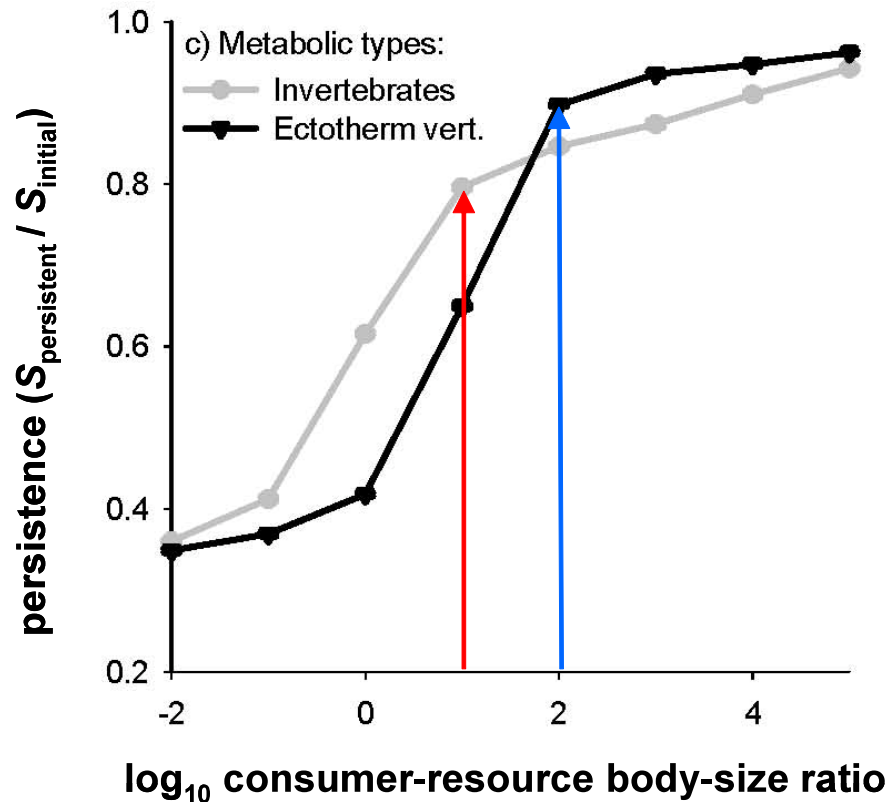
## Cryptic Population Dynamics: Rapid Evolution Masks Trophic Interactions

Takehito Yoshida<sup>1B</sup>, Stephen P. Ellner<sup>1</sup>, Laura E. Jones<sup>1</sup>, Brendan J. M. Bohannan<sup>2</sup>, Richard E. Lenski<sup>3</sup>, Nelson G. Hairston Jr.<sup>1\*</sup>

September 2007 | Volume 5 | Issue 9 | e235

## Importance of body-size ratios

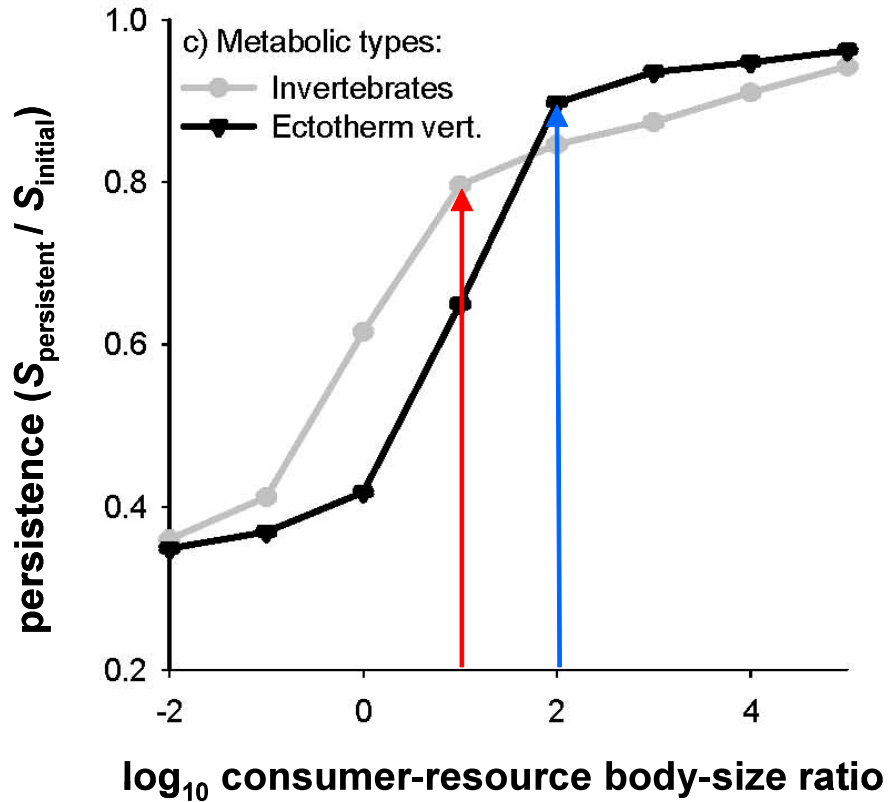
Model: Persistence as  $f$  (Body-Size Ratios)



