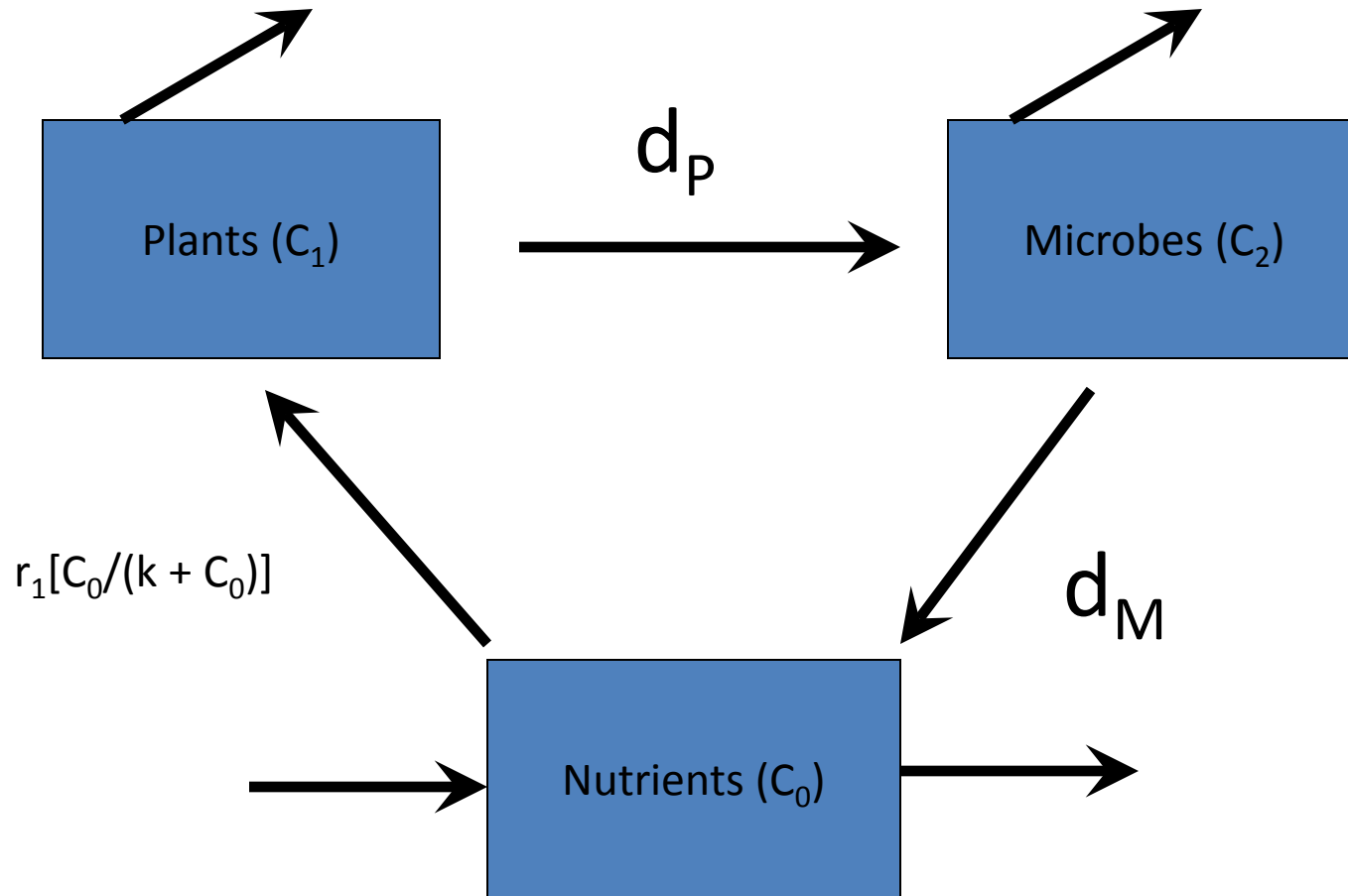


# Dimensions of Biodiversity: The ecosystem consequence of agrobiodiversity loss.

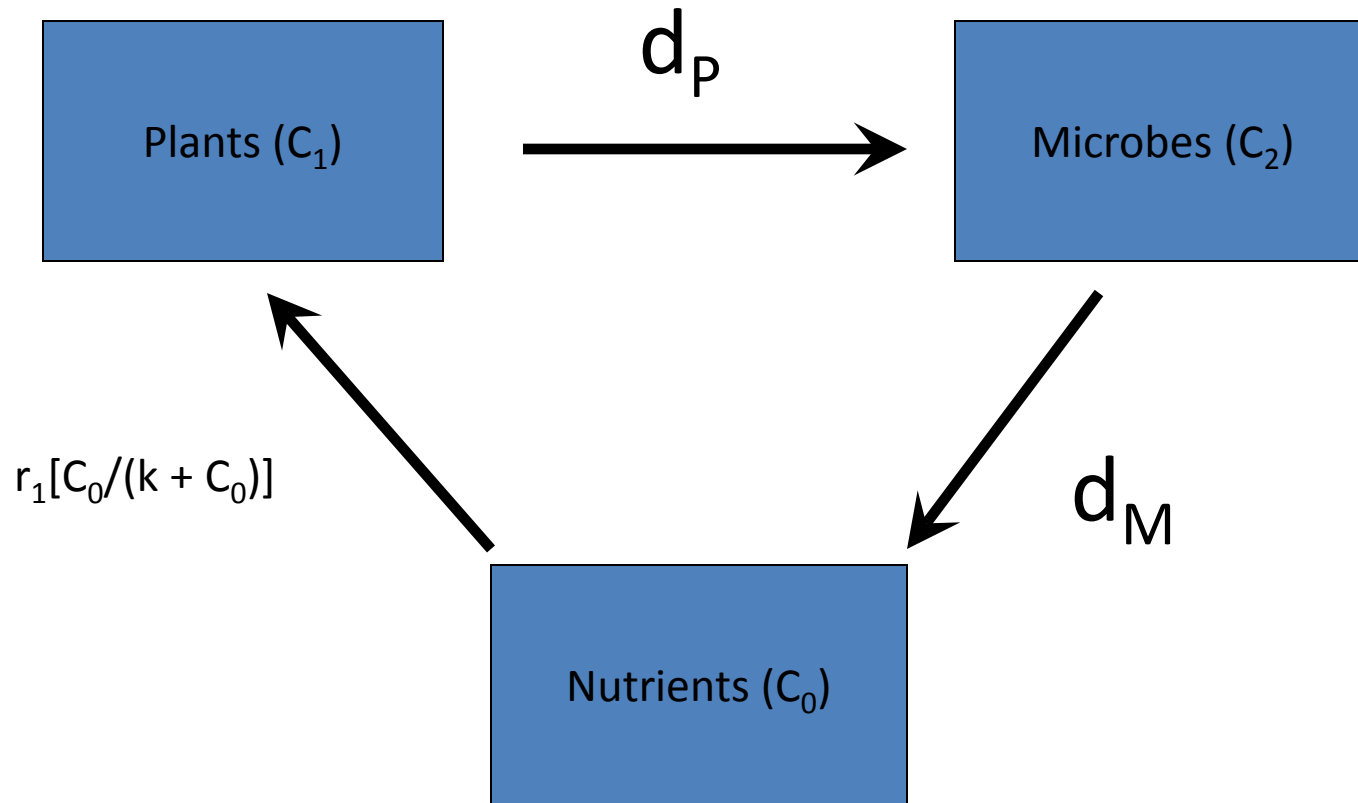
Shahid Naeem  
Columbia University

# DeAngelis type model



DeAngelis, D. L. (1992) Dynamics of nutrient cycling and food webs.

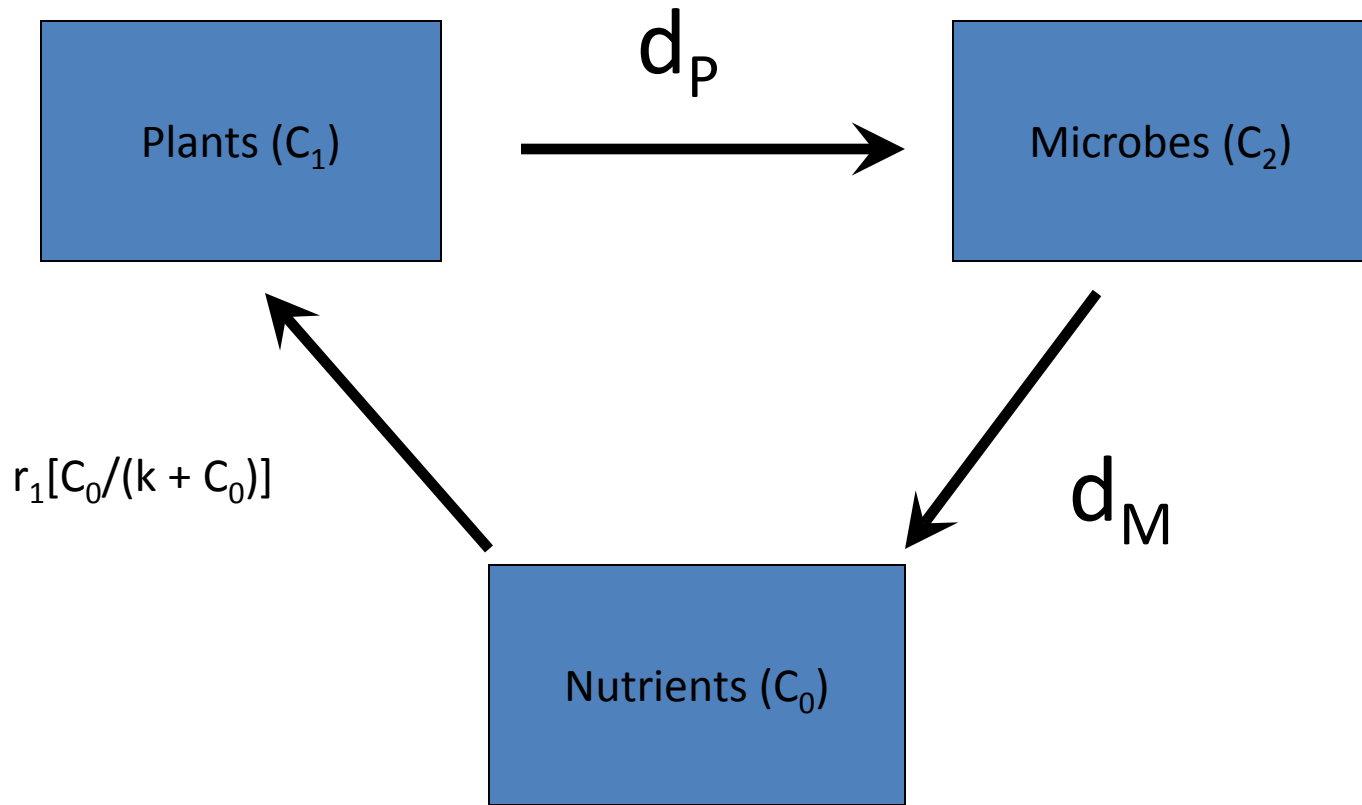
DeAngelis type model (grossly simplified!)



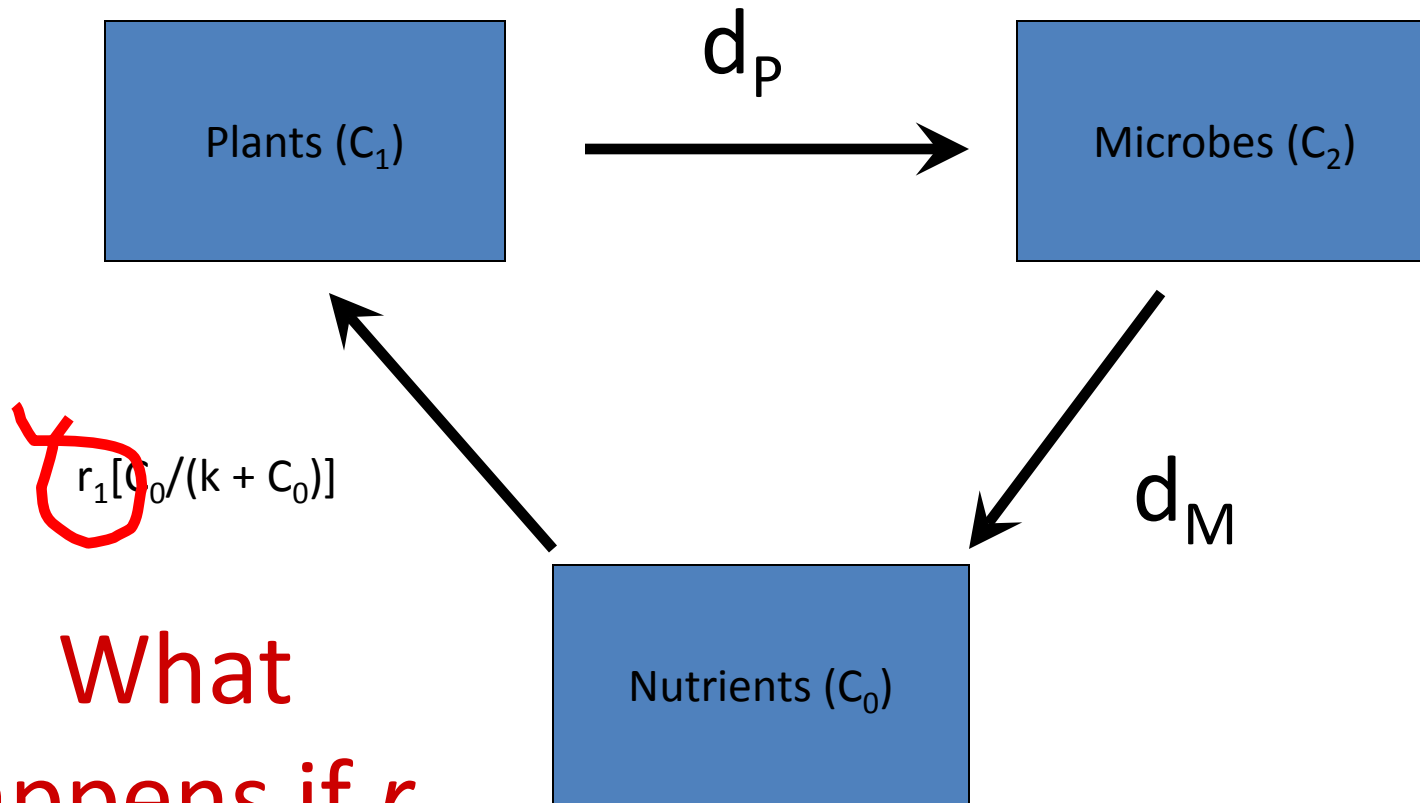
DeAngelis, D. L. (1992) Dynamics of nutrient cycling and food webs.

$$\frac{dC_1}{dt} = r_1 \frac{C_0}{k_1 + C_0} C_1 - d_p C_1$$

$$\frac{dC_2}{dt} = d_p C_1 - d_M C_2$$



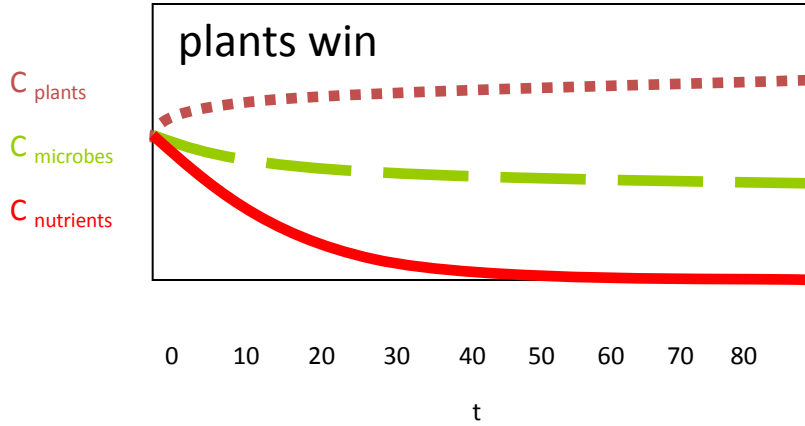
$$\frac{dC_0}{dt} = d_M C_2 - C_1 r_1 \frac{C_0}{k_1 + C_0}$$



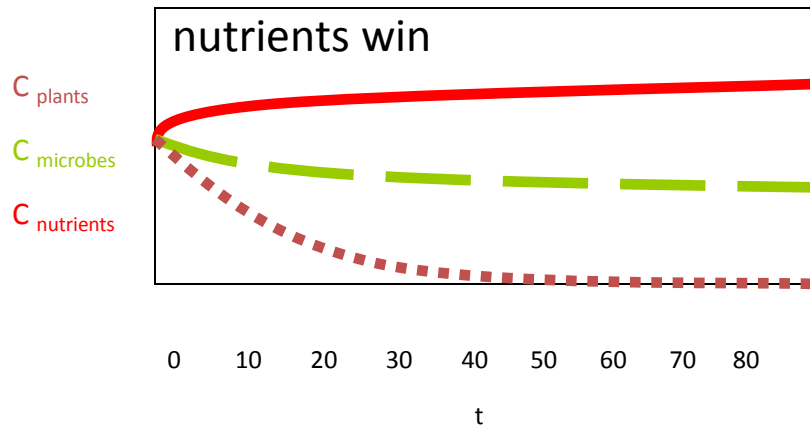
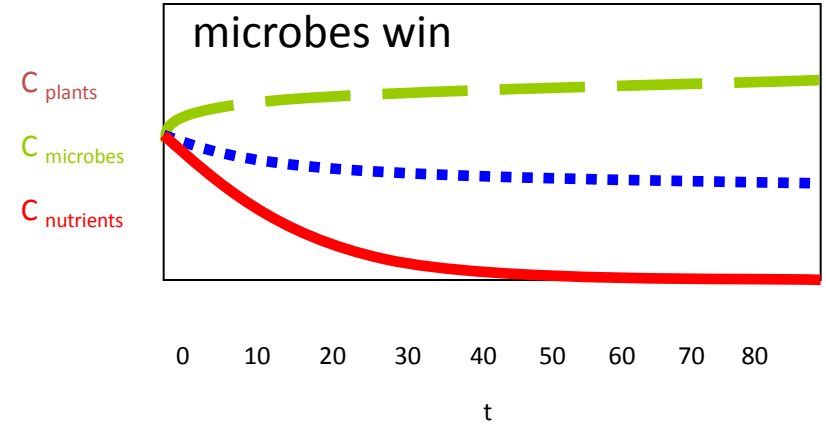
What  
happens if  $r_1$   
increases?

