## A structural stability approach to understand species coexistence

### Chuliang Song

Department of Civil and Environmental Engineering, MIT

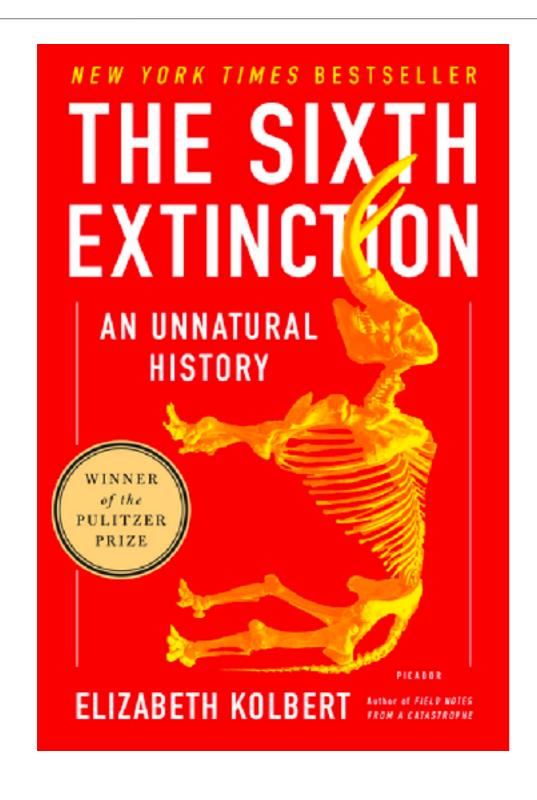


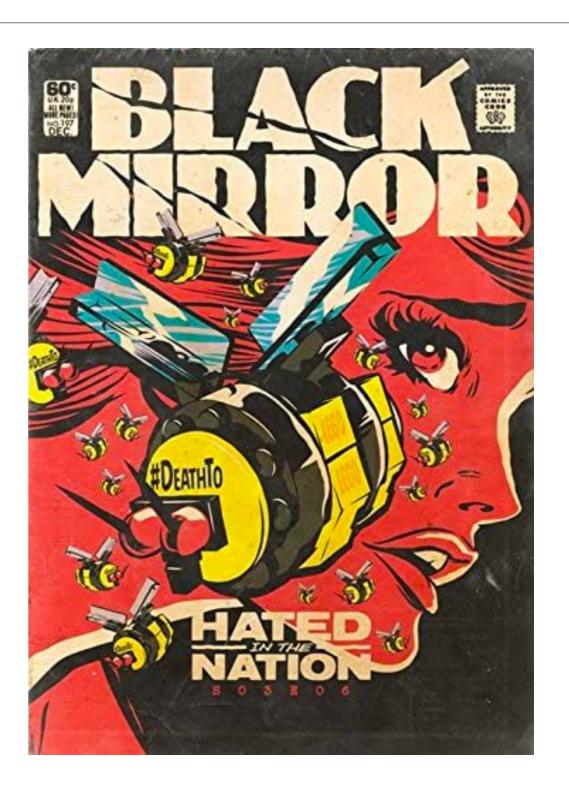
CForBio讲坛 06/18/2020

### Biodiversity is under threat



#### Biodiversity loss triggers the domino effects





## No species is an island



Competitive





Antagonistic



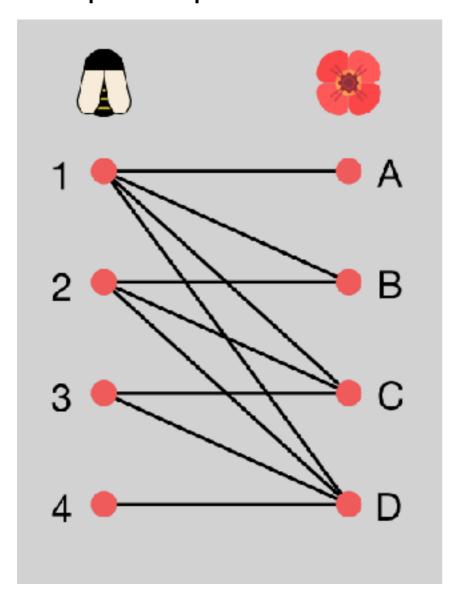


Mutualistic

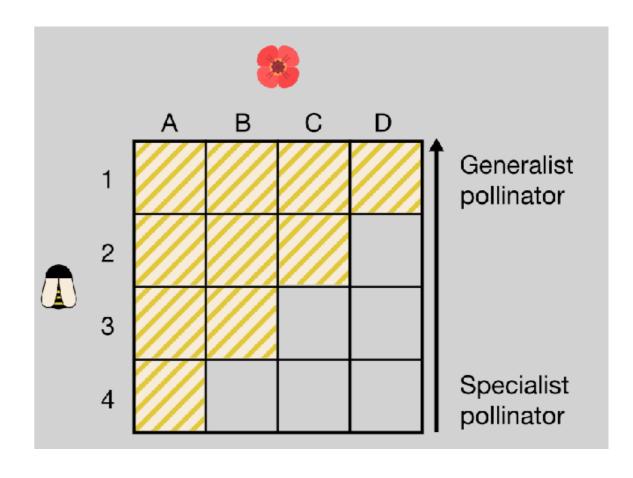