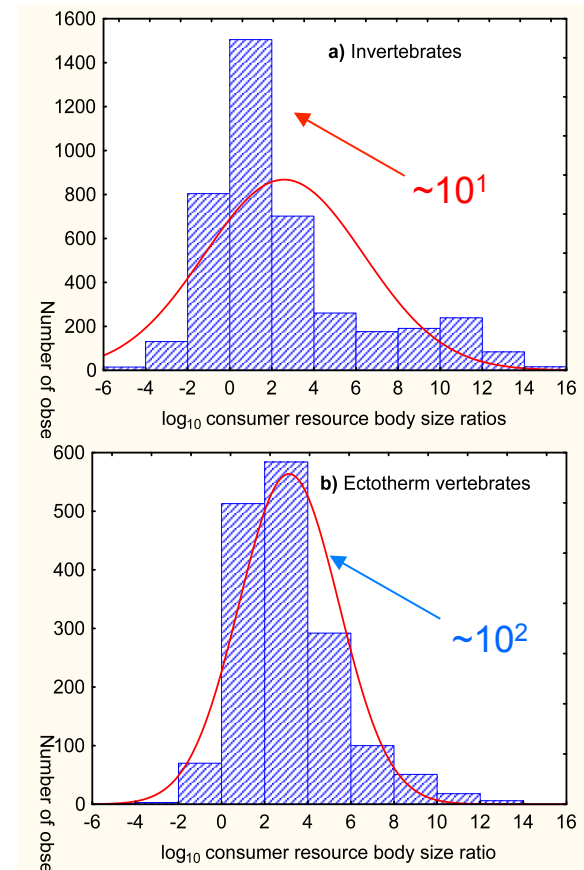
Each food web:  
 $S = 30$   
 $C = 0.15$   
vary Body-size ratios

# Importance of body-size ratios

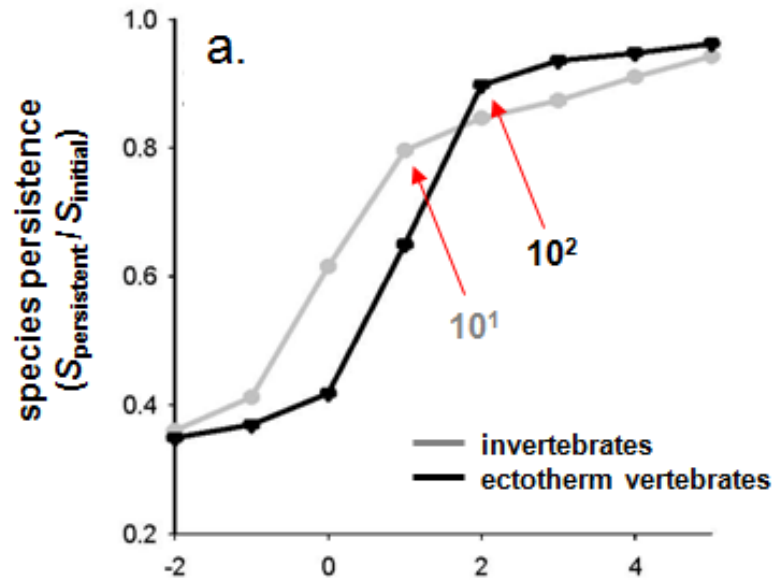
Model: Persistence as  $f$  (Body-Size Ratios)



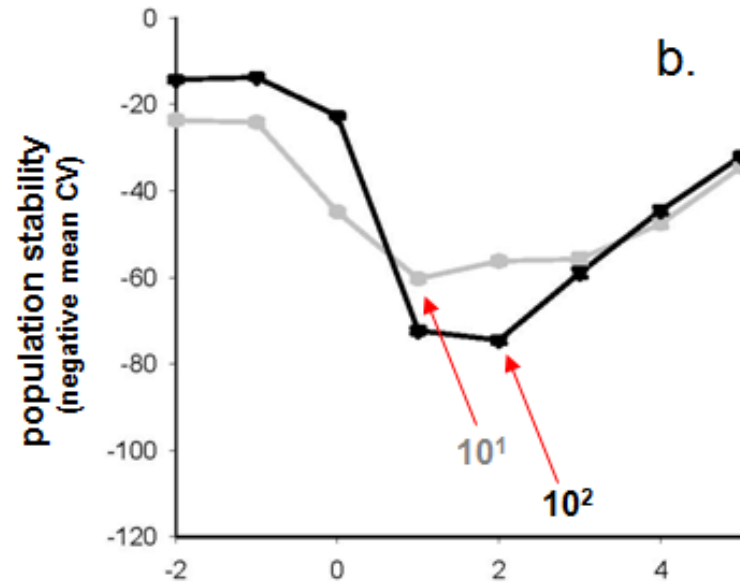
Empirical Body-Size Ratios



### System-Level Persistence



### Component-Level Instability



$\log_{10}$  consumer-resource body-size ratio

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**Otto, Rall & Brose (2007) Allometric degree distributions facilitate food web stability. *Nature* 450:1226-1229.**

- "Persistence domains" of body-size ratios: constrained by bottom-up energy availability when consumers << resources, and by enrichment dynamics when consumers >> resources
- 97% of tri-trophic food chains exhibit ratios within this persistence domain
- Generality increases and vulnerability decreases with body-mass of a species

**Kartascheff, Heckman, Drossel & Guill (2010) Why allometric scaling enhances stability in food webs. *Theoretical Ecology* 3:195-208.**