At high values of  $r$  (plant growth), what would happen?

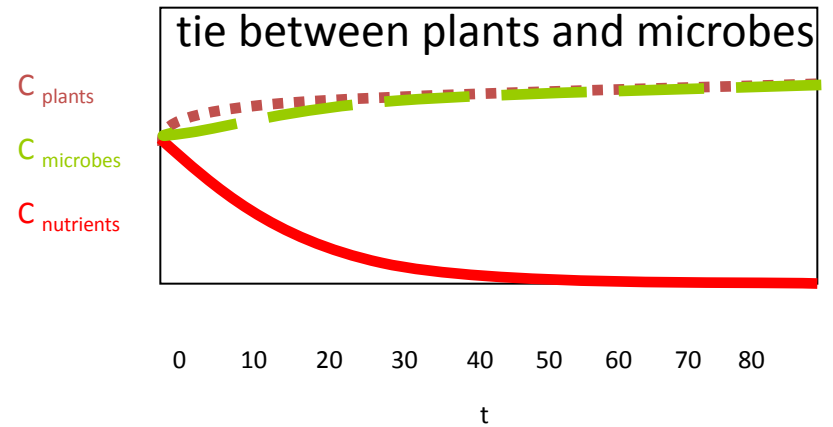
A



B

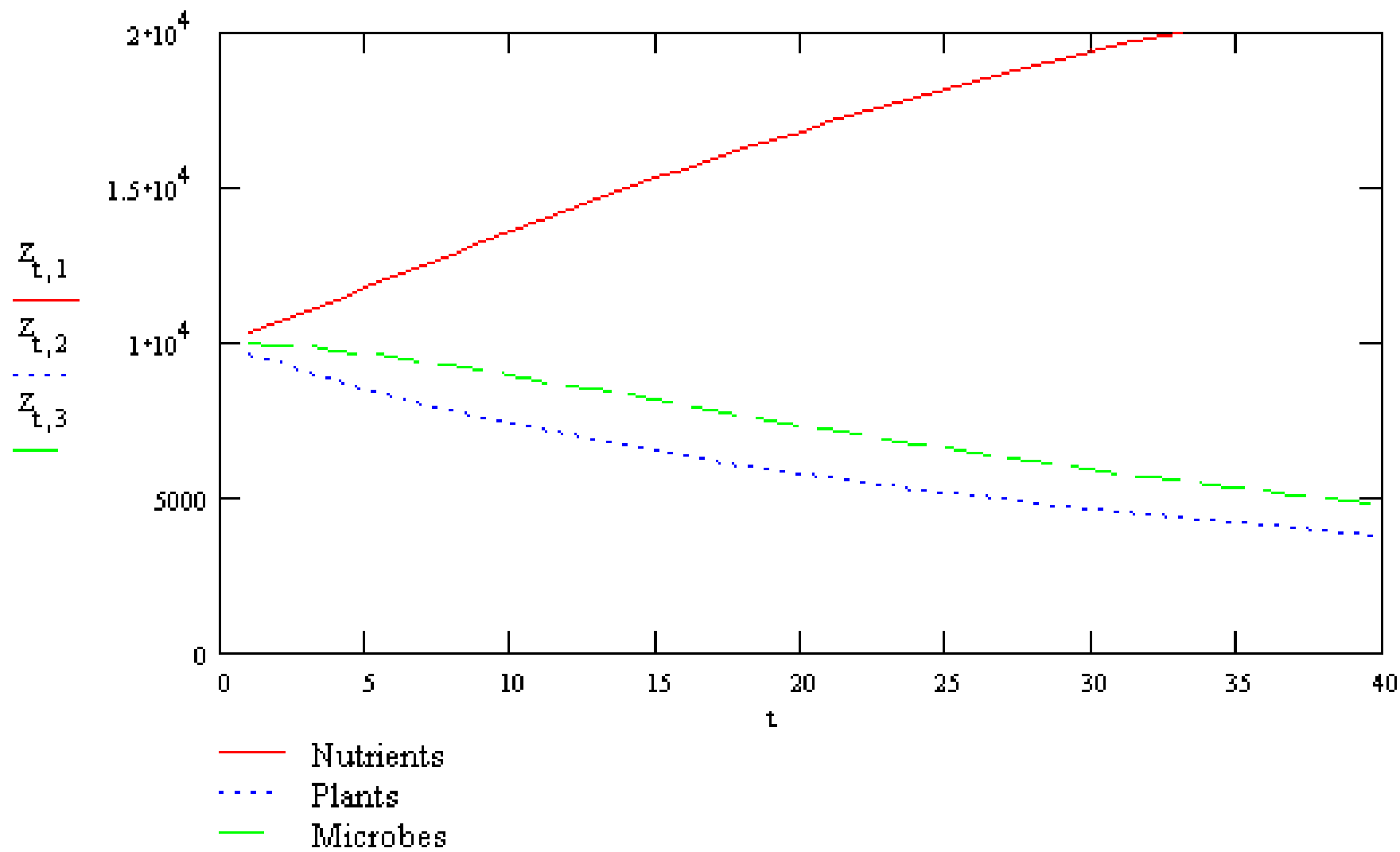


C



D

$$r_1 = 0.1$$



## REVIEW



# Biological Diversity Function

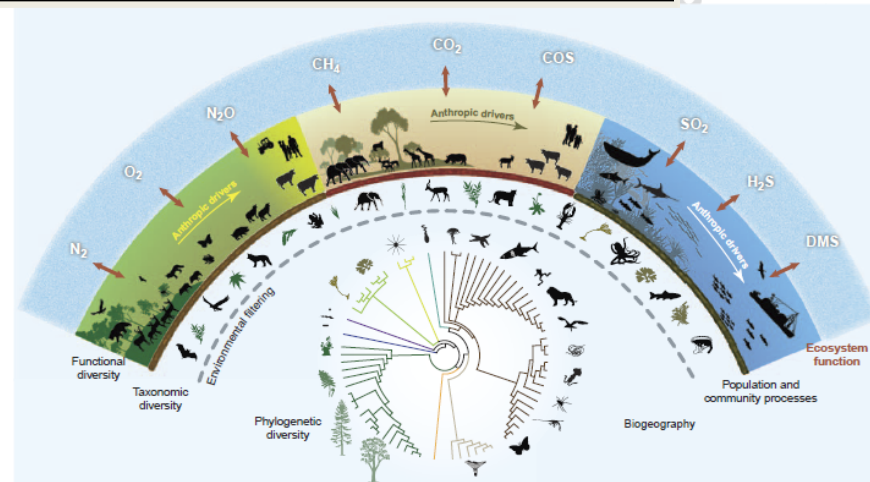
Zavaleta<sup>3</sup>

taxonomic, phylogenetic, genetic, and functional diversity  
biological resources, modification of habitats and climate, and

experiment, low-diversity plots (four plant species) produced lower interaction diversity among the 427 resident arthropod species than did high-diversity plots (16 plant species) (12). Taken to the extreme, the next step might seem to require conducting an experiment that examines the effects of taxonomic, functional, phylogenetic, genetic, spatial, temporal, landscape, and interaction diversity (all the dimensions we list in Box 1) to explain multiple ecosystem functions.

But such an additive progression—in which biodiversity and ecosystem function research

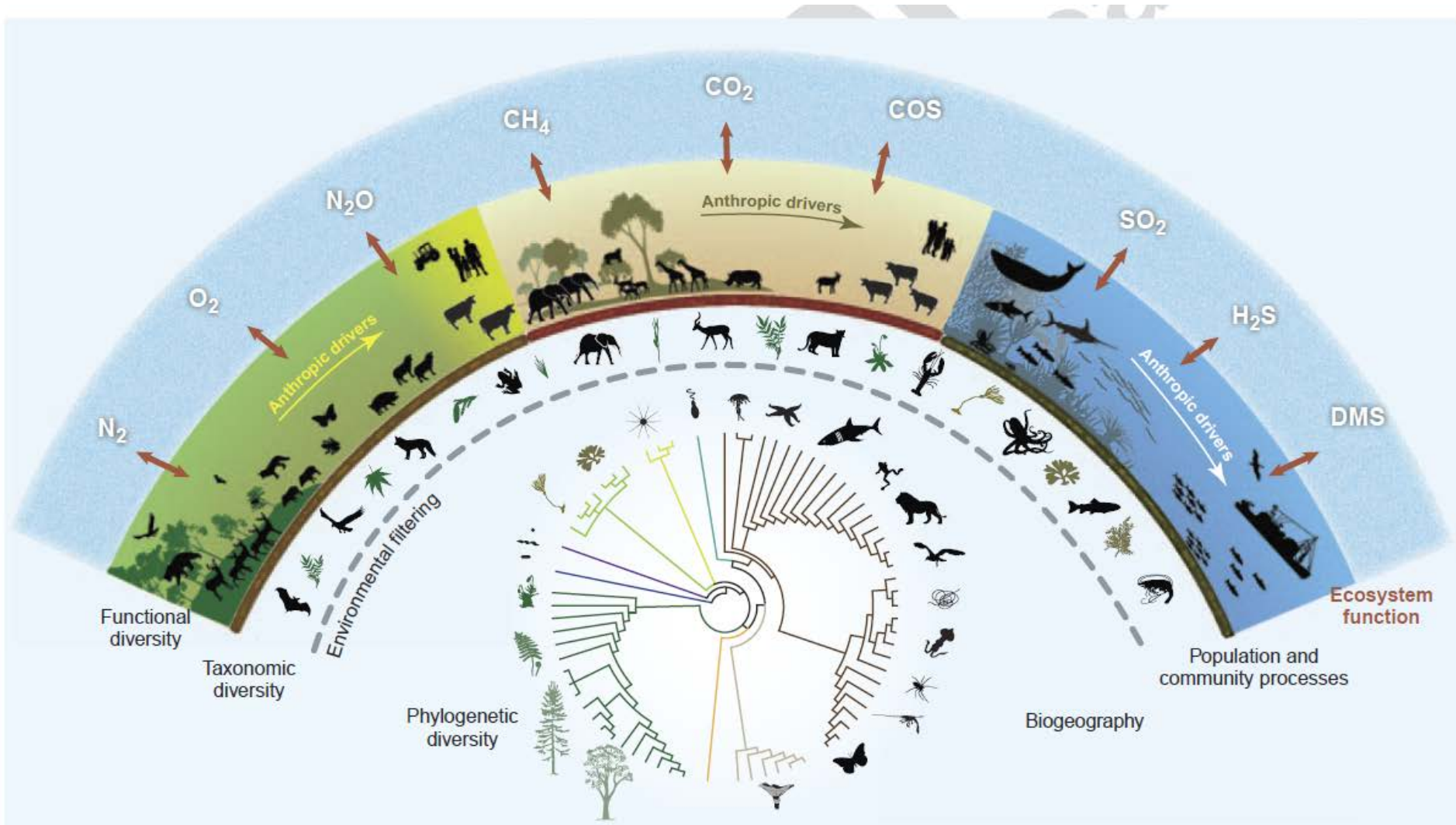
ingolia fluctuates with precipitation  
et overall primary production of the  
ss variable where diversity is high  
ly, wild salmon populations in ind  
aries at Bristol Bay, Alaska, fluctuate  
, but total production of salmon bio  
h the whole system is much more  
) In these and other studies, it is the  
arity of species' responses to envi  
eterogeneity that allows increased  
ability. Greater biodiversity can also  
ater species turnover and compensa  
s environments change, lowering sys  
y (23–25). These effects are variously  
istical averaging, biological insur  
portfolio effect [see (26) for a review].  
acts of biodiversity change on eco  
ion are clearly far richer than our  
cus on predominantly monofunction  
nal, monodimensional biodiversity  
vealed. Such studies generally lacked  
al structure inherent to ecosystems,  
reasingly realize is key to their func-



**Fig. 1.** Biodiversity and ecosystem functioning in an age of extinction. The phylogenetic tree of life, currently populated by about 10 million species, ranges from microscopic to enormous multicellular organisms, of which only a few representative phyla and divisions are shown as icons at the tips of the branches. Where species from the global phylogenetic pool are found is largely determined by environmental filters, represented here as a barrier with pores (dashed arch). Here we show only phylogenetic and taxonomic diversity, but biogeography, population processes, biotic interactions, metagenomic and intragenomic variation, and functional traits contribute to different dimensions of biodiversity (Box 1) that characterize the biota of each ecosystem. Three representative ecosystems are illustrated: a forested

ecosystem (left arch), savanna ecosystem (center arch), and marine ecosystem (right arch). Microorganisms are represented by soils and sediments, illustrated as a dark band at the base of each arch. Each ecosystem contributes to ecosystem functioning, shown here primarily as biogeochemical processes (chemical exchanges between the atmosphere and biosphere shown in the outermost arch). Widespread extinction attributable to anthropogenic drivers (human transformations of ecosystems going from left to right in each arch) lead to biotic impoverishment (reductions in local biodiversity) and biotic homogenization (increasing dominance by domestic species). For clarity, the complexity of biogeochemical pathways and interaction networks (Figs. 2 and 3) is not shown.

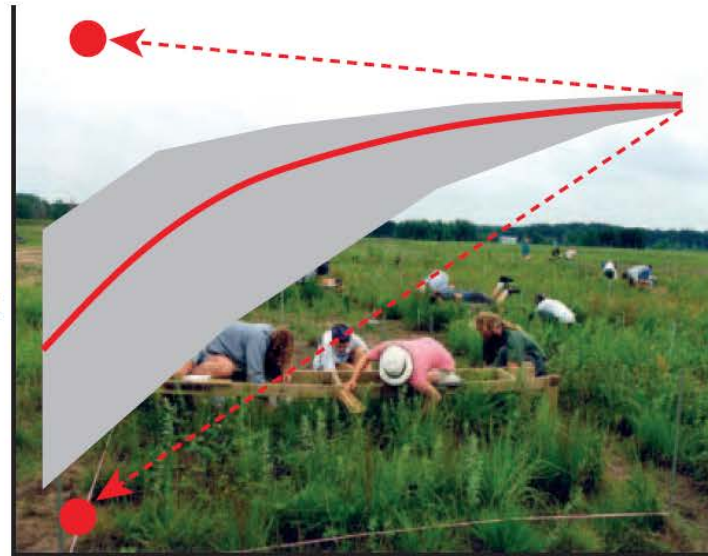




## Biodiversity loss and its impact on humanity

Bradley J. Cardinale<sup>1</sup>, J. Emmett Duffy<sup>2</sup>, Andrew Gonzalez<sup>3</sup>, David U. Hooper<sup>4</sup>, Charles Perrings<sup>5</sup>, Patrick Venail<sup>1</sup>, Anita Narwani<sup>1</sup>, Georgina M. Mace<sup>6</sup>, David Tilman<sup>7</sup>, David A. Wardle<sup>8</sup>, Ann P. Kinzig<sup>5</sup>, Gretchen C. Daily<sup>9</sup>, Michel Loreau<sup>10</sup>, James B. Grace<sup>11</sup>, Anne Larigauderie<sup>12</sup>, Diane S. Srivastava<sup>13</sup> & Shahid Naeem<sup>14</sup>

Ecosystem  
function  
(resource capture,  
biomass production,  
decomposition, nutrient  
recycling)

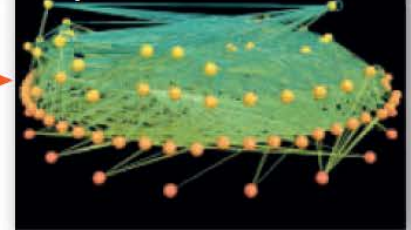


Biological diversity  
(variation in genes, species,  
functional traits)

Link functions to services



Expand our focus



Improve predictions

## Biodiversity loss and its impact on humanity

Bradley J. Cardinale<sup>1</sup>, J. Emmett Duffy<sup>2</sup>, Andrew Gonzalez<sup>3</sup>, David U. Hooper<sup>4</sup>, Charles Perrings<sup>5</sup>, Patrick Venail<sup>1</sup>, Anita Narwani<sup>1</sup>, Georgina M. Mace<sup>6</sup>, David Tilman<sup>7</sup>, David A. Wardle<sup>8</sup>, Ann P. Kinzig<sup>5</sup>, Gretchen C. Daily<sup>9</sup>, Michel Loreau<sup>10</sup>, James B. Grace<sup>11</sup>, Anne Larigauderie<sup>12</sup>, Diane S. Srivastava<sup>13</sup> & Shahid Naeem<sup>14</sup>

The most unique feature of Earth is the existence of approximately 9 million types of plants, animals, and other organisms. Two decades ago, at the first Earth Summit, we were dismantling the Earth's ecosystems, and this observation led to the question of how such loss of biodiversity affects our ability to provide society with the goods and services that sustain life.