# Ecological network structure = The organization of species interactions

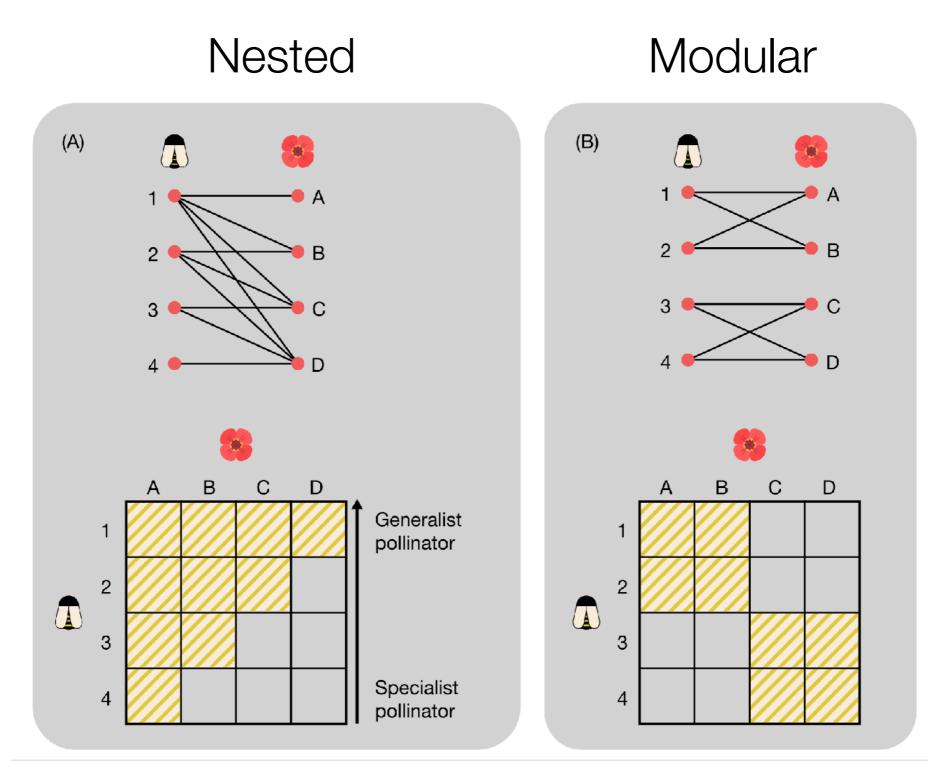
#### Graph representation



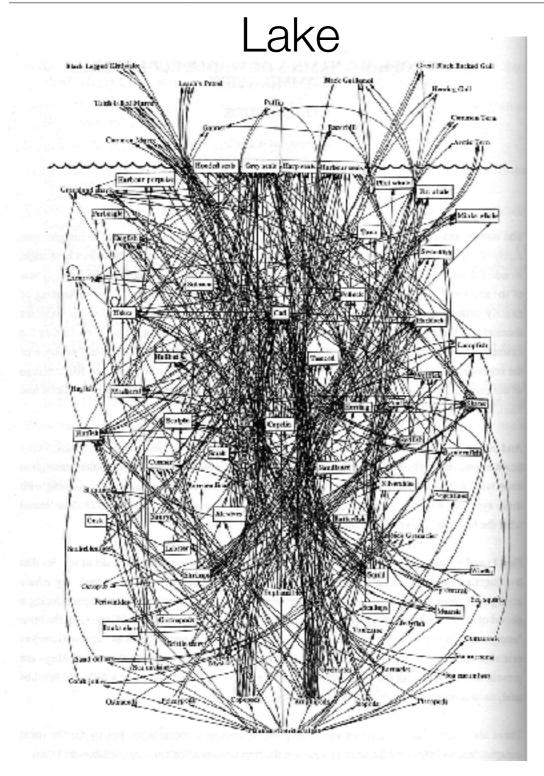
#### Matrix representation

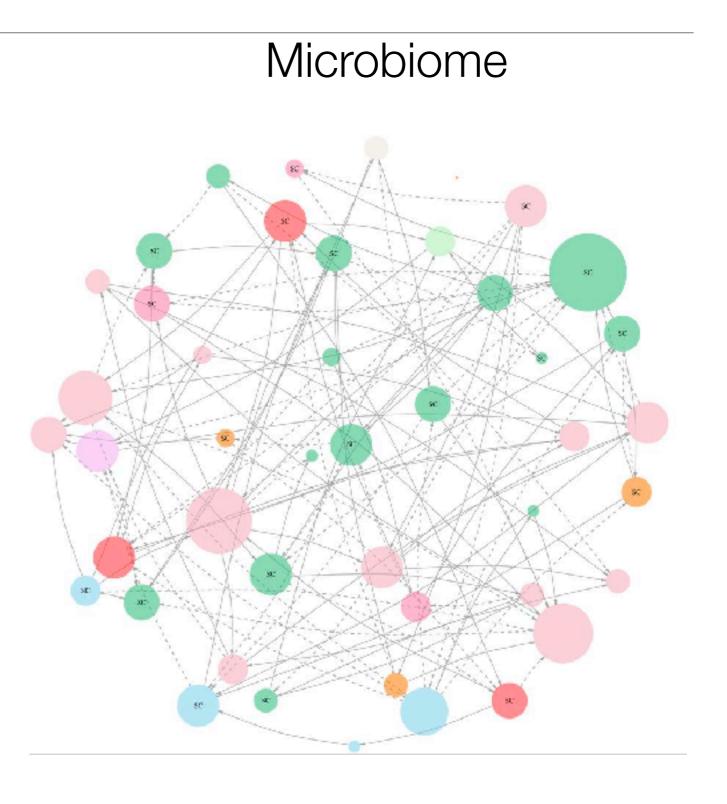


#### Examples of ecological network structures



#### Complexity of ecological network structures





A central research line in community ecology to understand biodiversity

## Network structure

(The organization of species interactions)