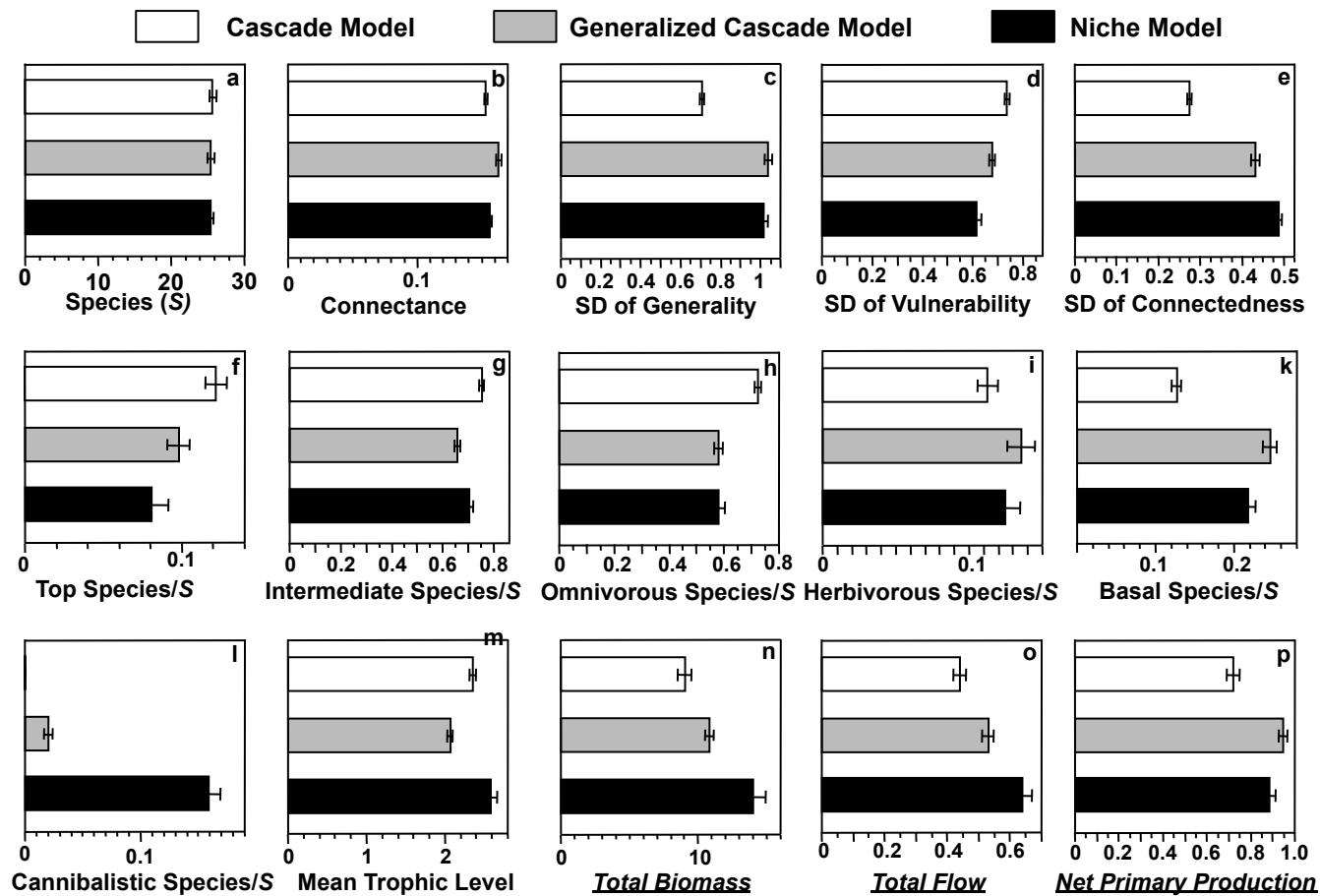
- Allometric scaling increases intraspecific competition relative to metabolic rates for species with higher body mass
- Allometric scaling leads to reduced biomass outflow from resource to consumer when the consumer is larger than the resource

**Brose (2010) Body-mass constraints on foraging behaviour determine population and food-web dynamics. *Functional Ecology* 24:28-34.**

- How to include such factors into functional response: attack rates, Hill exponents, (i.e., Type II → III), and predator interference coefficients
-



# Network Structure and Ecosystem Function



Martinez and Williams in prep.

2009 *PNAS* 106:187-191

## Simple prediction of interaction strengths in complex food webs

Eric L. Berlow<sup>a,b,c,1,2</sup>, Jennifer A. Dunne<sup>c,d</sup>, Neo D. Martinez<sup>c</sup>, Philip B. Stark<sup>e</sup>, Richard J. Williams<sup>c,f</sup>, and Ulrich Brose<sup>b,c,2</sup>

<sup>a</sup>University of California, Merced, Sierra Nevada Research Institute, Wawona Station, Yosemite National Park, CA 95389; <sup>b</sup>Darmstadt University of Technology, Department of Biology, Schnittspahnstrasse 10, 64287 Darmstadt, Germany; <sup>c</sup>Pacific Ecoinformatics and Computational Ecology Lab, 1604 McGee Ave., Berkeley, CA 94703; <sup>d</sup>Santa Fe Institute, 1399 Hyde Park Road, Santa Fe, NM 87501; <sup>e</sup>University of California Berkeley, Department of Statistics, Berkeley, CA 94720-3860; and <sup>f</sup>Microsoft Research Ltd, 7 J. J. Thomson Avenue, Cambridge CB30FB United Kingdom

Edited by Simon A. Levin, Princeton University, Princeton, NJ, and approved November 10, 2008 (received for review July 15, 2008)