**Table 1 | Balance of evidence linking biodiversity to ecosystem services**

Category of service	Measure of service provision	SPU	Diversity level	Source	Study type	N	Relationship	
							Predicted	Actual
Provisioning								
Crops	Crop yield	Plants	Genetic	DS	Exp	575		
			Species	DS	Exp	100		
Fisheries	Stability of fisheries yield	Fish	Species	PS	Obs	8		
Wood	Wood production	Plants	Species	DS	Exp	53		
Fodder	Fodder yield	Plants	Species	DS	Exp	271		
Regulating								
Biocontrol	Control of herbivorous pests (bottom-up effect of plant diversity)	Plants	Species	DS*	Obs	40		
		Plants	Species	DS†	Exp	100		
		Plants	Species	DS‡	Exp	287		
		Plants	Species	DS§	Exp	100		
	Control of herbivorous pests (top-down effect of natural enemy diversity)	Natural enemies	Species/trait	DS*	Obs	18		
		Natural enemies	Species	DS†	Exp/Obs	266		
		Natural enemies	Species	DS‡	Exp	38		
	Resistance to plant invasion	Plants	Species	DS	Exp	120		
	Disease prevalence (on plants)	Plants	Species	DS	Exp	107		
	Disease prevalence (on animals)	Multiple	Species	DS	Exp/Obs	45		
Climate	Primary production	Plants	Species	DS	Exp	7		
	Carbon sequestration	Plants	Species	DS	Exp	479		
	Carbon storage	Plants	Species/trait	PS	Obs	33		
Soil	Soil nutrient mineralization	Plants	Species	DS	Exp	103		
	Soil organic matter	Plants	Species	DS	Exp	85		
Water	Freshwater purification	Multiple	Genetic/species	PS	Exp	8		
Pollination	Pollination	Insects	Species	PS	Obs	7		

7 June 2012

# Diversity begets stability

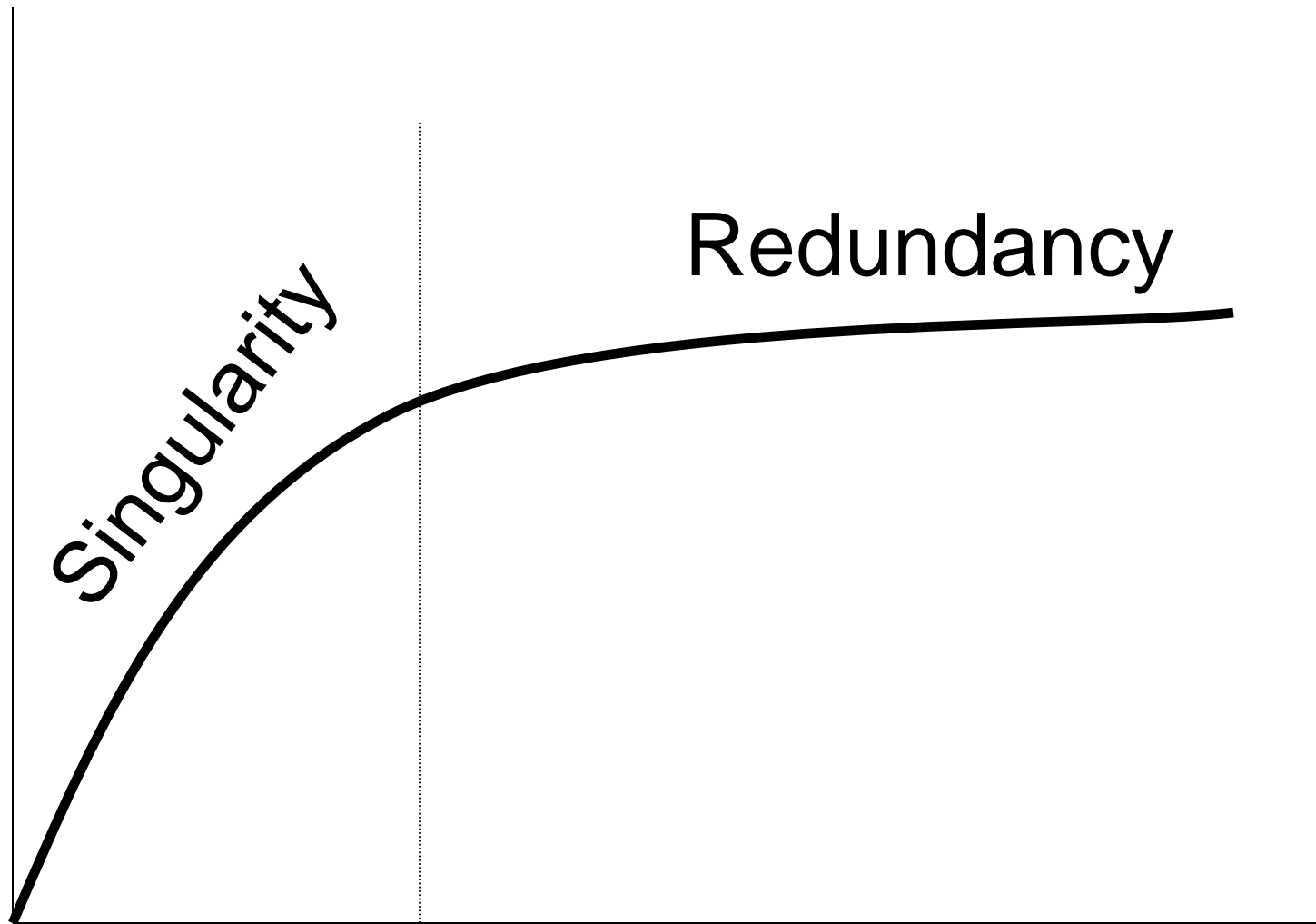
- **Over-yielding** enhances stability when mean biomass production increases with diversity more rapidly than its standard deviation.
- **Statistical averaging** occurs when random variation in the population abundances of different species reduces the variability of aggregate ecosystem variables.
- **Compensatory dynamics** are driven by competitive interactions and/or differential responses to environmental fluctuations among different life forms, both of which lead to asynchrony in their environmental responses

# Resilience

## Carpenter and Folke (2006) *TREE*

- magnitude of exogenous change or disturbance that a system can experience without undergoing a regime shift under specified conditions, functions or processes;
- the degree to which the system can organize itself (versus lack of organization, or organization forced by external factors) and
- the degree to which the system can build and increase the capacity for learning and adaptation