Ecological dynamics

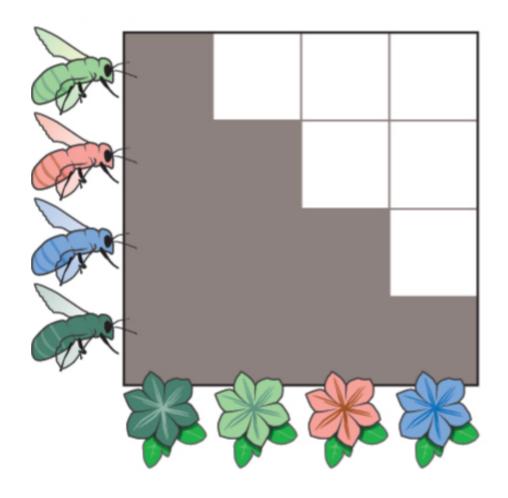


(All species coexist without extinctions)

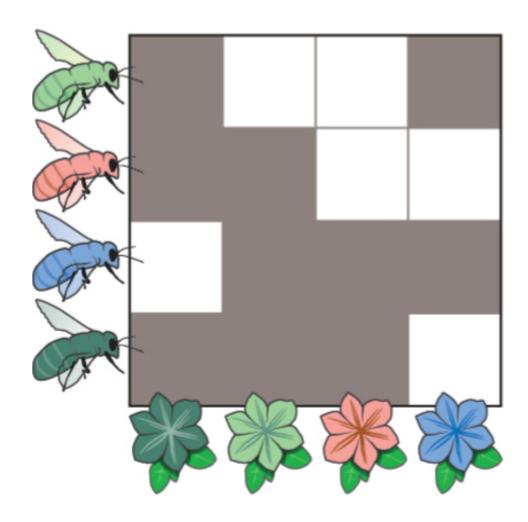
# Emerging debates on this research line

#### Nested pattern in mutualistic community

#### Perfectly nested



#### Random

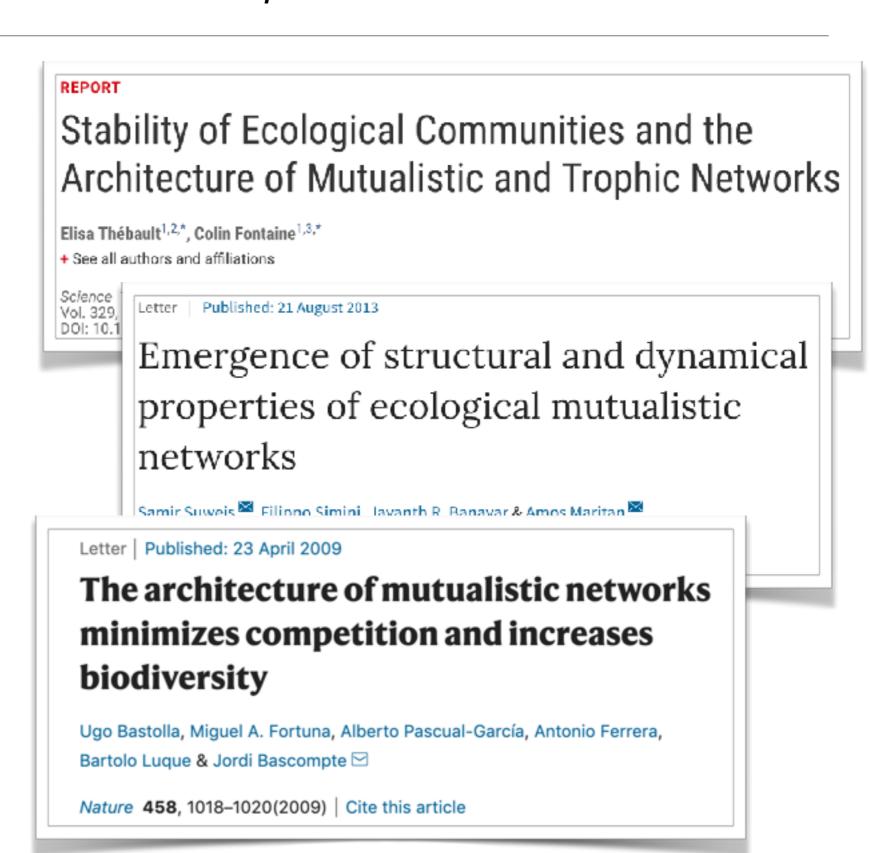


### One school of thought: Eureka! Nestedness is so important.

#### **Nestedness**

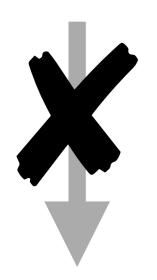


#### Persistence



### Another school of thought: Nestedness has nothing to do with persistence

#### **Nestedness**



Persistence



The Effect of Intra- and Interspecific Competition on Coexistence in Multispecies Communities