### Allometric Trophic Network (ATN) Model

#### Food Web Structure: *Niche Model*

→ Williams & Martinez 2000

#### Predator-Prey Interactions: *Bioenergetic Model*

→ Yodzis & Innes 1992

→ Williams & Martinez 2004

→ Brose et al. 2006

#### Plant Population Dynamics: *Plant-Nutrient Model*

→ Tilman 1982

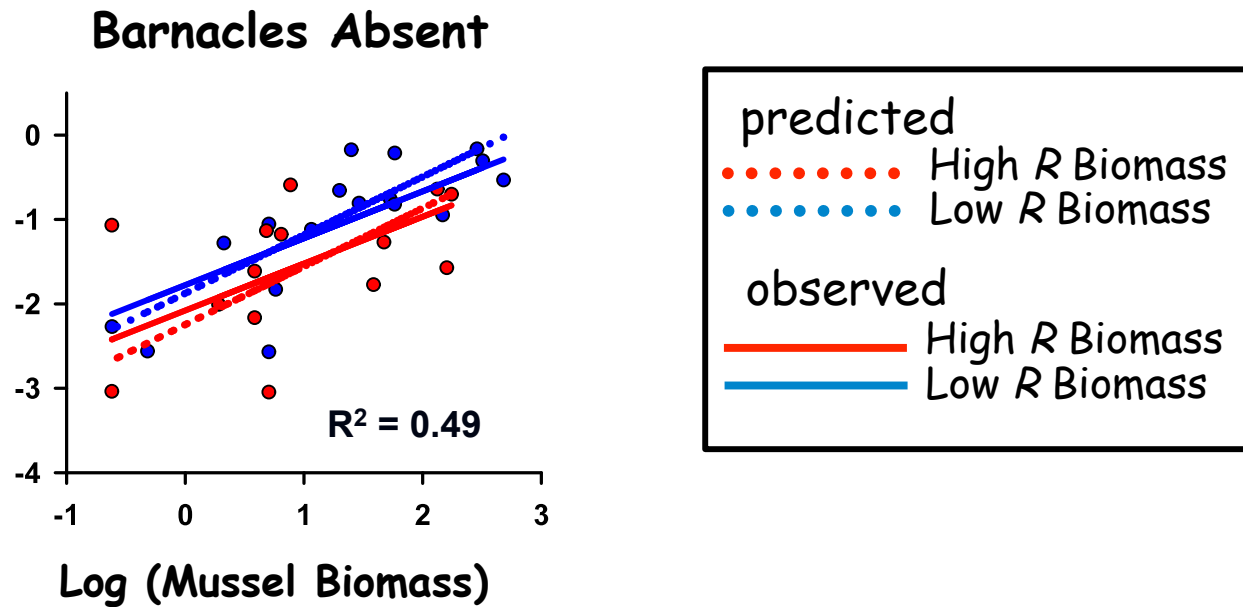
→ Huisman & Weissing 1999



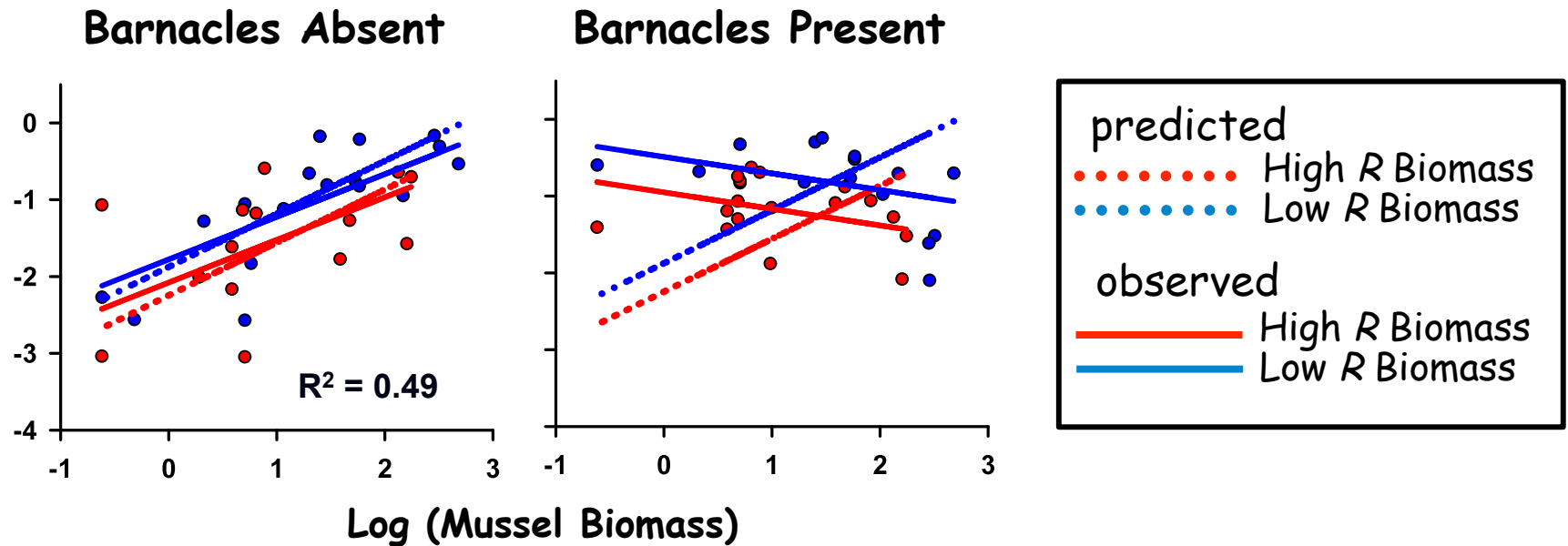
## Experimental Field System

- 1) Small intertidal habitats,  $S \sim 30$
- 2) 3 species manipulated:  $R$  = predatory whelk;  $T$  = mussels
- 3) Barnacles mediate non-trophic effects of whelks on mussels, since barnacles facilitate mussel recruitment. Whelks eat barnacles:
  - Fewer barnacles means less substrate (negative mussel impact)
  - Thinning helps barnacles survive physical disturbances (positive mussel impact)
- 4) Measurements:  $I$  and  $pcI$  of whelks on mussels;  $B_T^+$  (biomass of mussels with whelk present),  $B_r$  (biomass of whelk),  $M_R$  (body mass of mussels)

## Results



- 1) Barnacles Absent: ATN model prediction of  $\log_{10}|pcI|$  similar to observed at high & low mussel biomass and high & low whelk biomass



- 1) Barnacles Absent: ATN model prediction of  $\log_{10}|pcI|$  similar to observed at high & low mussel biomass and high & low whelk biomass
- 2) Barnacles Present: underpredicts  $pcI$  at low mussel B and overpredicts at high B