Ecosystem Functioning

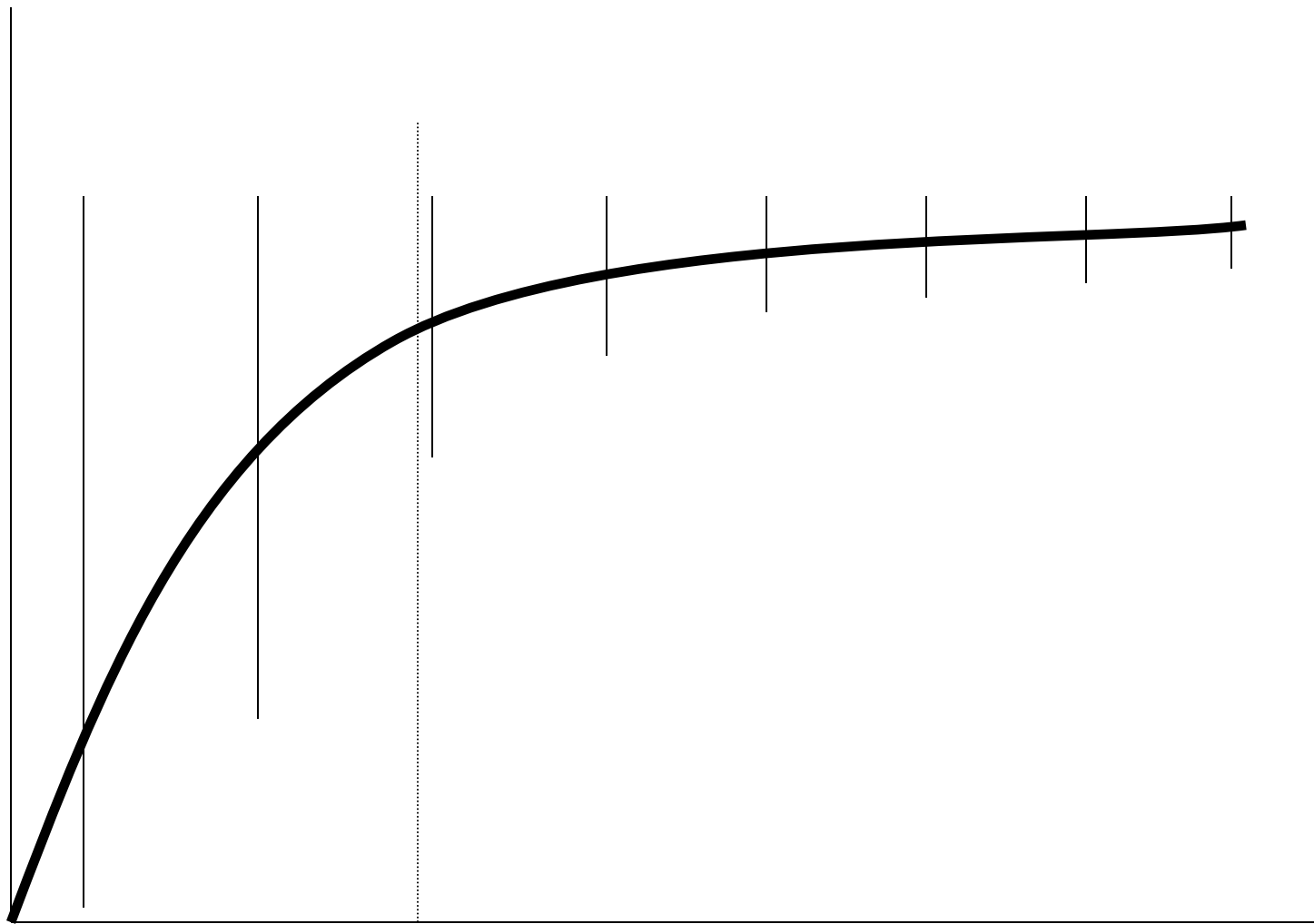


Redundancy

Singularity

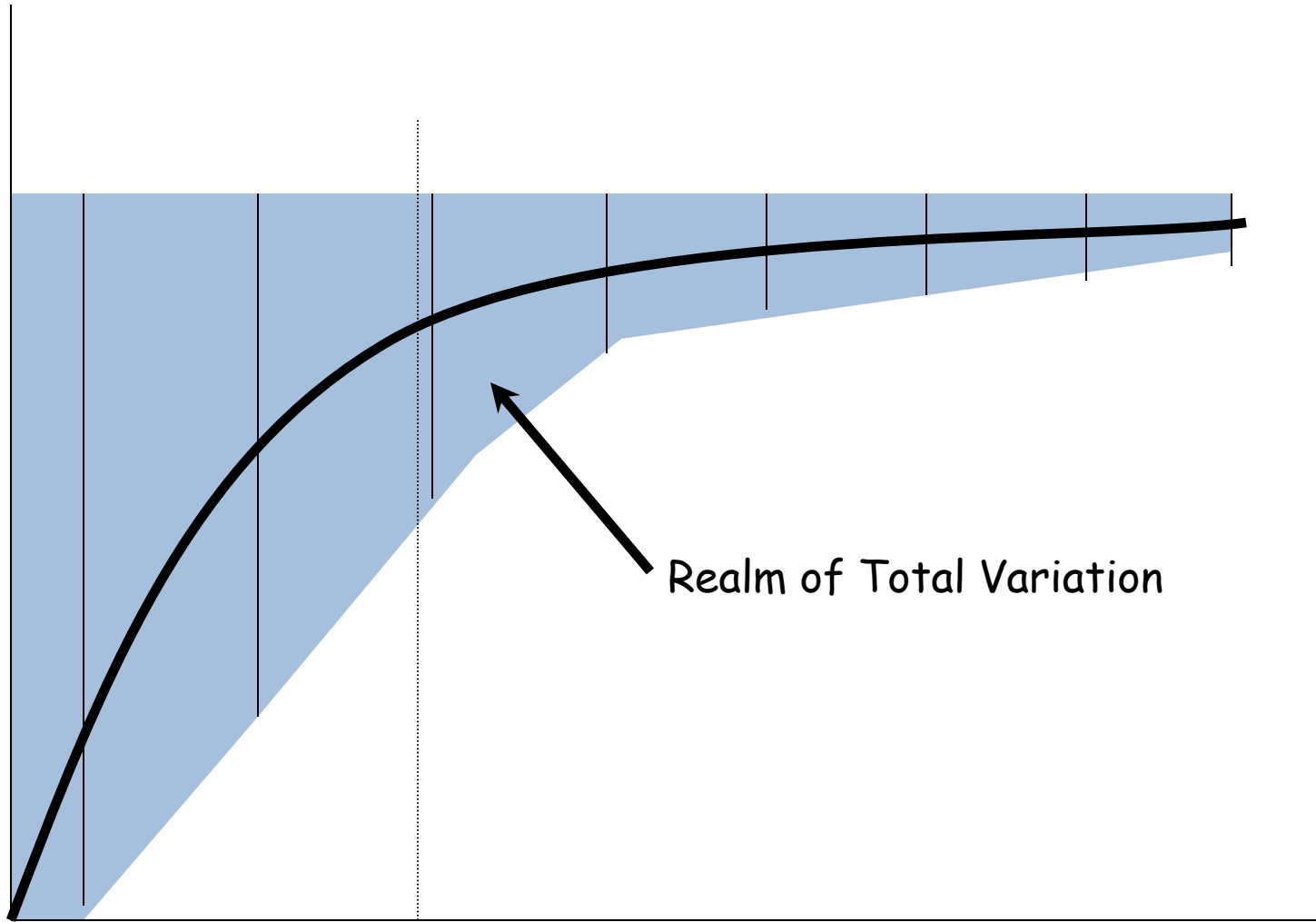
Biodiversity

Ecosystem Functioning



Biodiversity

Ecosystem Functioning

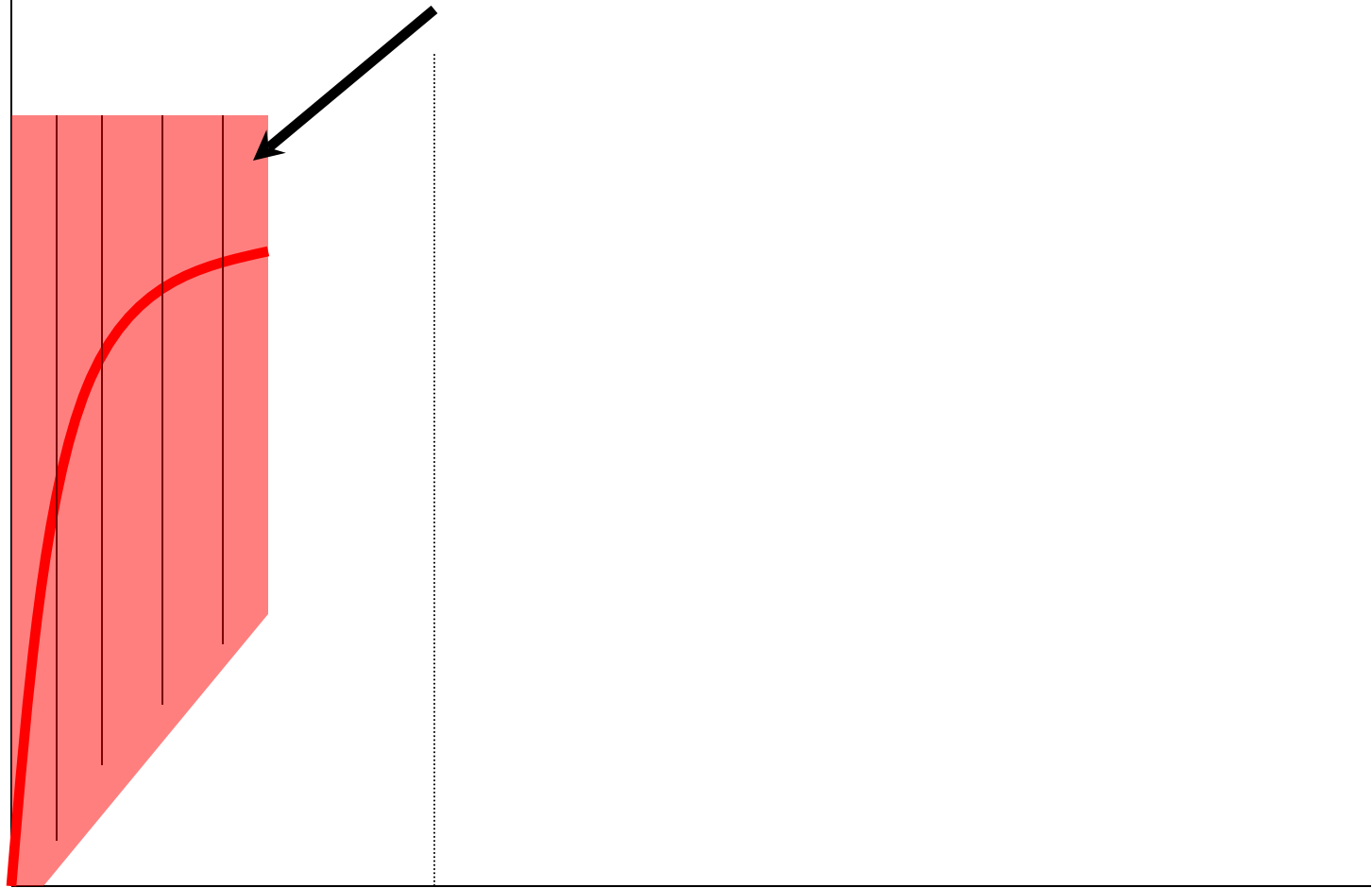


Biodiversity



Ecosystem Functioning

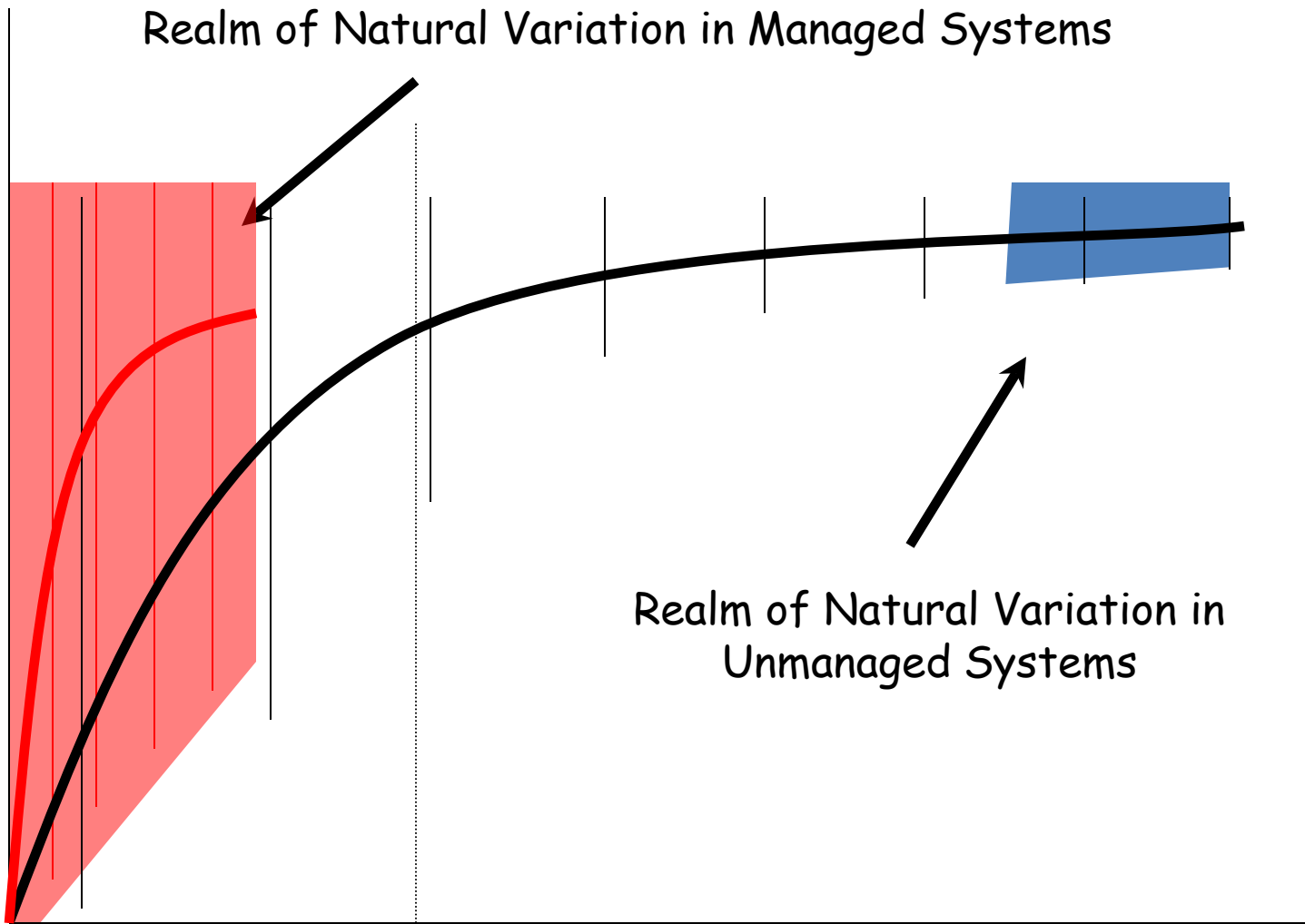
Realm of Natural Variation in *Managed* systems



Biodiversity

Ecosystem Functioning

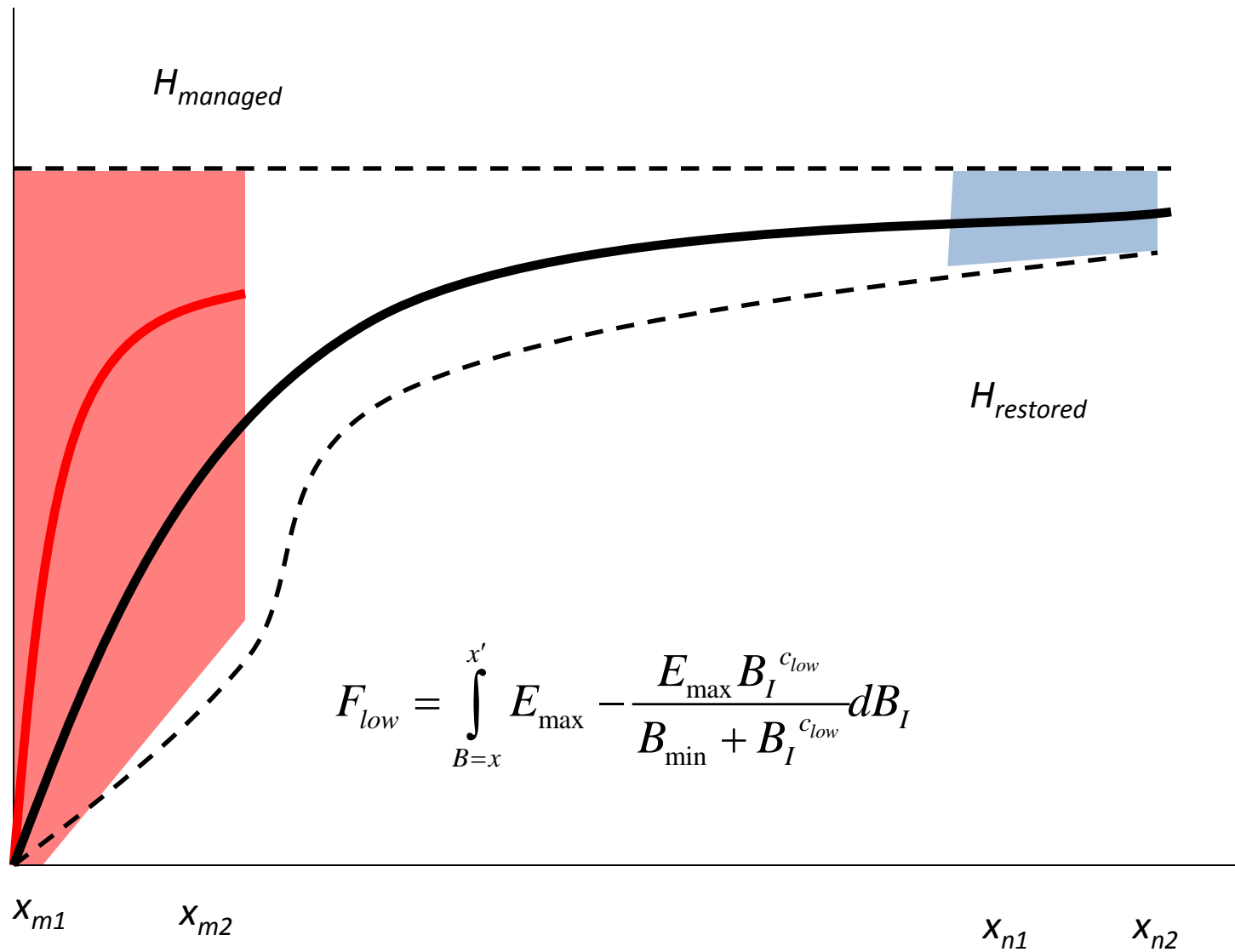
Realm of Natural Variation in Managed Systems



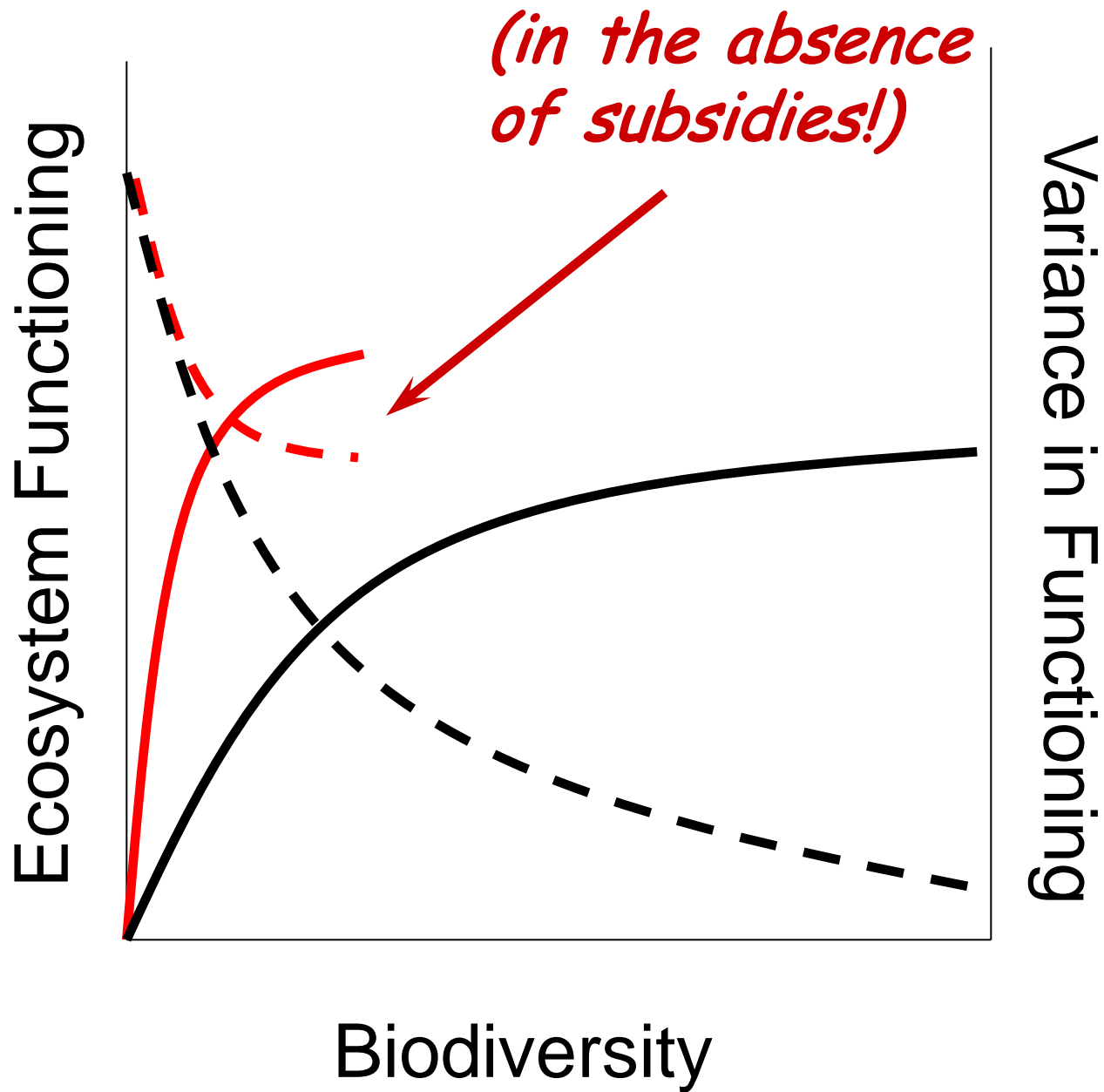
Realm of Natural Variation in Unmanaged Systems