György Barabás, 1,\* Matthew J. Michalska-Smith, 1 and Stefano Allesina 1,2,1

# And another school of thought: NO strong evidence for nestedness!



#### **Persistence**

The ghost of nestedness in ecological networks

Phillip P. A. Staniczenko M, Jason C. Kopp & Stefano Allesina

Nature Communications 4, Article number: 1391 (2013) | Download Citation ±

Breaking the Spell of Nestedness: The Nestedness in Mutualistic Systems

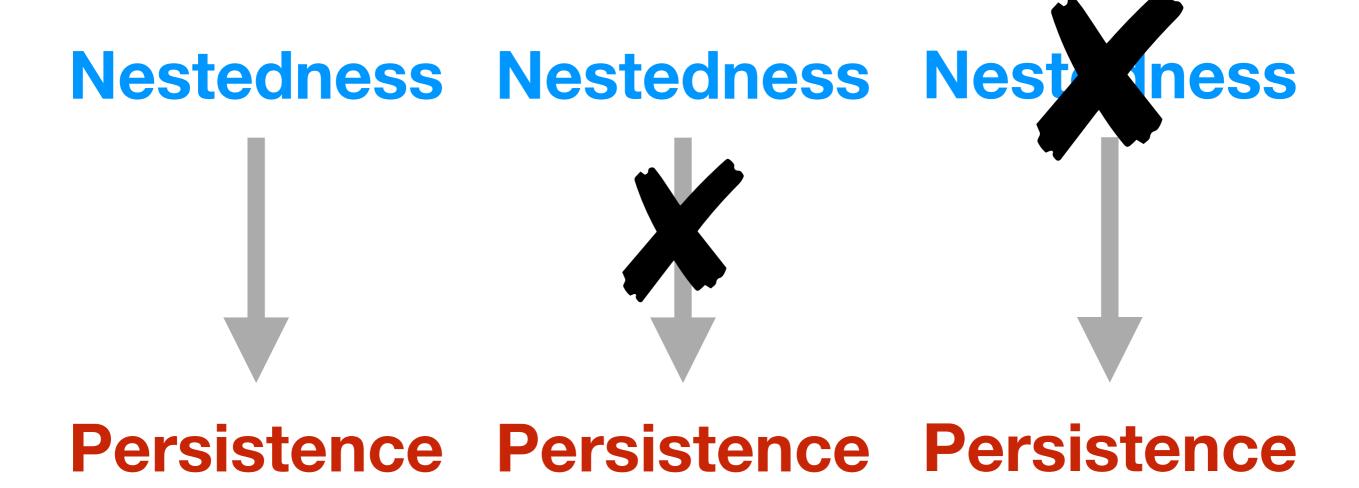
Clàudia Payrató-Borràs, Laura Hernández, and Yamir Moreno Phys. Rev. X 9, 031024 – Published 13 August 2019