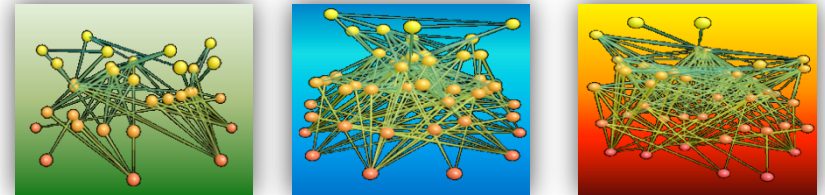


# Simulation Methods

## ■ STEP ONE:

Create 150 Niche model webs ( $t=0$ )

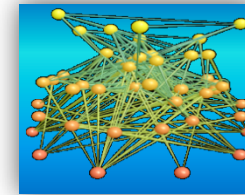
- 30 species, initial  $C=0.05, 0.15, 0.30$



## ■ STEP TWO:

Create 100 niche invaders ( $t=0$ )

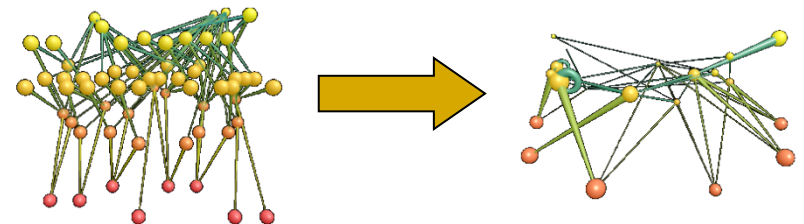
- 30 species, initial  $C=0.15$



## ■ STEP THREE:

Generating persistent webs ( $t=0$  to  $t=2000$ )

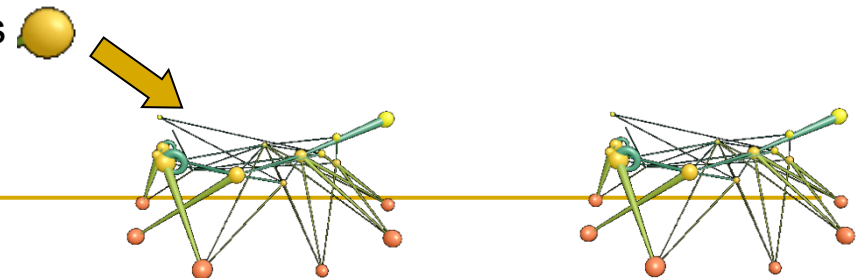
- $S$  and  $C$  range



## ■ STEP FOUR:

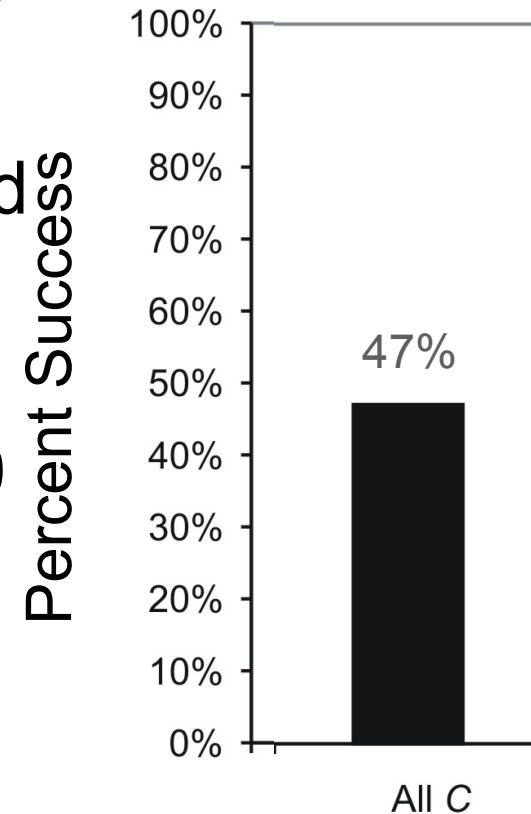
- Introducing invaders in the webs ( $t=2000$  to  $t=4000$ )

- Running the simulations without invasions ( $t=2000$  to  $t=4000$ )