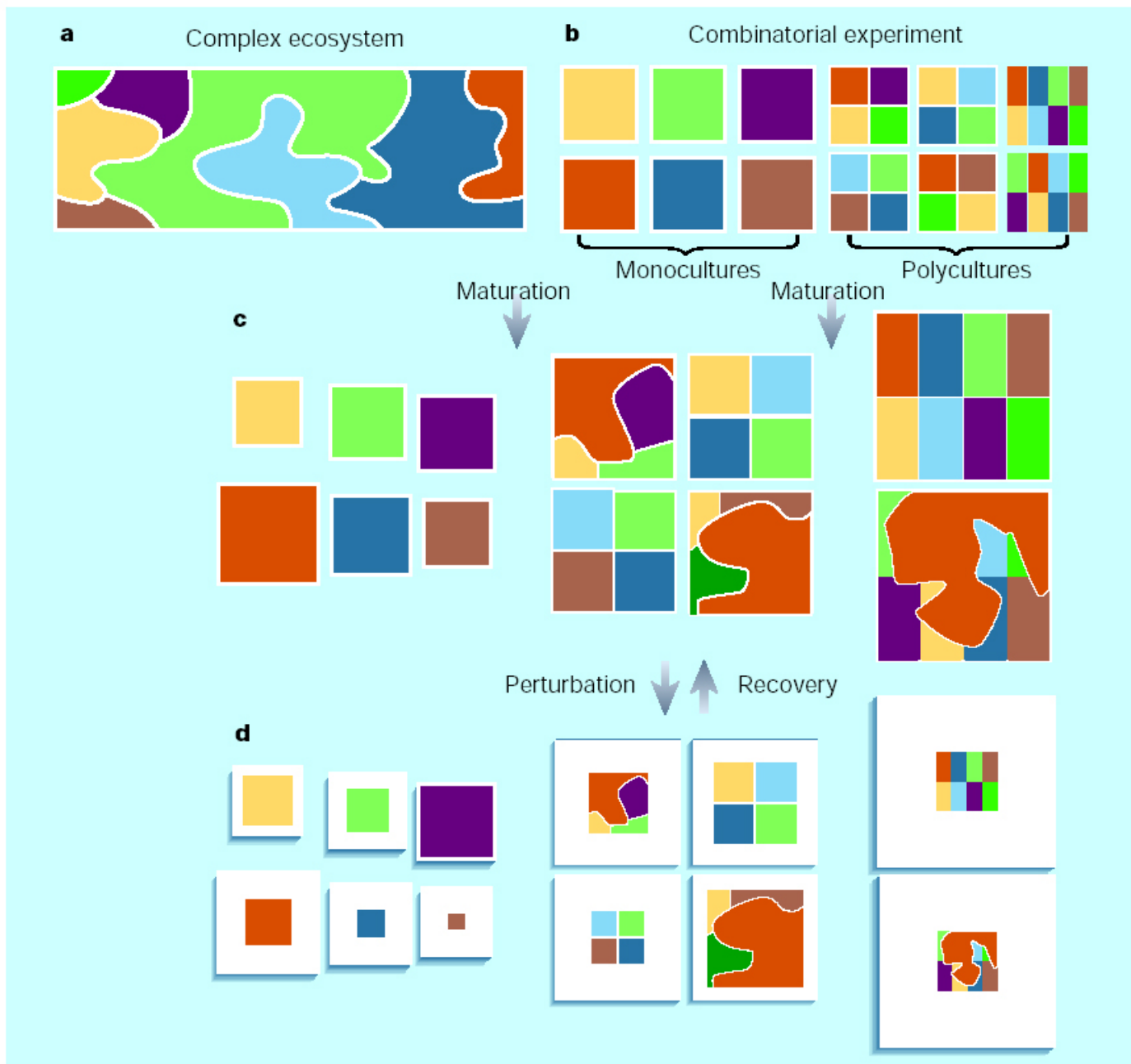
Biodiversity

# Ecosystem Functioning

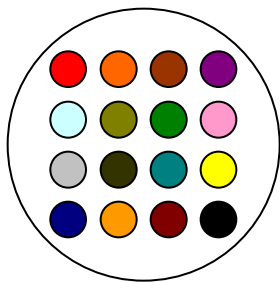
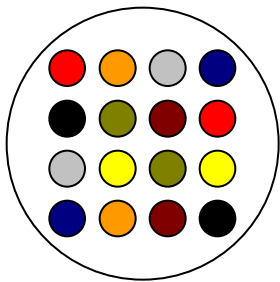
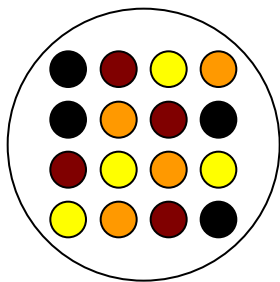
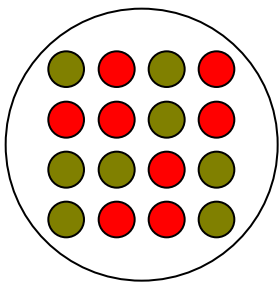
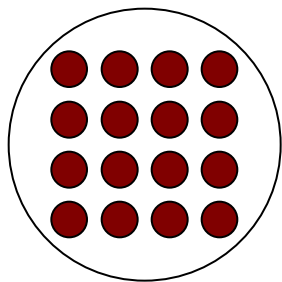
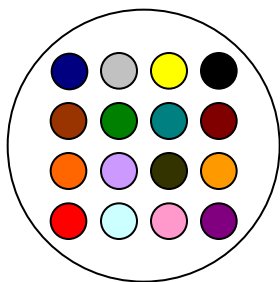
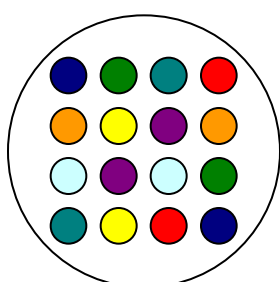
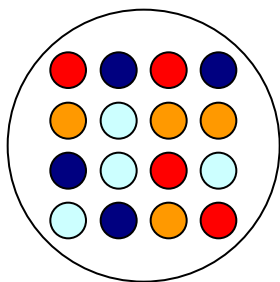
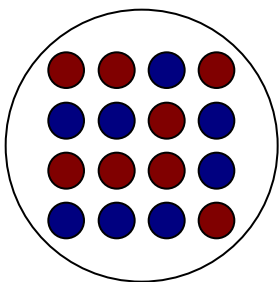
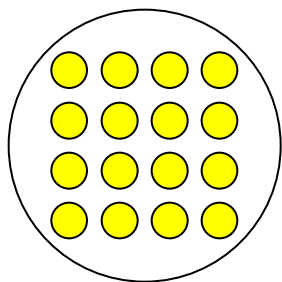
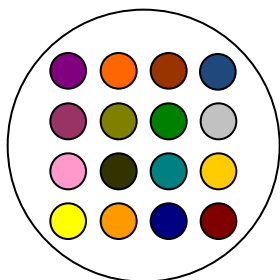
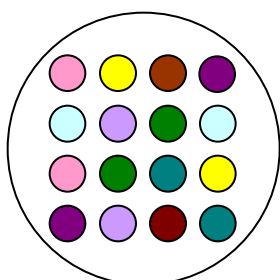
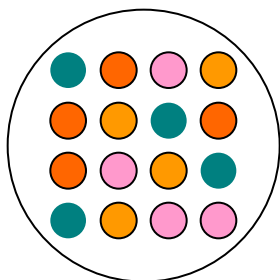
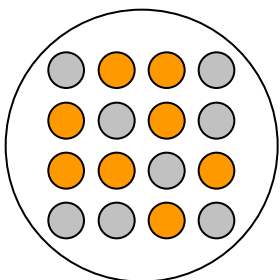
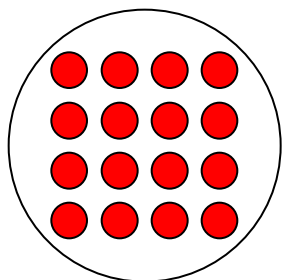
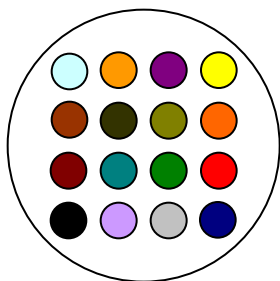
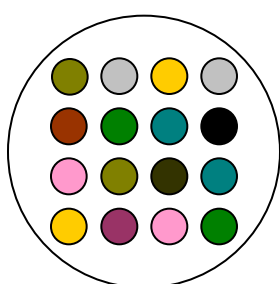
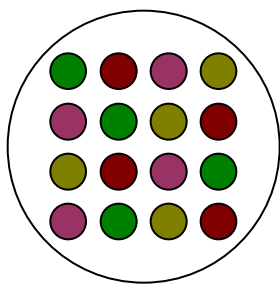
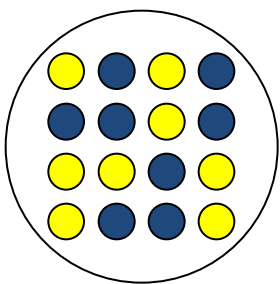
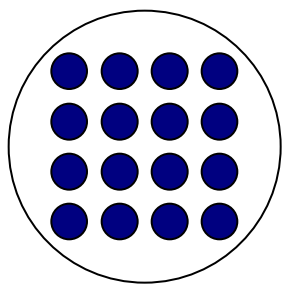


# Biodiversity

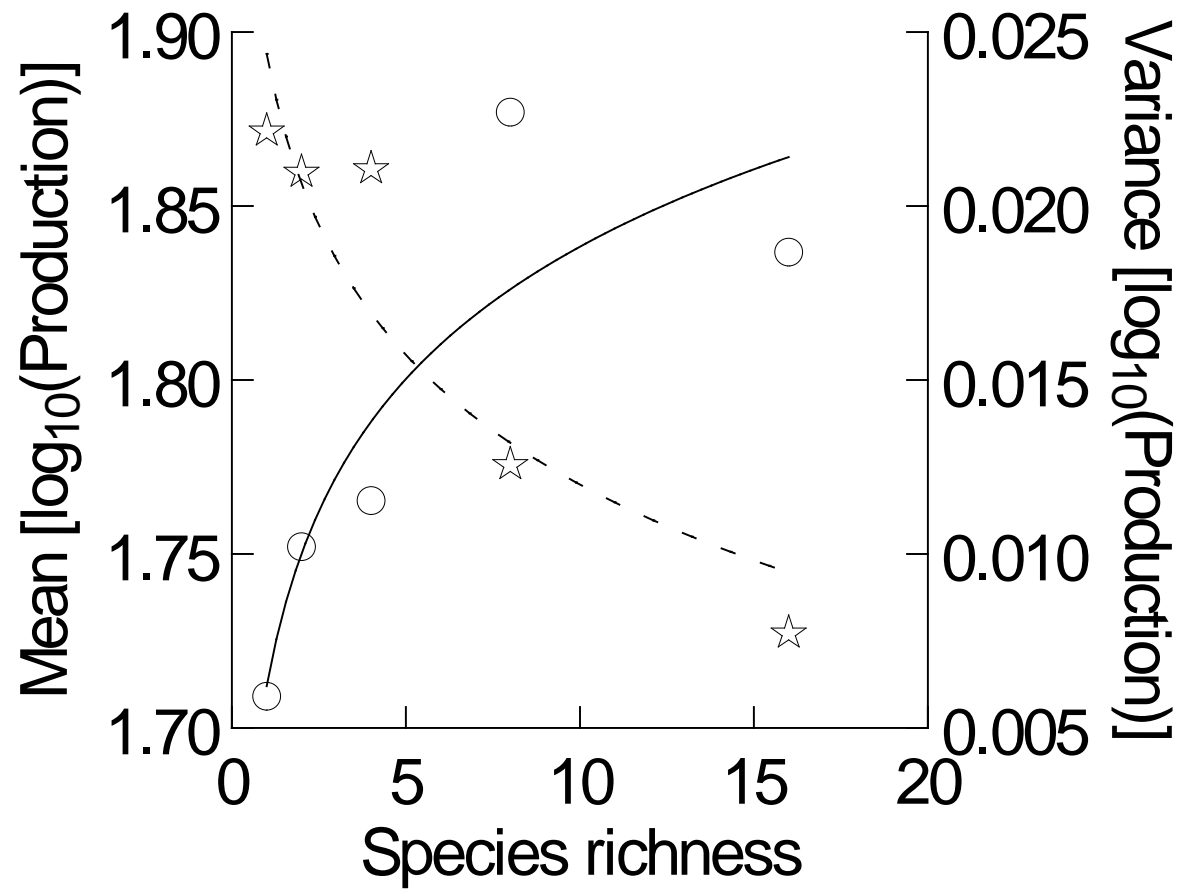








# Above-ground Biomass





# Biodiversity loss and carbon storage in the BCI Forest Dynamics Plot

Daniel E. Bunker<sup>1</sup>, Fabrice De Clerck<sup>2</sup>, Robert K.  
Colwell<sup>3</sup>, Ivette Perfecto<sup>4</sup>, Oliver Phillips<sup>5</sup>, Mahesh  
Sankaran<sup>6</sup> and Shahid Naeem<sup>1</sup>

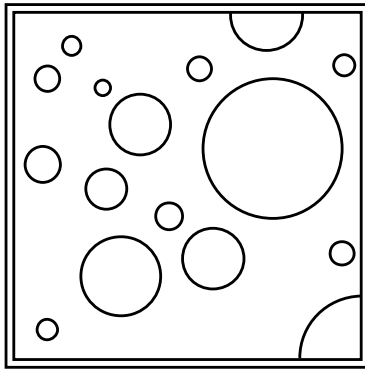
1. Department of Ecology, Evolution and Environmental Biology, Columbia University
2. Earth Institute, Columbia University
3. Department of Ecology and Evolutionary Biology, University of Connecticut
4. School of Natural Resources and Environment, University of Michigan
5. Earth and Biosphere Institute, School of Geography, University of Leeds
6. Natural Resource Ecology Laboratory, Colorado State University

**SPECIES TRAITS**

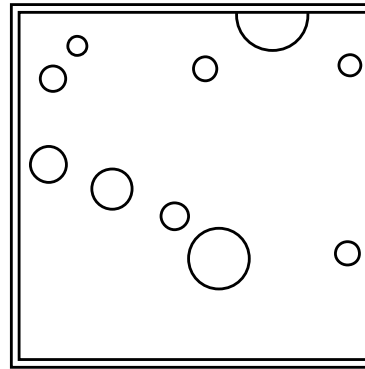
RGR  
DBH  
WOOD DENSITY  
...

**TRAIT-BASED  
EXTINCTION  
SCENARIO**

**CURRENT ECOSYSTEM**

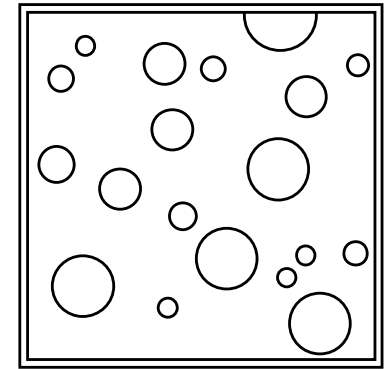


EXTINCTION



COMPENSATORY  
GROWTH  
(BASAL AREA  
RESTORED)

**FUTURE ECOSYSTEM**



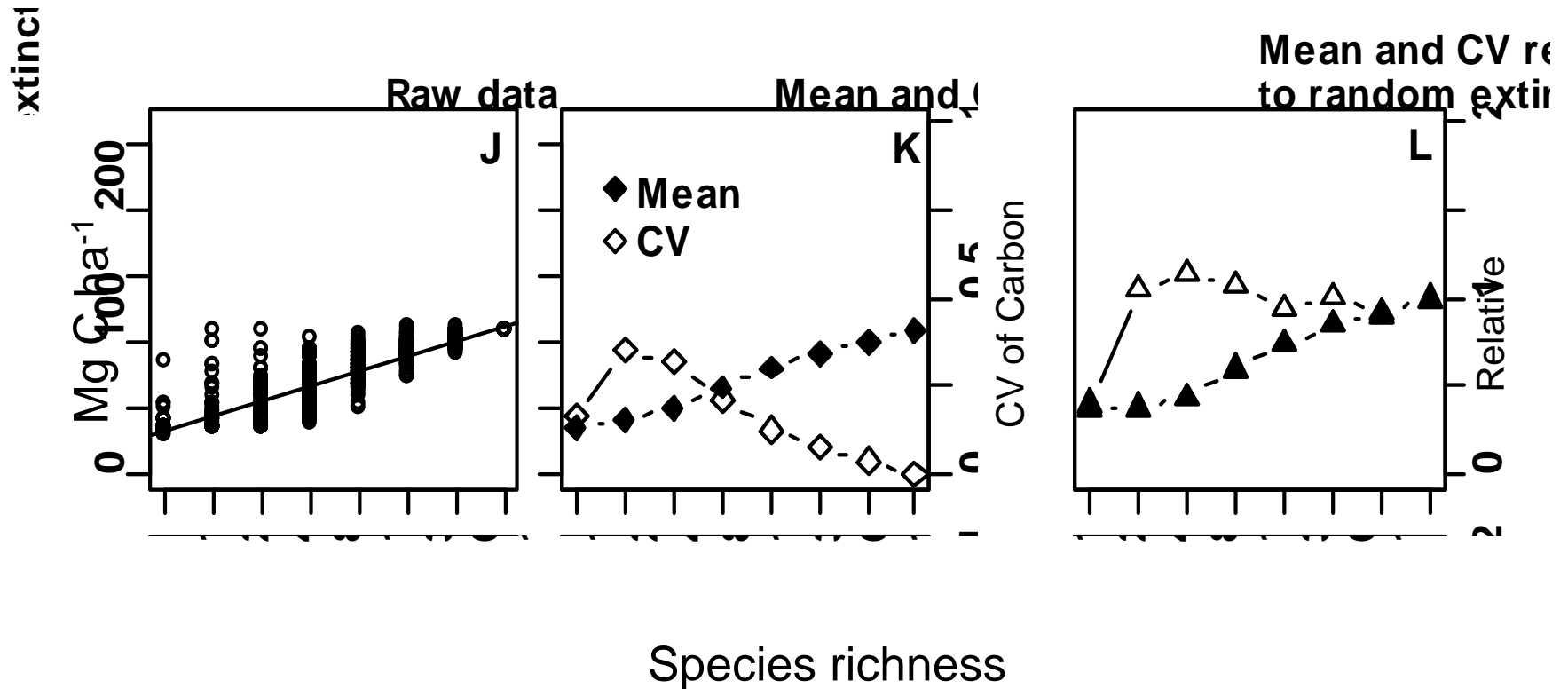
**CURRENT ECOSYSTEM  
PROPERTY / SERVICE**

Standing crop / C storage  
Variability (Standing crop / C storage)