PERSPECTIVE

Telling ecological networks apart by their structure: A computational challenge

Matthew J. Michalska-Smith 10 1 x , Stefano Allesina 1.2

#### Contrasting schools of thought



# Add a missing link into this research line

#### Environmental change is often missing

## Network structure

Environmental gradient

Ecological dynamics

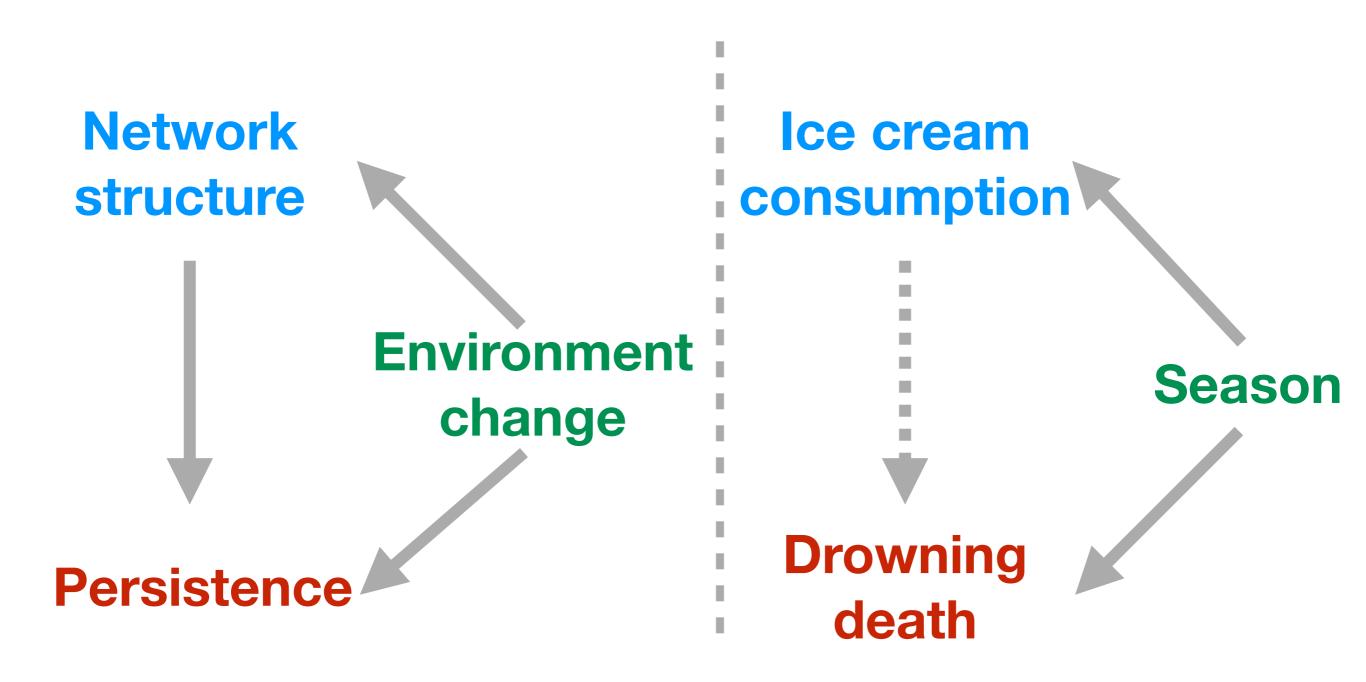
# **Environmental**change

Environmental stress

Persistence

Cenci\*, Song\*, Saavedra, Ecology & Evolution (2018)

#### Environmental change is a confounder



# How to quantify Persistence with Network structure and Environmental change

## Network structure

Environmental gradient

Ecological dynamics

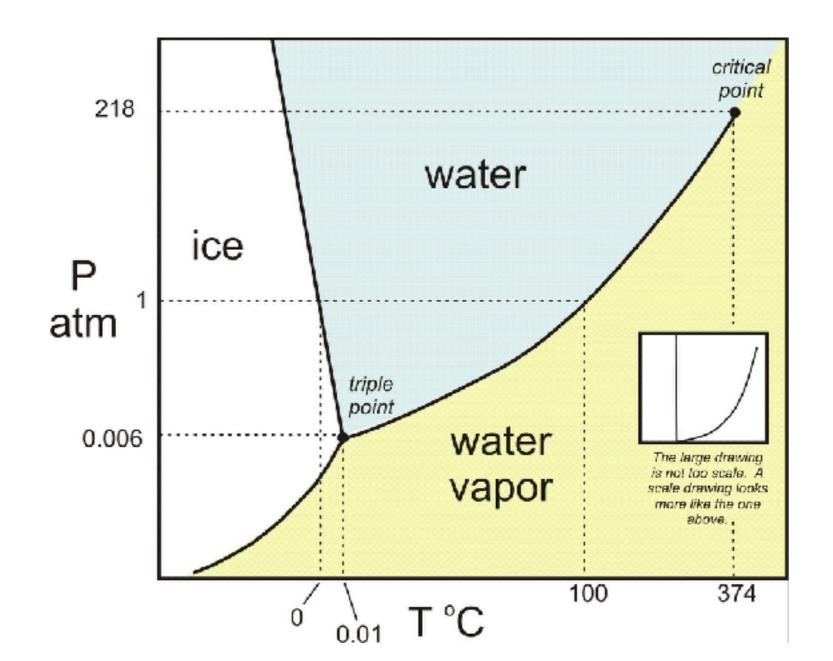
# **Environment**change



Environmental stress

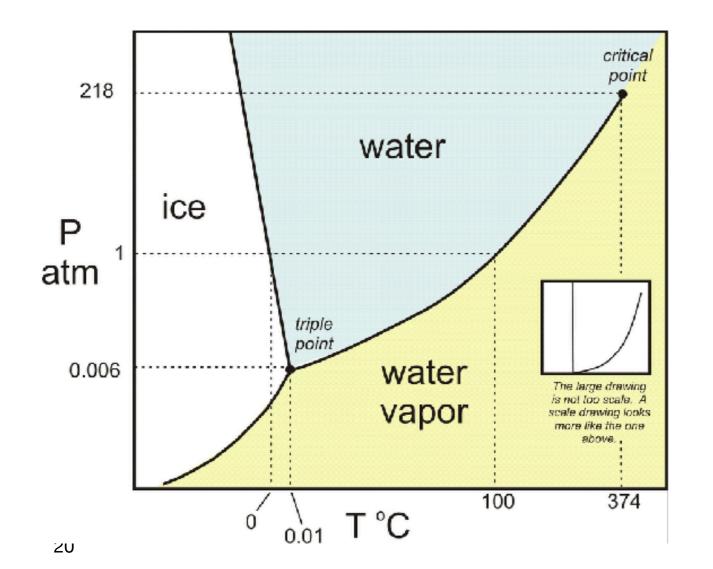
#### What is structural stability?