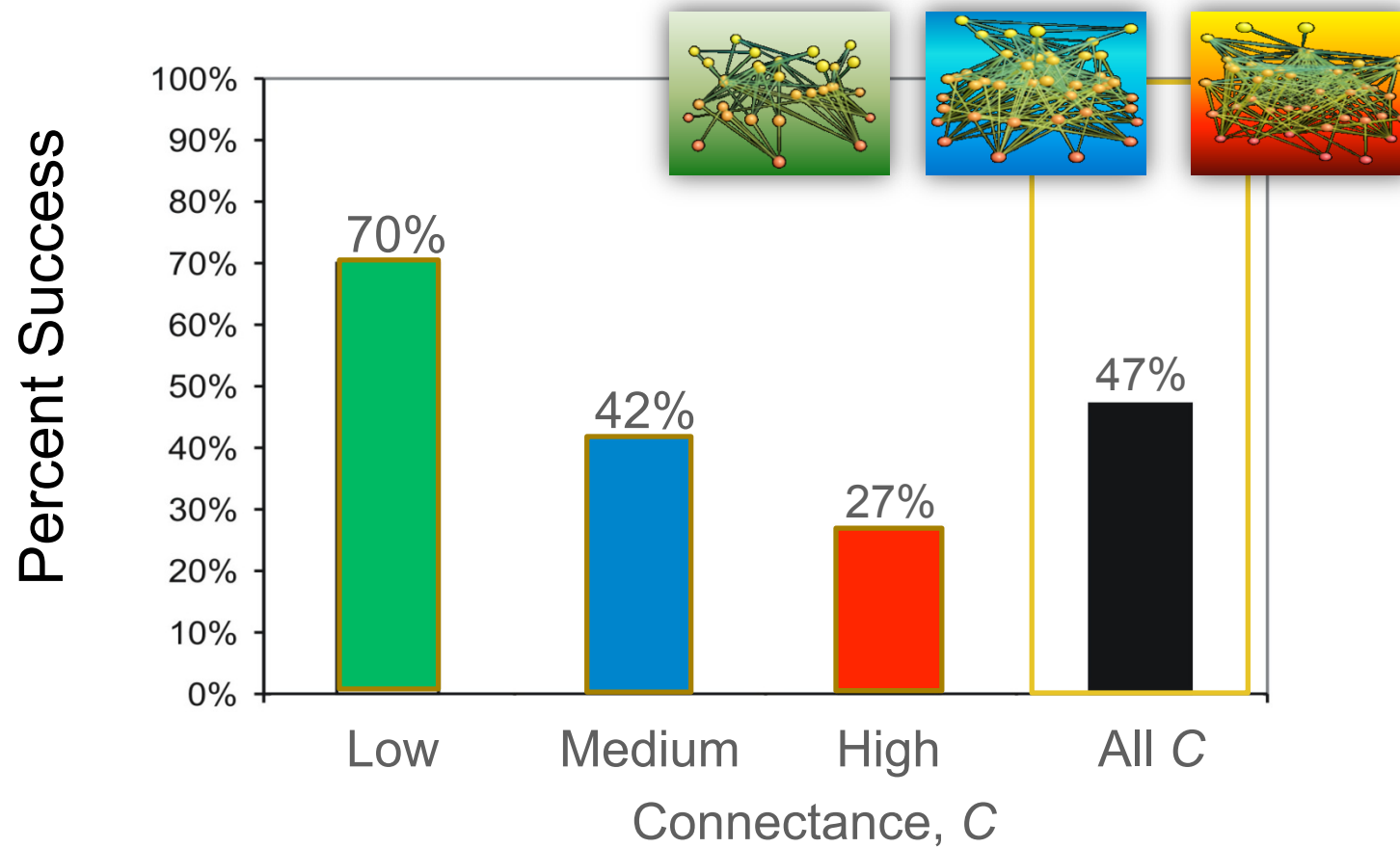
# Resistance is not Futile

- 11,438 invasion attempts by non-basal species
- Basal species are eliminated
- 47% of these introductions were successful with the invader persisting till  $t=4000$



Theme Issue: **'Food-web assembly and collapse: mathematical models and implications for conservation'**, Romanuk *et al.*, Phil. Trans. R. Soc. B 2009

## Resistance varies with $C$



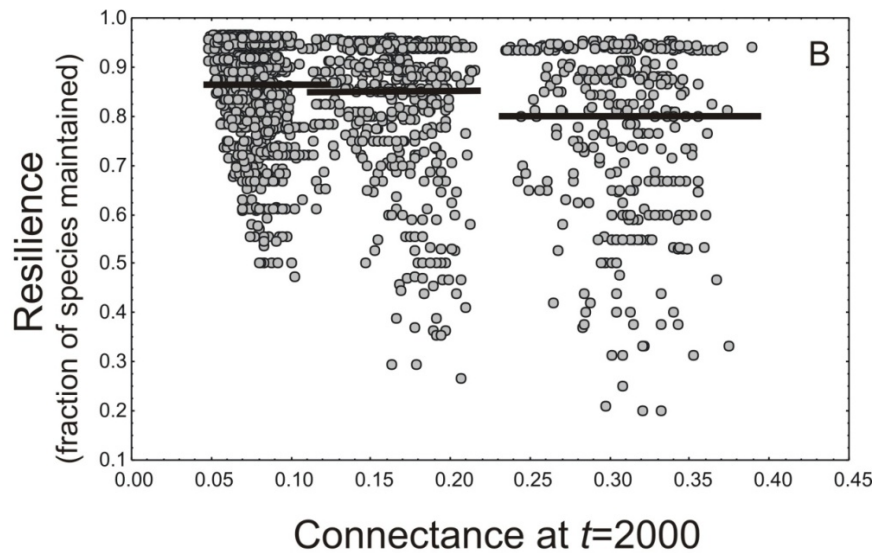
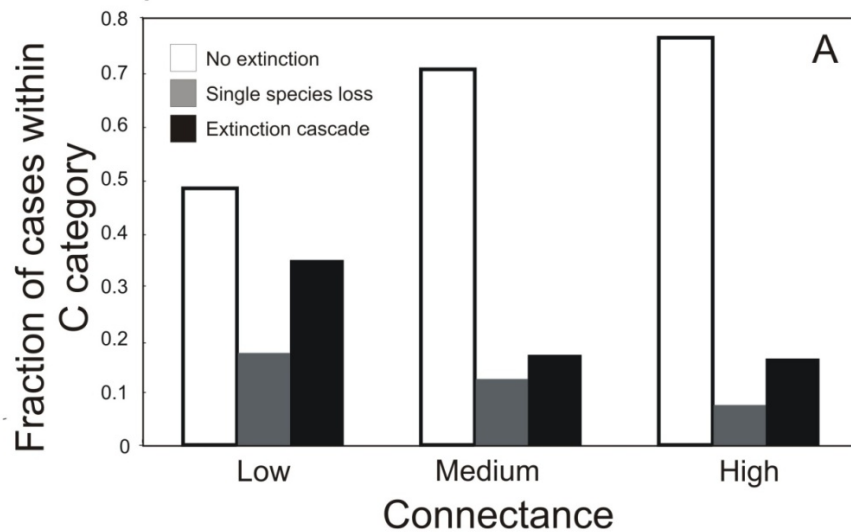


Figure 3a-b

**C affects magnitude of secondary extinctions**

- The magnitude of the extinctions was much greater in high  $C$  webs than in the low  $C$  webs.