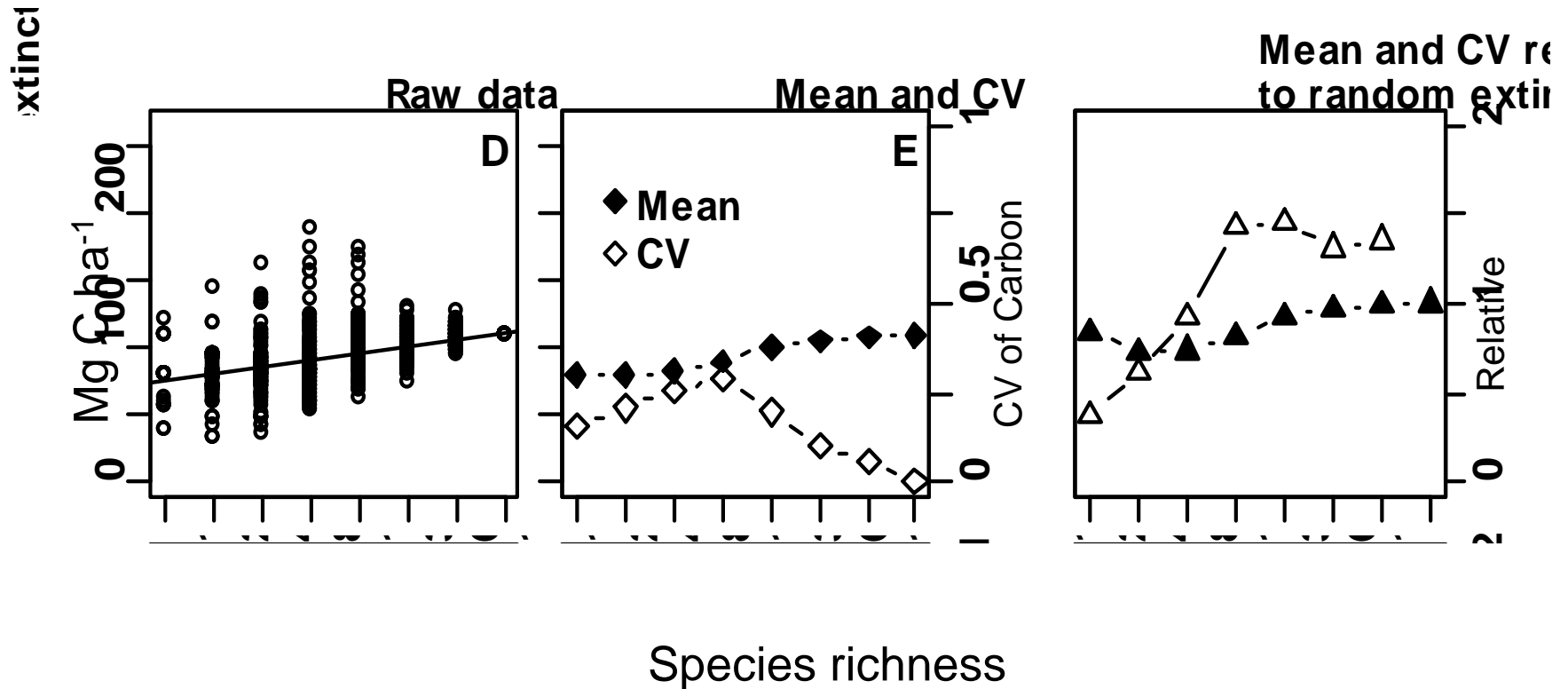
**FUTURE ECOSYSTEM  
PROPERTY / SERVICE**

Standing crop / C storage  
Variability (Standing crop / C storage)

# High wood-density species lost first



# Large-statured species lost first



# Biological Diversity

## What do we mean?

*Ecology*, 92(8), 2011, pp. 1573–1581  
© 2011 by the Ecological Society of America

### Functional and phylogenetic diversity as predictors of biodiversity—ecosystem-function relationships

DAN F. B. FLYNN,<sup>1</sup> NICHOLAS MIROTECHNICK,<sup>2</sup> MEHA JAIN, MATTHEW I. PALMER, AND SHAHID NAEEM

*Department of Ecology, Evolution, and Environmental Biology, Columbia University, 1200 Amsterdam Avenue, Schermerhorn Extension, New York, New York 10027 USA*

**Abstract.** How closely does variability in ecologically important traits reflect evolutionary divergence? The use of phylogenetic diversity (PD) to predict biodiversity effects on ecosystem functioning, and more generally the use of phylogenetic information in community ecology, depends in part on the answer to this question. However, comparisons of the predictive power of phylogenetic diversity and functional diversity (FD) have not been conducted across a range of experiments. To address how phylogenetic diversity and functional trait variation control biodiversity effects on biomass production, we summarized the results of 29 grassland plant experiments where both the phylogeny of plant species used in the experiments is well described and where extensive trait data are available. Functional trait variation was only partially related to phylogenetic distances between species, and the resulting FD values therefore correlate only partially with PD. Despite these differences, FD and PD predicted biodiversity effects across all experiments with similar strength, including in subsets that

# Biological Diversity: What do We Mean?

*What is the best predictor of ecosystem function?*

*S, FD, or PD?*

TABLE 2. Model comparison results of linear mixed models predicting the log response ratio of biomass production for all plots, including with and without legumes and fertilized experimental plots.

Using PD from molecular phylogeny (110 species)				Using PD from angiosperm supertree (121 species)			
Predictor	$R^2$	$w_i$	$n$	Predictor	$R^2$	$w_i$	$n$
All plots			1074	All plots			1419
PD	<b>0.196</b>	<b>0.989</b>		PD	0.223	0.002	
FD[N, height, N-fixation]	0.181	$4.8 \times 10^{-5}$		<b>FD[N, height, N-fixation]</b>	<b>0.223</b>	<b>0.907</b>	
PD + FD[N, height, N-fixation]	0.197	0.01		PD + FD[N, height, N-fixation]	0.229	0.003	
$S$	0.177	$5.5 \times 10^{-6}$		$S$	0.204	$2.3 \times 10^{-8}$	
FGR	0.170	$7.5 \times 10^{-9}$		FGR	0.187	$2.4 \times 10^{-16}$	
No legumes			506	No legumes			636
PD	<b>0.105</b>	<b>0.48</b>		PD	0.123	$2.7 \times 10^{-4}$	
FD[N, height]	0.096	0.146		<b>FD[N, height, SRL]</b>	<b>0.120</b>	<b>0.495</b>	
PD + FD[N, height]	0.107	0.064		PD + FD[N, height, SRL]	0.125	$3.8 \times 10^{-5}$	
$S$	0.097	0.043		$S$	0.110	0.001	
FGR	0.074	$3.3 \times 10^{-6}$		FGR	0.078	$4.8 \times 10^{-9}$	
Fertilized plots			212	Fertilized plots			302
PD	0.186	0.117		PD	0.220	0.002	
<b>FD[height, N-fixation]</b>	<b>0.172</b>	<b>0.216</b>		<b>FD[height, N-fixation]</b>	<b>0.221</b>	<b>0.606</b>	
PD + FD[height, N-fixation]	0.188	0.024		PD + FD[N, height, N-fixation]	0.233	$2.8 \times 10^{-6}$	
$S$	0.161	0.002		$S$	0.204	$2.6 \times 10^{-7}$	
FGR	0.123	$6.7 \times 10^{-5}$		FGR	0.198	$3.5 \times 10^{-10}$	

*But aren't FD, PD, and S all correlated?*

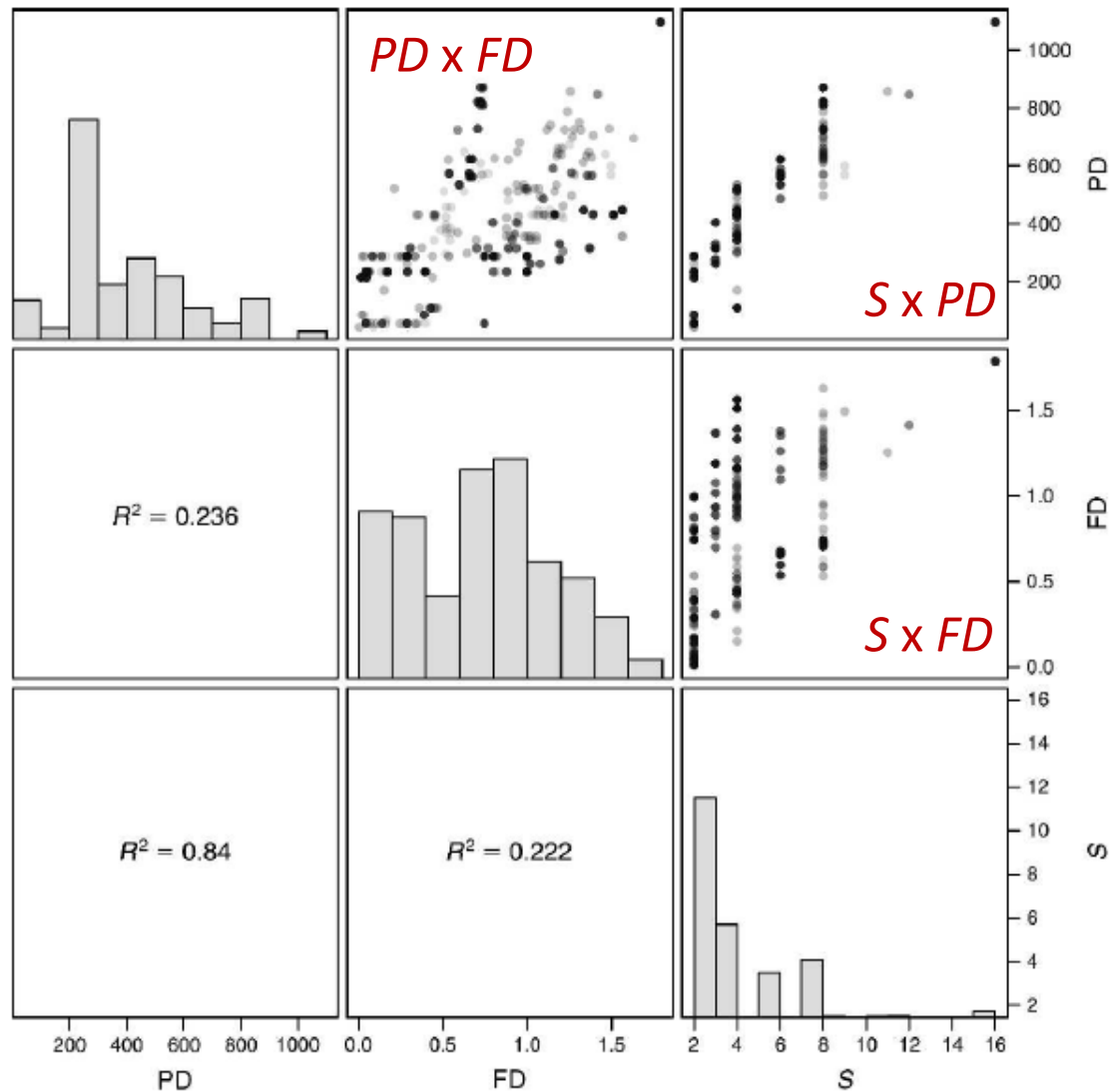


FIG. 2. Relationships between the three continuous measures of biodiversity used in this study. Axes for scatter plots are in units of diversity for each measure. Histograms are shown in the diagonal, with  $R^2$  values shown in the bottom panels. PD and FD values shown are the same as in Fig. 1.

# What is the right dimension of biodiversity?

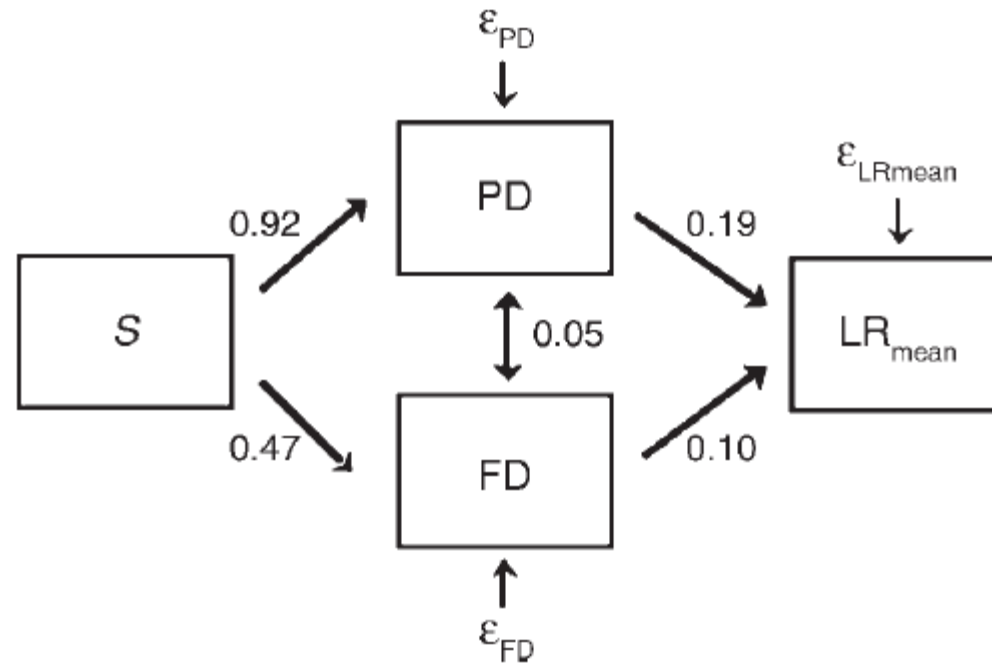


FIG. 3. Best-fit structural equation model combining  $S$ ,  $FD$ , and  $PD$  calculated from the molecular phylogeny, across all plots ( $\chi^2 = 3.37$ ,  $df = 1$ ,  $P = 0.067$ ). The model shown, M8, includes a correlation between  $FD$  and  $PD$ . Model M3, the best model for three subsets of the data, excludes this correlation (see Table 3). Values give the standardized coefficients for the relationship between “upstream” and “downstream” variables; all coefficients are significant. Epsilons represent the error term for downstream variables. See the Appendix for the full set of models.



# A. Biological Capacity

**Journal of Applied Ecology**



British Ecological Society

*Journal of Applied Ecology*

doi: 10.1111/j.1365-2664.2010.01944

## **The effect of agricultural diversity and crop choice on functional capacity change in grassland conversions**

Brenda B. Lin<sup>1,2\*†</sup>, Dan F.B. Flynn<sup>2†</sup>, Daniel E. Bunker<sup>2†</sup>, María Uriarte<sup>2</sup>  
and Shahid Naeem<sup>2</sup>