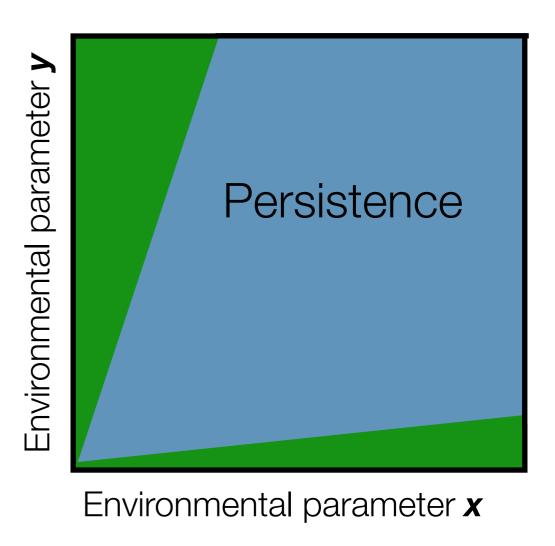
The full range of parameters compatible with some qualitative dynamical behavior



#### Structural stability in ecological contexts

The full range of **environmental conditions** (parameters) compatible with the **persistence** (qualitative dynamical behavior) of an ecological community





#### Structural stability in ecological contexts

The full range of **environmental conditions** (parameters) compatible with the **persistence** (qualitative dynamical behavior) of an ecological community

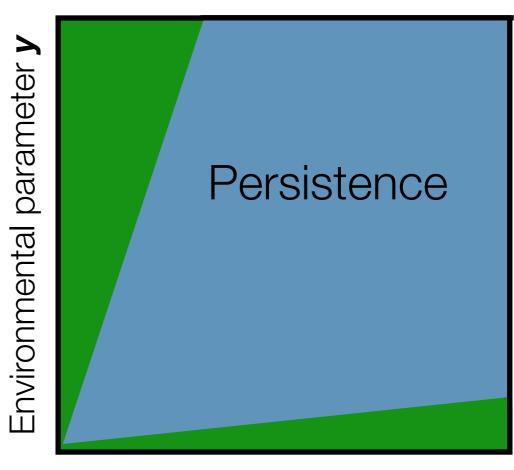
Structural :=

#### **Persistence domain**

(determined by the network structure)

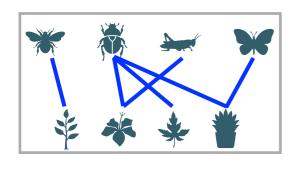
#### **Environment domain**

(determined by the environmental change)



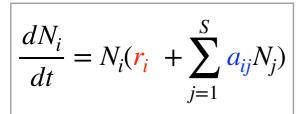
Environmental parameter **x** 

# Probabilistic measure of Persistence under given Network structure and Environmental change



#### **Network structure**

Song, *J. Theo. Bio.* (2018)



Ecological dynamics

## **Environmental** change

Environmental stress

Environmental

gradient

#### **Persistence**

#### **Persistence domain**

(determined by the network structure)

#### **Environment domain**

(determined by the environmental change)

$$\frac{2}{(2\pi)^{S/2}\sqrt{|\det(A^TA)|}}$$

$$\int \dots \int_{N\geq 0} e^{-\frac{1}{2}N^T(A^TA)^{-1}N} dN$$

Understanding network structures through the lens of environment

## Network structure

Q1: Is there any pattern of network structure along an **environmental gradient**?

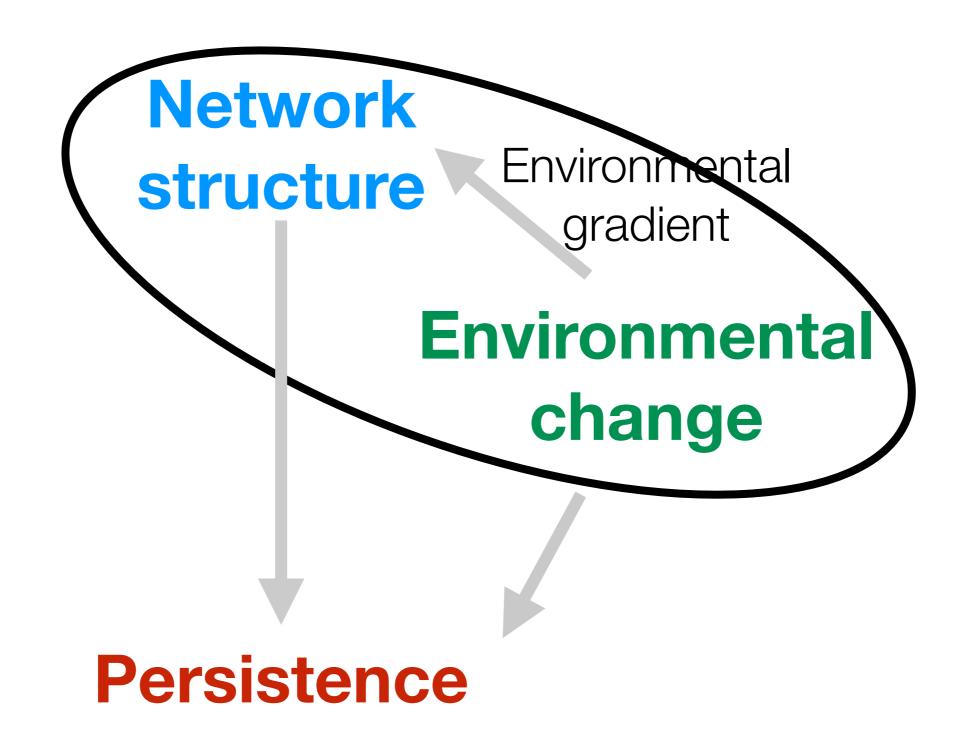
Q2: Does network structure contribute to persistence?