**Low Connectance Webs most Resilient**

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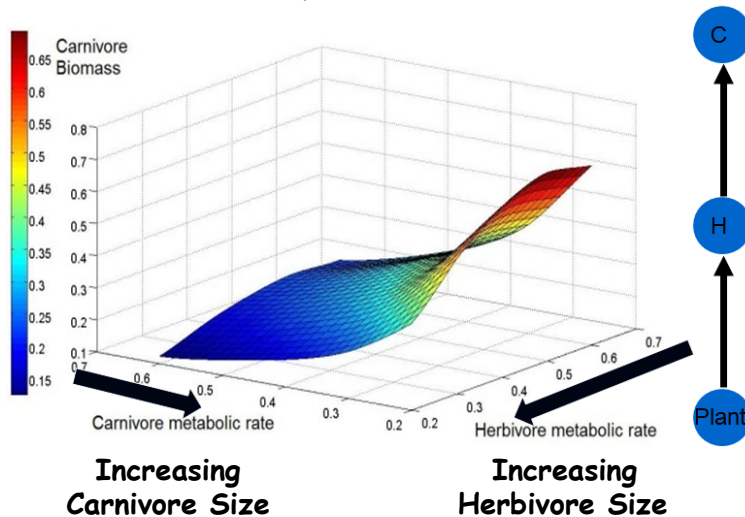
## Summary

- A well-developed theory of biodiversity and ecosystem function focuses on the network structure and function of complex food webs
  - This theory has substantial empirical support
  - The theory is very useful for addressing global change
  - Promising new and synthetic directions need to be pursued.
-

# Economic Effects of Humans on Ecosystems

with Barbara Bauer, Potsdam University

Effects of Body Size on Fish Biomass

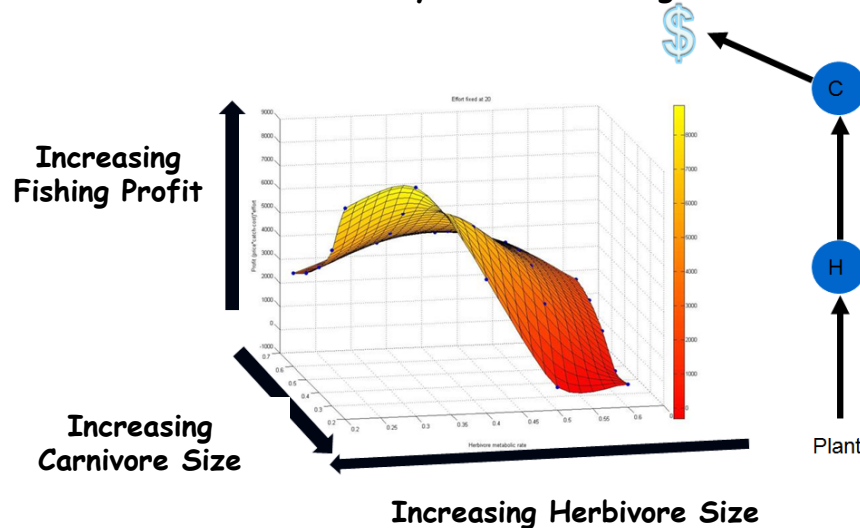


Add economic nodes to ecological networks

$$E_k' = n(pqB_i - c)E_k \quad (\text{Conrad 1999})$$

- $E$  = exploitation effort
- $p$  = price per unit biomass
- $q$  = catchability
- $c$  = cost per unit effort
- $n$  = economic "openness"

Effects of Body Size on Fishing Profit



→ Body size of consumers strongly affect the function of trophic networks

→ Fishing reduces body size which can reduce profits

→ Management can alter body sizes of consumer in exploited ecosystems



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## ATN Model of a Specific System

### Lake Constance



w/ Alice Boit & Ursula Gaedke,  
Potsdam University, Germany

Rich empirical data:

$S = 18$

Trophic network data

Weekly biomass & productivity  
data, 10-20 yrs

Metabolic data & body size

Run generic to specific  
versions of the ATN model and  
compare output to biomass  
time series data

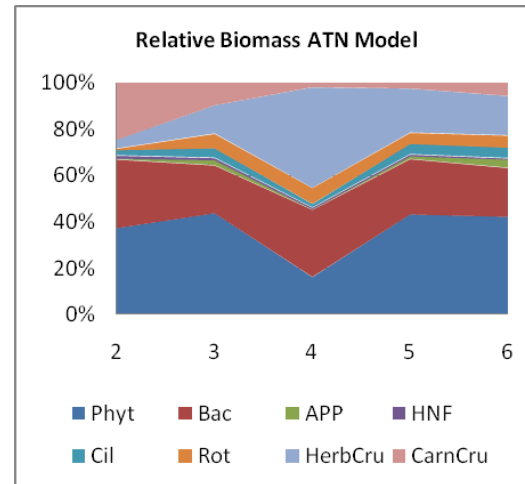
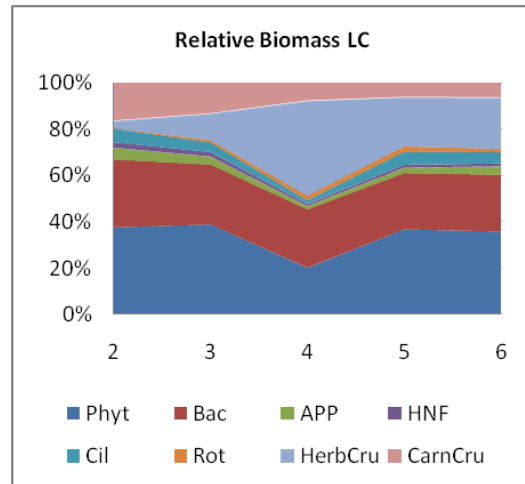
(i.e., idealized system, generalized  
lake pelagic system, highly  
constrained system)