# GREAT PLAINS PRAIRIE

THIRD IN A SERIES



N A T U R E O F A M E R I C A



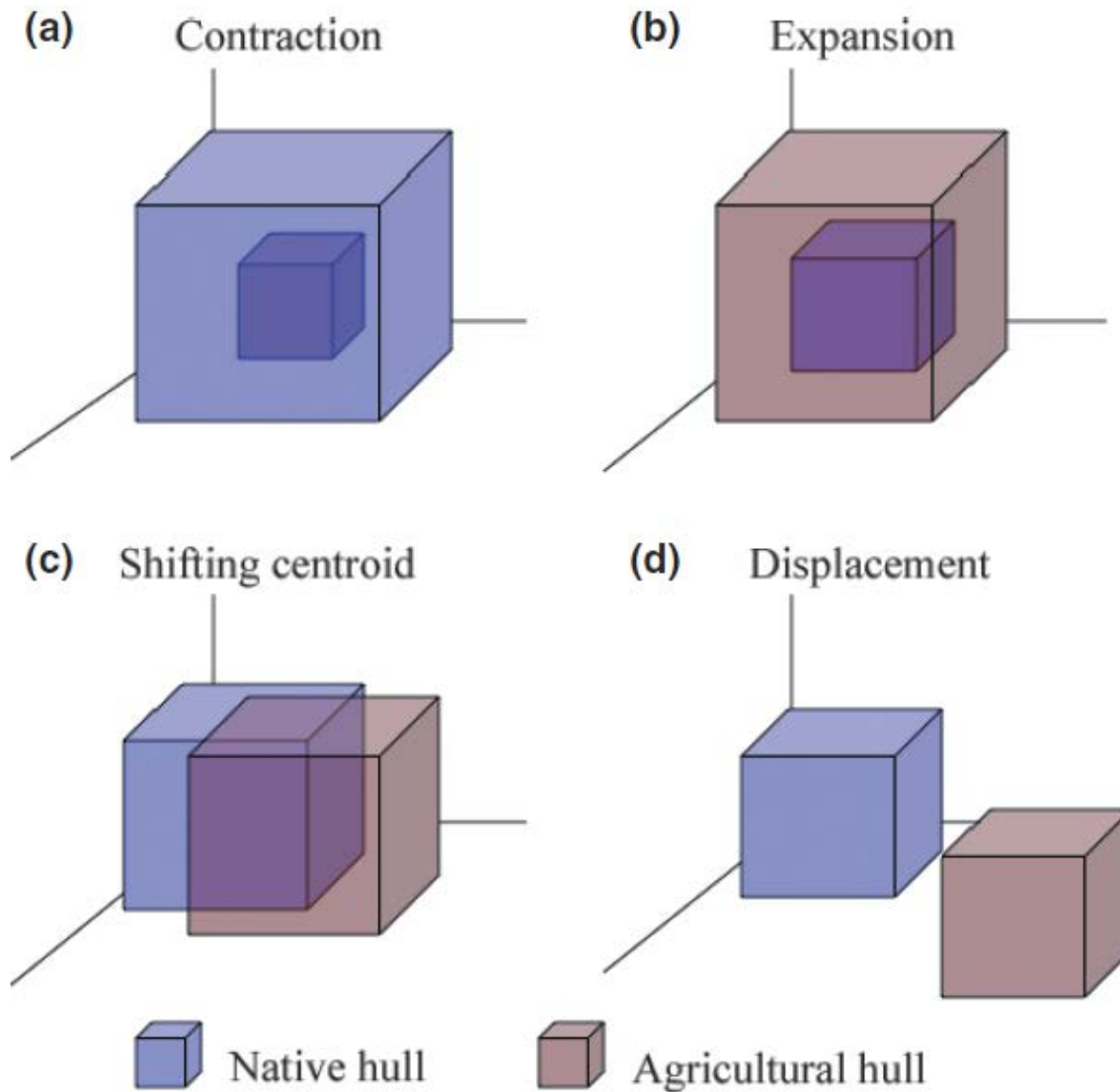


Edenic

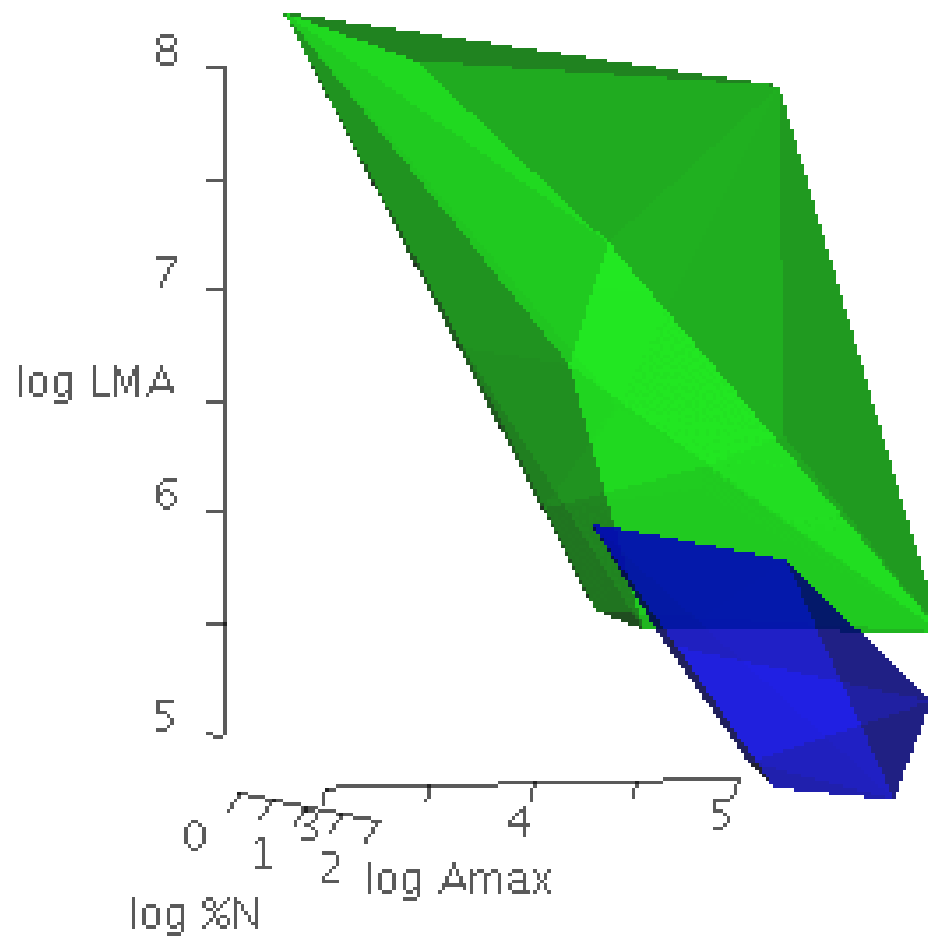


Human-dominated

# Functional (Bio-) Capacity: Functional Trait Volume (FTV): Convex Hull



# All Natives vs. All Agricultural Plants



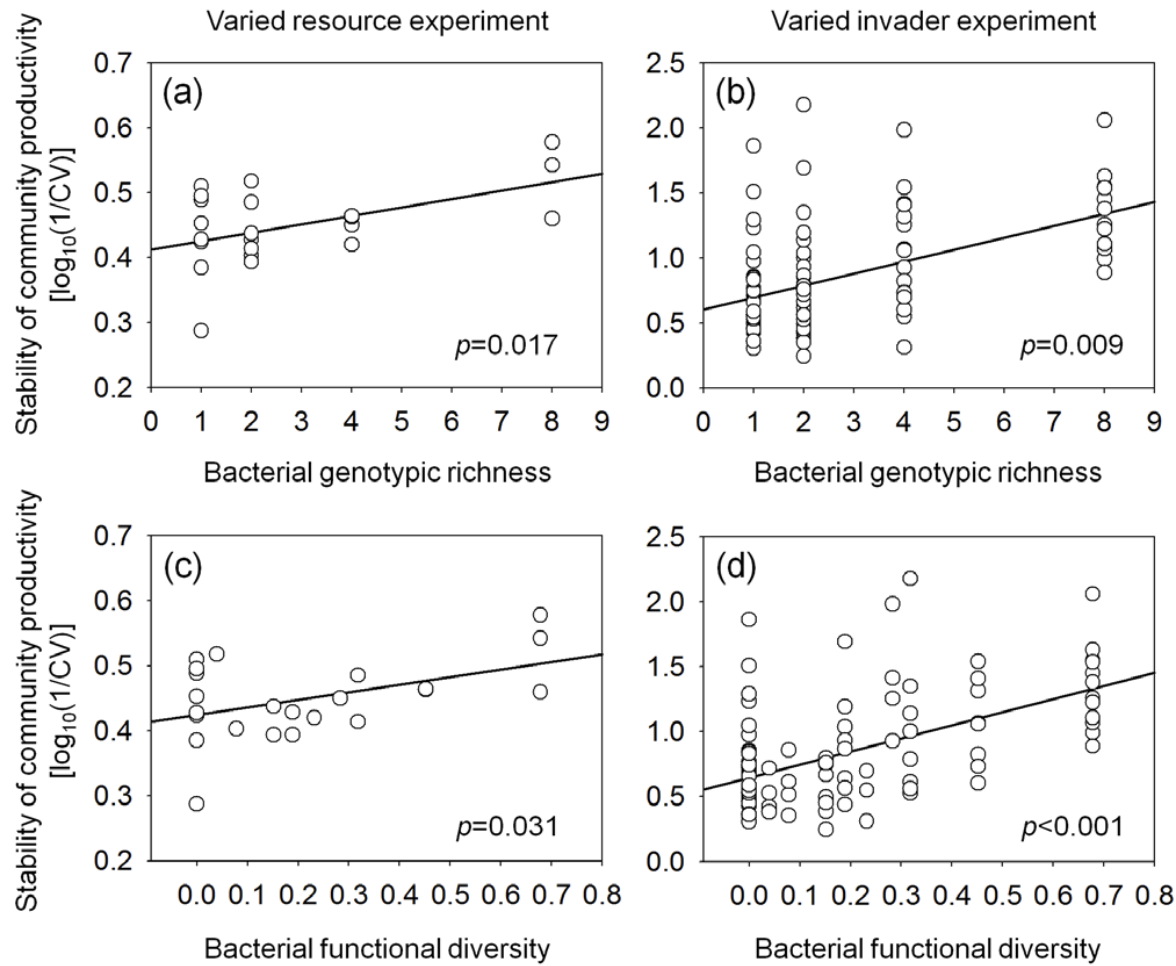
# Eisenhauer *et al.* 2012

- “Microorganisms represent the functional backbone of virtually any ecosystem, and it is essential to understand their response under changing abiotic and biotic conditions.”
- Stability of microbial productivity =  $f(\text{genotypic richness, functional diversity})$
- Stability = reliability = ecosystem function variability across treatments.

# Eisenhauer *et al.* 2012

- 8 *Pseudomonas fluorescens* strains.
- Microbial productivity =  $OD_{600}$
- Varied resources
- Varied invasion by *Serratia liquefaciens* or *Pseudomonas putida*
- Reliability =  $1/CV$
- Functional diversity = 5 carbon sources they could use

# Eisenhauer *et al.* 2012



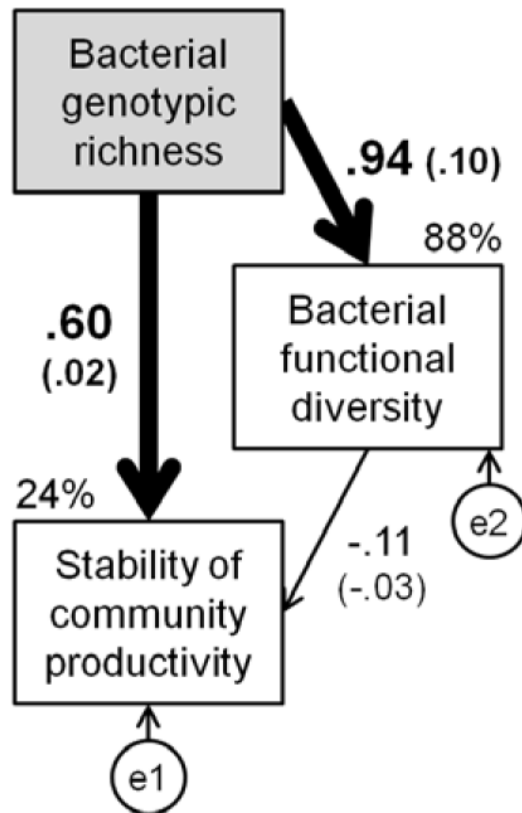
**Figure 1. Stability of community productivity as affected by bacterial genotypic and functional diversity.** Effects of bacterial genotypic (a, b) and functional diversity (c, d) on the stability of community productivity in varied resource environments (1/coefficient of variation of 14 resource treatments) (a, c) and invader treatments (no invader, *Pseudomonas putida* and *Serratia liquefaciens* as model invaders) (b, d). Each circle represents the stability of productivity of a given bacterial community in varied abiotic (a, c) or biotic environments (b, d).



# Eisenhauer *et al.* 2012

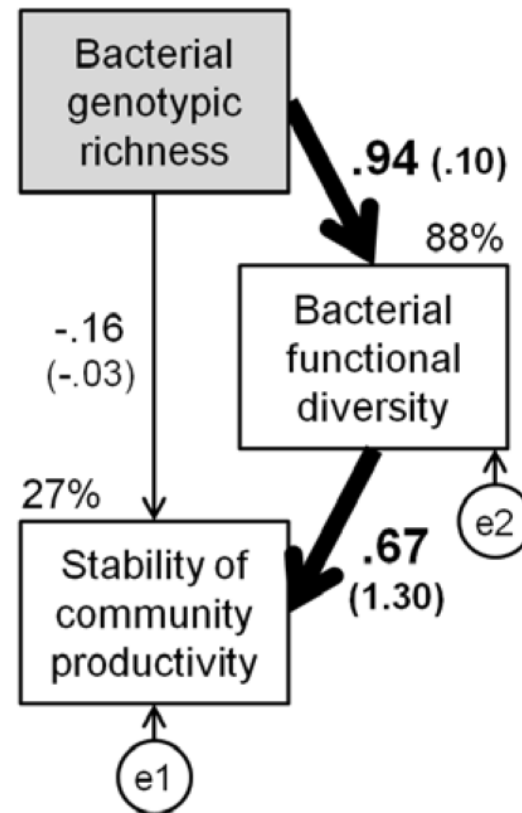
(a)

Varied resource experiment



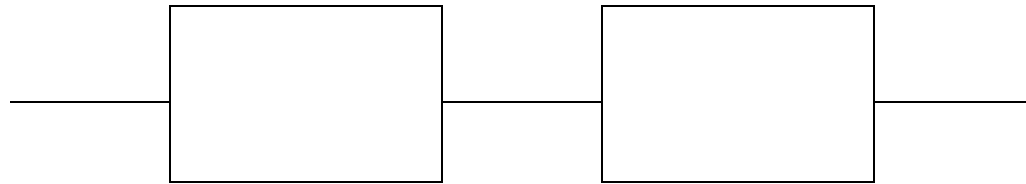
(b)

Varied invader experiment

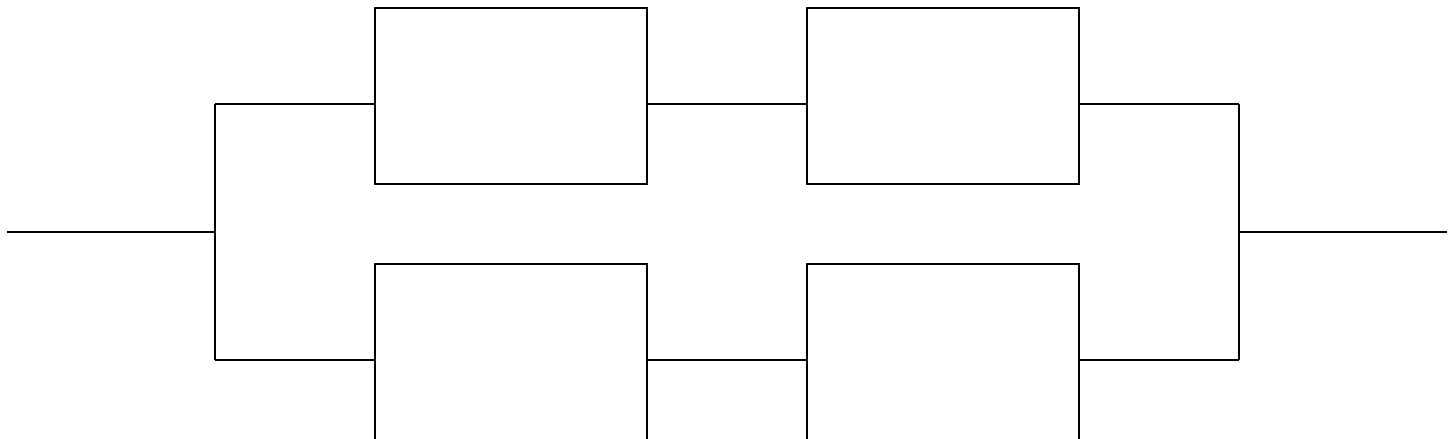


# Ecosystem Reliability

Serial dependency



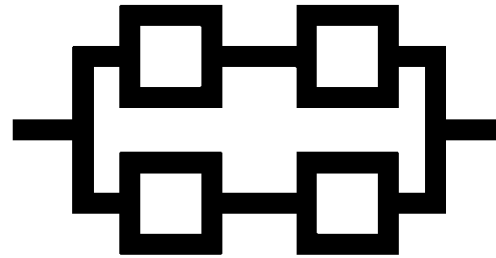
Parallel redundancy



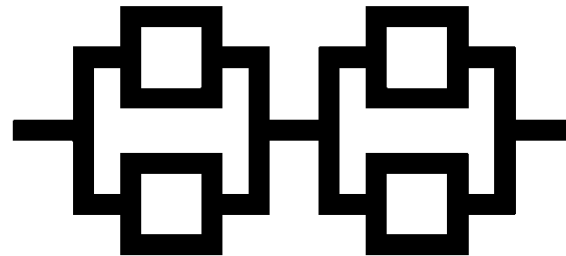
SERIAL



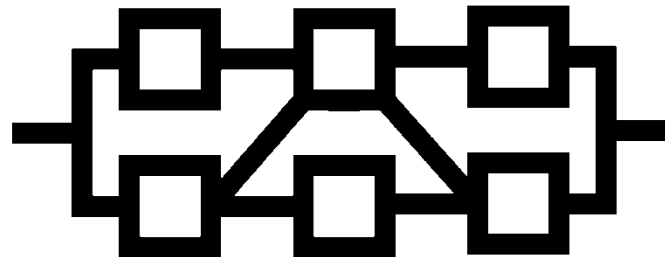
PARALLEL  
REDUNDANCY  
(high level)



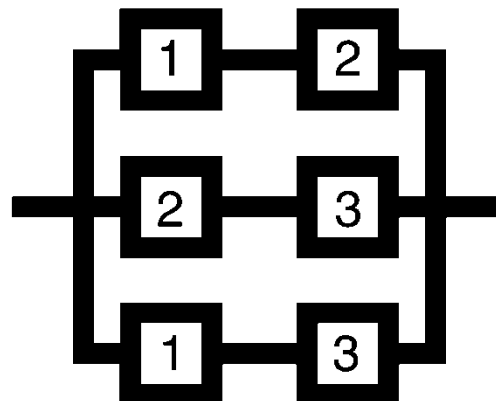
PARALLEL  
REDUNDANCY  
(low level)



LINKED  
REDUNDANCY



m/k  
REDUNDANCY



$$R1(t) := e^{-\lambda \cdot t} \quad (\lambda 1 = 0.1)$$

$$R2(t) := R1(t)^N \quad \text{serial dependency} \quad (N = 10 \text{ components})$$

$$R3(t) := 1 - (1 - R1(t))^N \quad \text{parallel redundant} \quad (N = 10 \text{ components, fully redundant})$$

$$Rls(t) := 2 \cdot e^{-\lambda 2 \cdot t} + e^{-2 \cdot \lambda \cdot t} - 2 \cdot e^{-(\lambda + \lambda 2) \cdot t}$$