# **Environmental** change

Q3: Can we disentangle the effects of **environmental stress** on persistence?

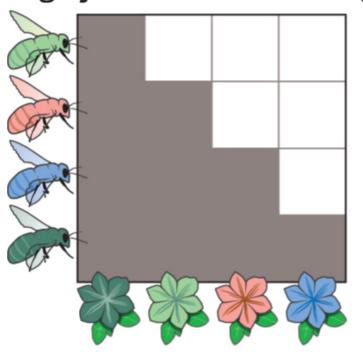
#### **Persistence**

Q1: Is there any pattern of network structure along an environmental gradient?



#### More nested structure = higher structural stability

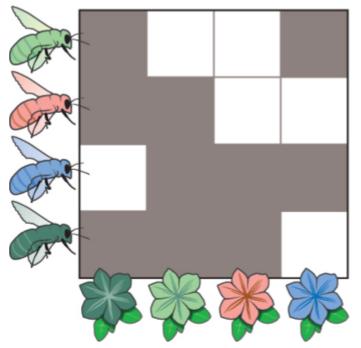
#### Highly nested network = high structural stability

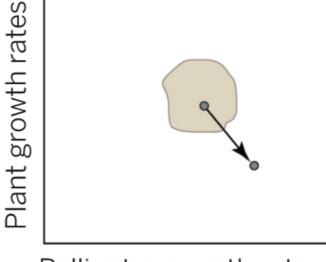


Slant growth rates
Coexistence domain

Pollinator growth rates

#### Less nested network = low structural stability



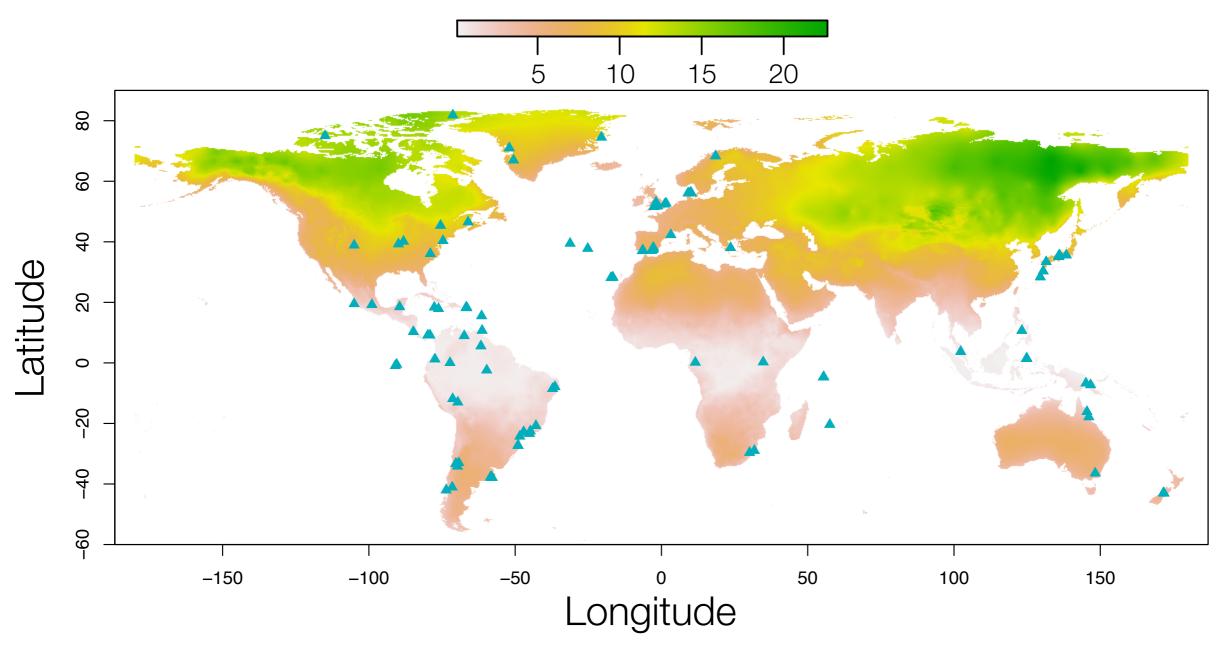


Pollinator growth rates

Rohr et al., *Science* (2014) Pawar, *Science* (2014)