Germany, Austria, Switzerland

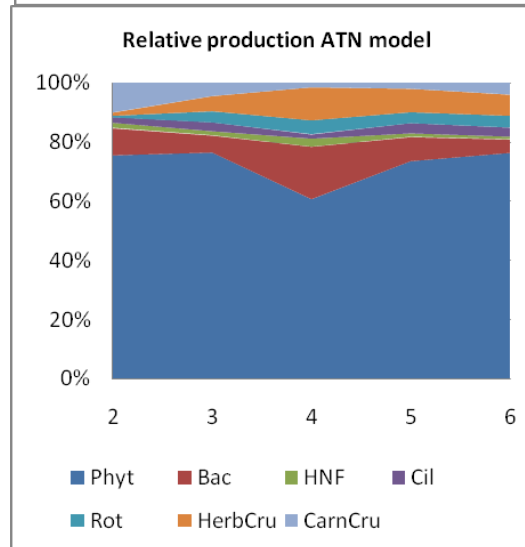
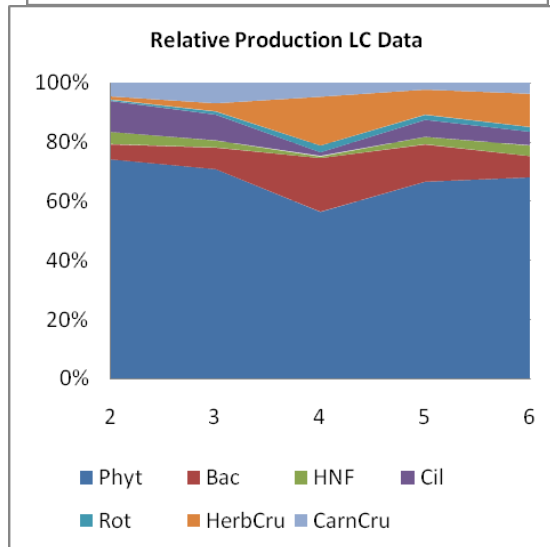
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# ATN Model of a Lake Constance

Data

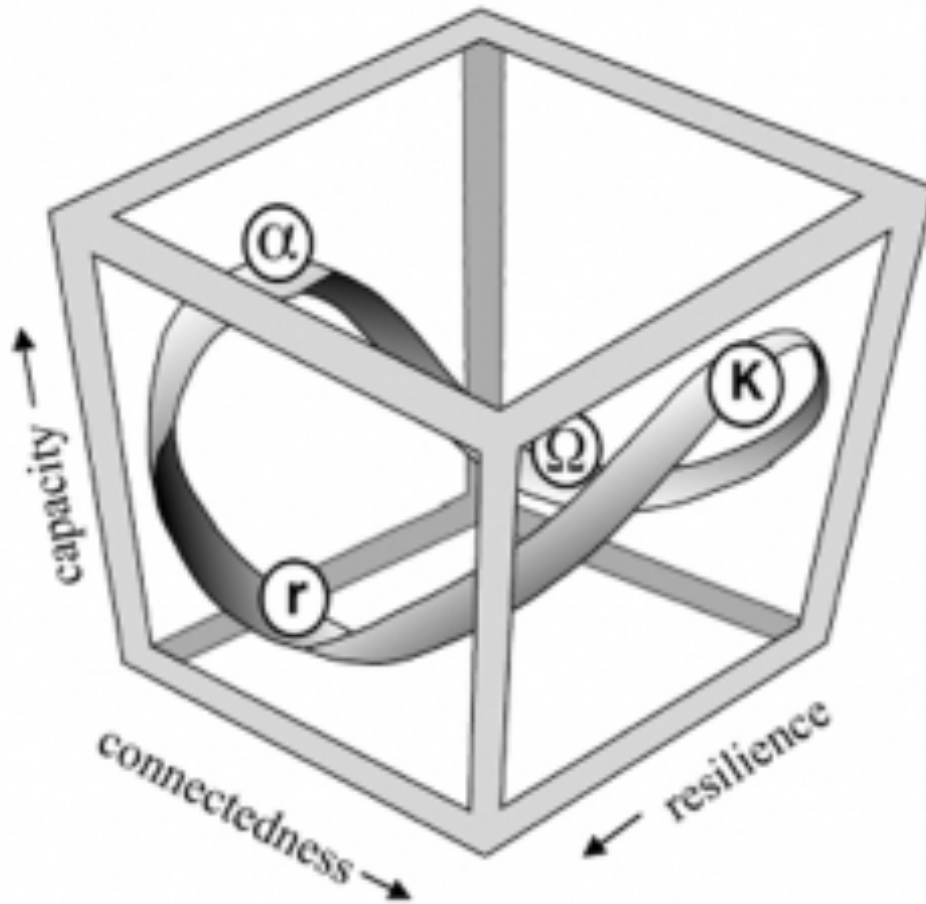


Model

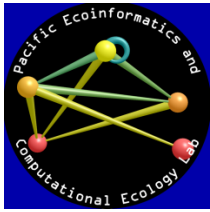


Need to add foraging metabolism to basal metabolism

# Resilience Alliance: Panarchy



- A more rigorous framework for exploring fundamental concepts



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# Future Directions

- Include nontrophic interactions
    - Facilitation, plant-fungal, plant-pollinator
    - Sublethal effects of predators
    - Nutrients, remineralization, decomposition
  - Apply computational sciences
    - Constraints, optimization, decision theory
    - Informatics: ontologies, semantic web
    - Visualization!
-