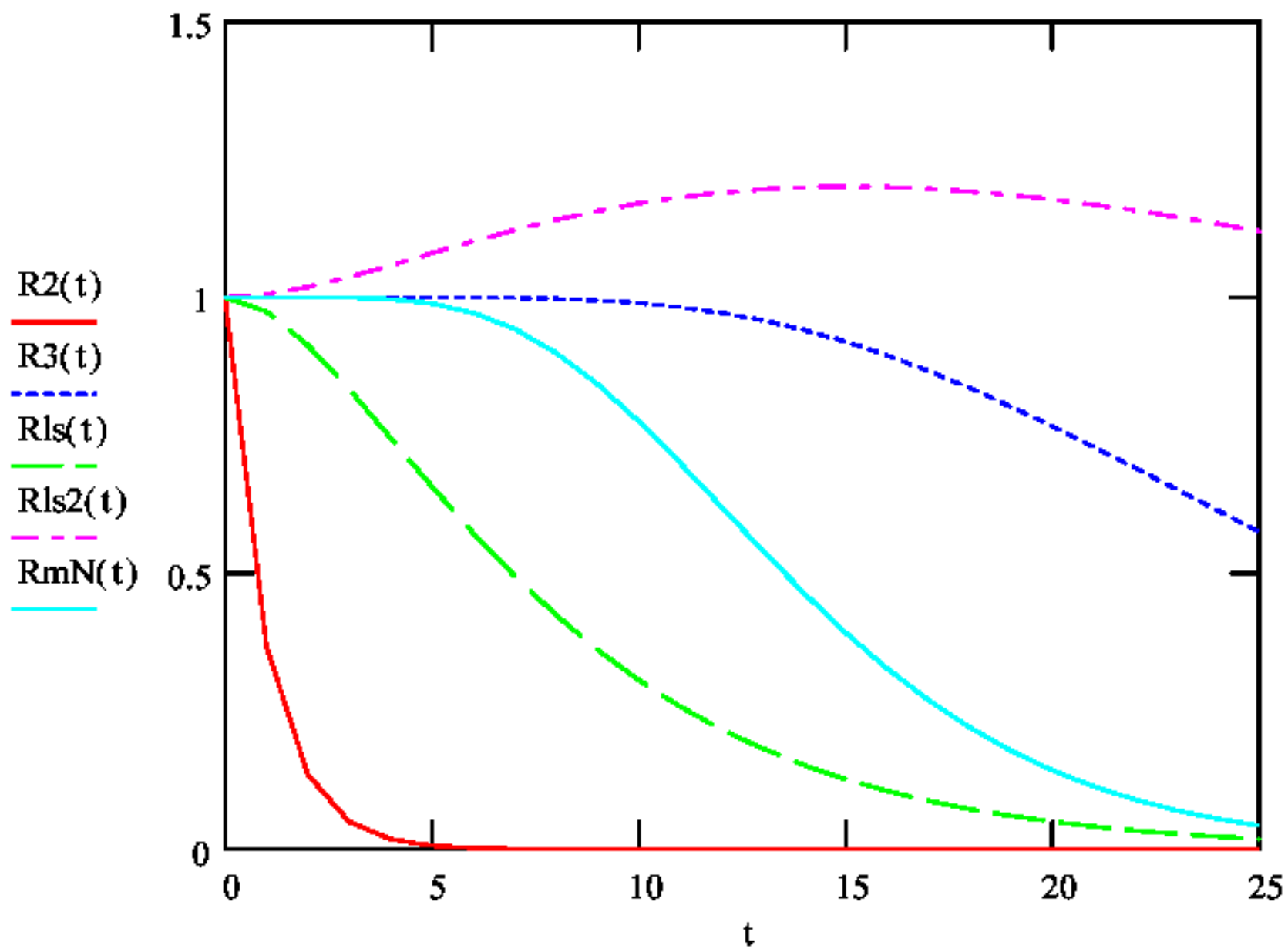
Load sharing for a 2 component system

$(\lambda 1 = 0.1, \lambda 2 = 2 \times \lambda 1, \lambda 3 = 0.2 \times \lambda 1)$

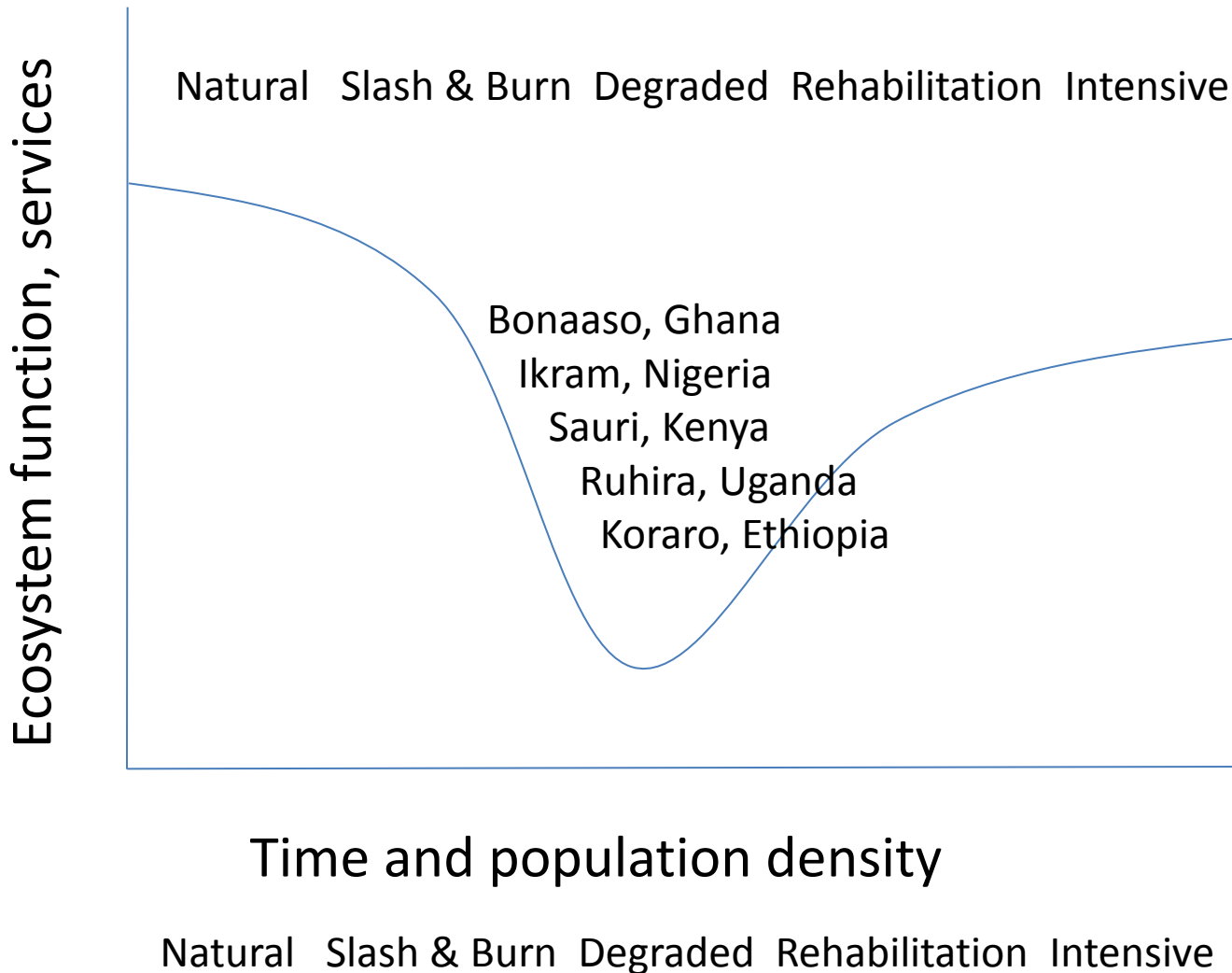
$$Rls2(t) := 2 \cdot e^{-\lambda 3 \cdot t} + e^{-2 \cdot \lambda \cdot t} - 2 \cdot e^{-(\lambda + \lambda 3) \cdot t}$$

$$RmN(t) := 1 - \sum_{n=(N-m+1)}^N \left( \frac{N!}{(N-n)! \cdot n!} \right) \cdot (1 - R1(t))^n \cdot R1(t)^{N-n}$$

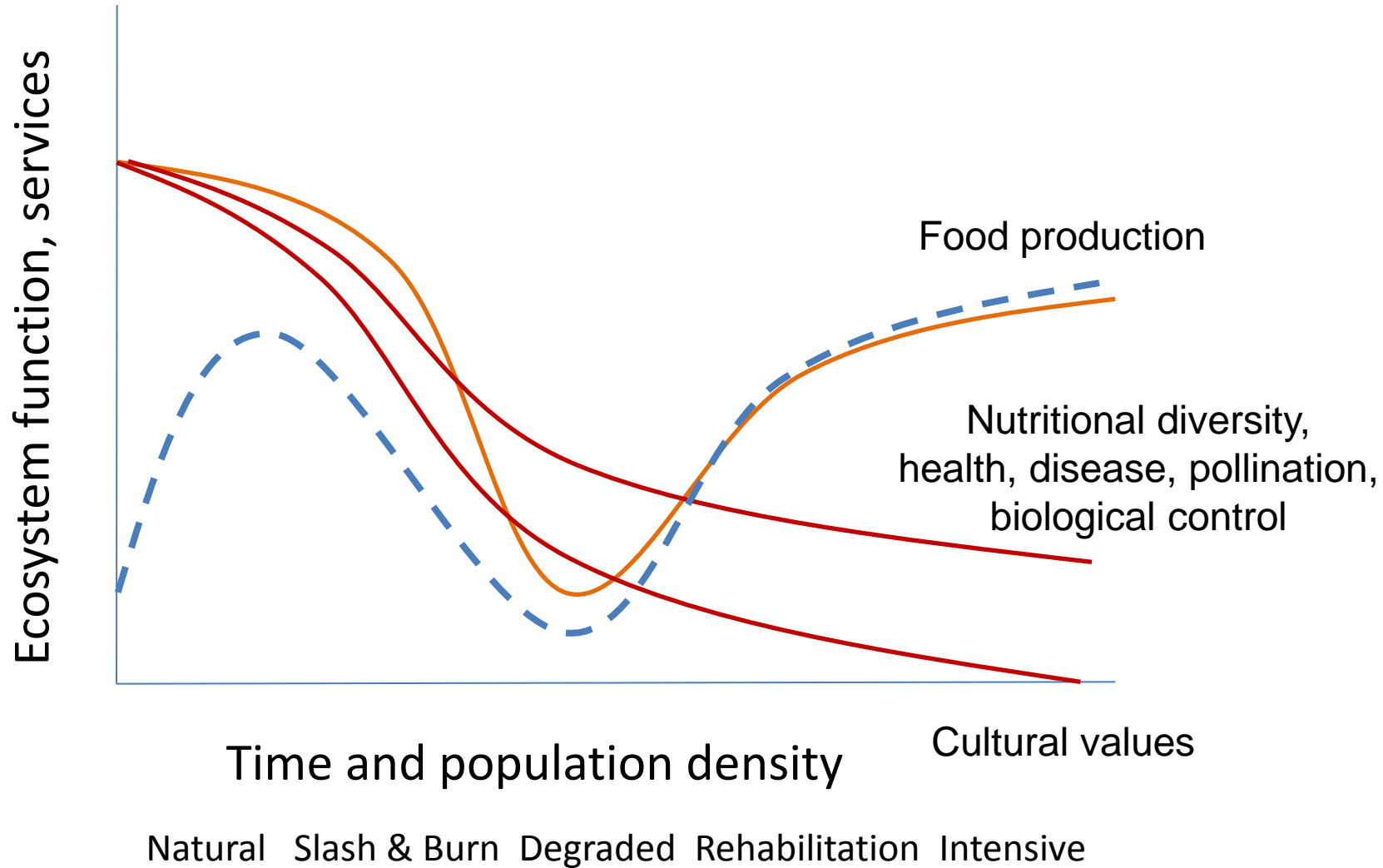
m/N parallel  
 $(m = 3)$



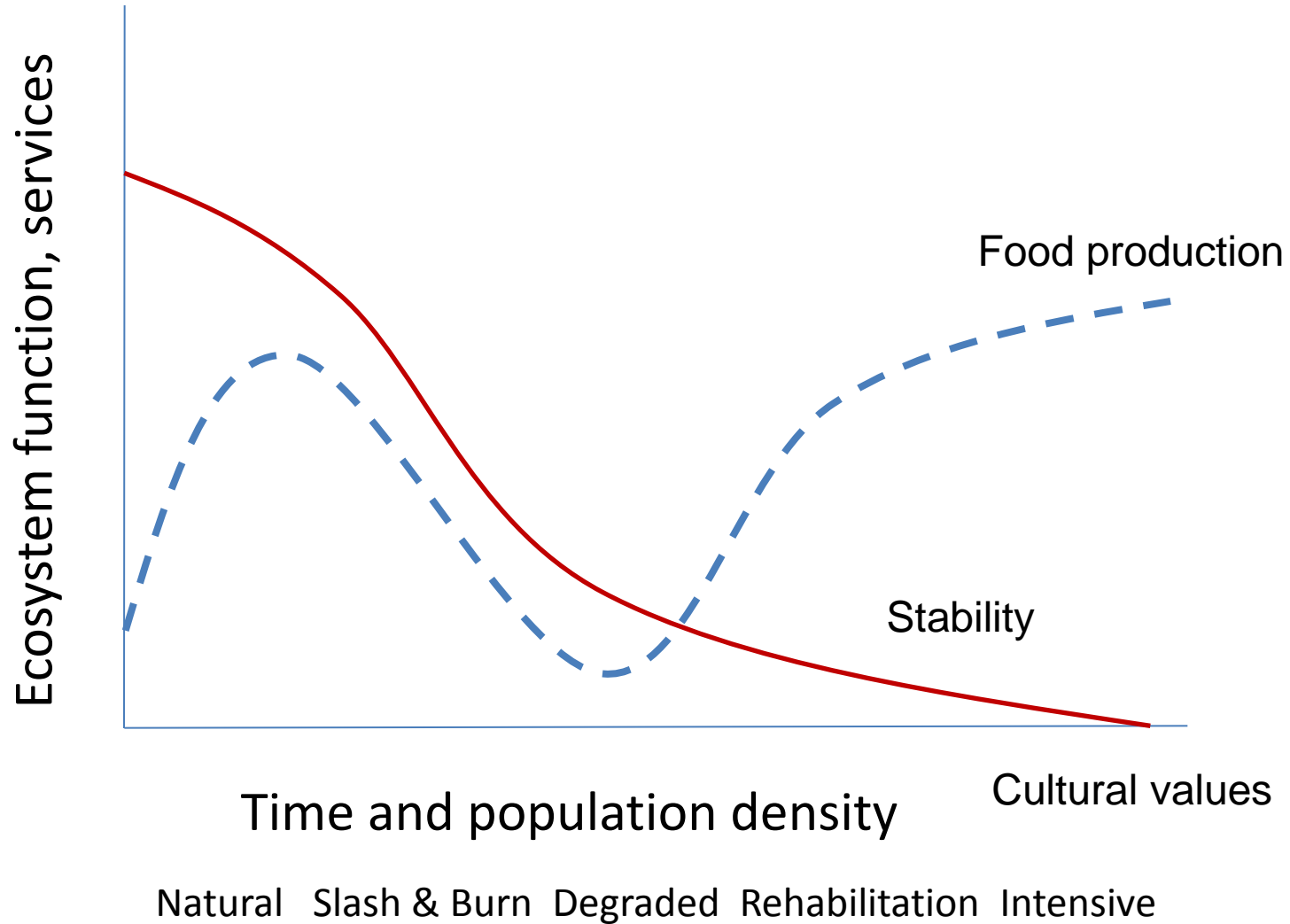
# Ecosystem Services: Time line



Or does the bundle or basket of ecosystem services follow this trajectory?



Or does the bundle or basket of ecosystem services follow this trajectory?





# Summary

- Biodiversity begets stability (lower variability)
  - Over-yielding (mean increases faster than variance)
  - Statistical averaging (portfolio effect)
  - Compensatory dynamics (insurance)
- BEF experiments critical, yet not done with agriculture – can we extrapolate?
- Biodiversity has many dimensions
  - They all correlate
  - They have different effects on resilience
  - We need to assemble universally accessible databases for taxonomy, phylogeny, and traits
- Reliability is important for interconnected systems (soil invertebrate/microbial communities)
- Resilience has multiple meanings
  - Ecological resilience – short return time
  - Holling-type resilience – resisting regime shifts, reorganization, structural failure