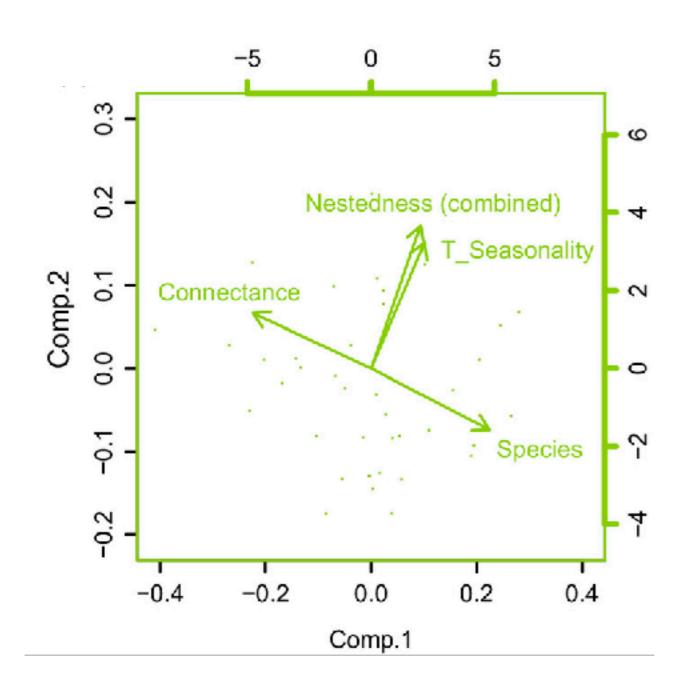
# Mutualistic networks across the globe with local temperature variability

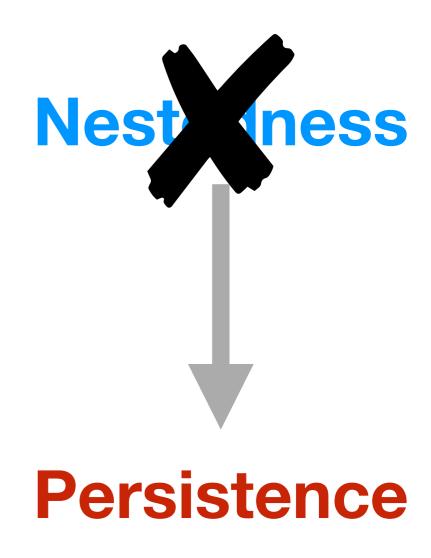
Temperature variability (standard deviation of yearly temperature)



Source: www.web-of-life.es
Song & Saavedra, *PLOS Comp. Bio*. (2020)

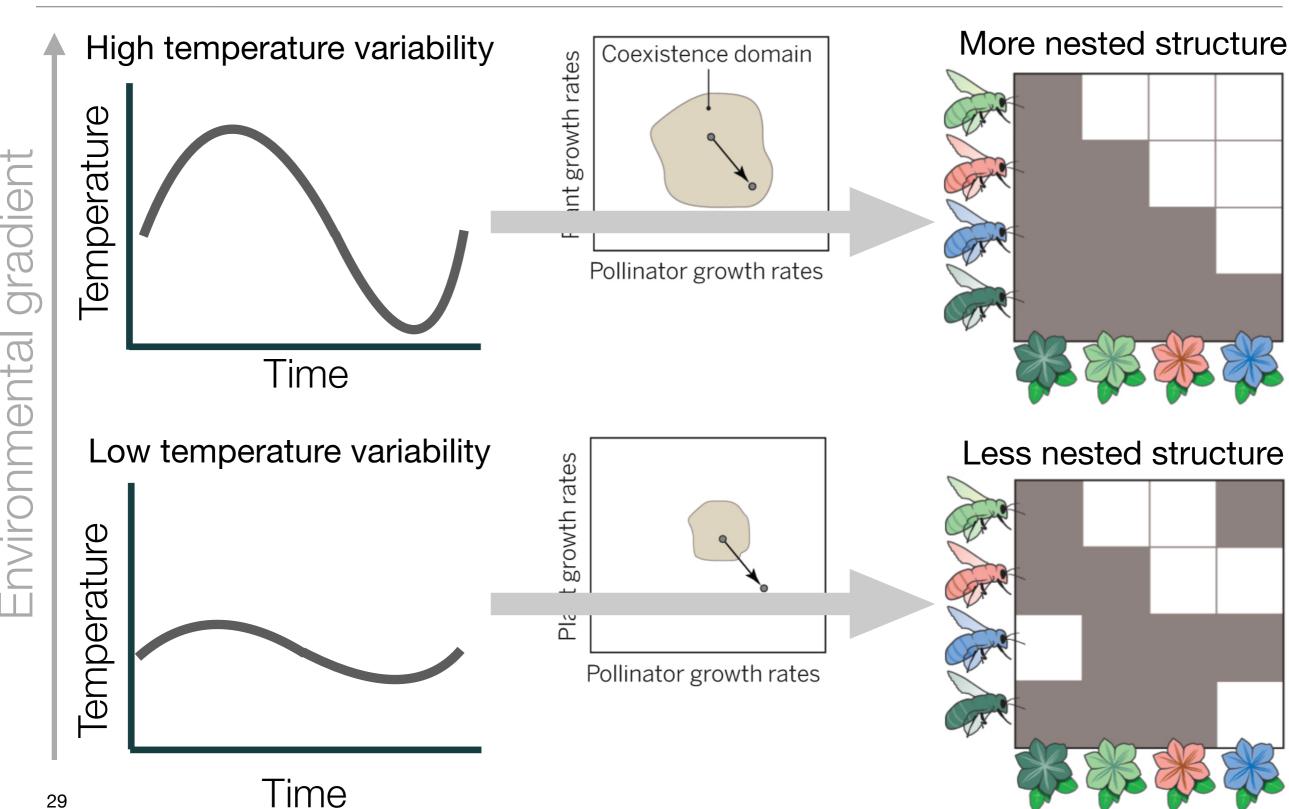
# Nestedness is strongly associated with temperature variability



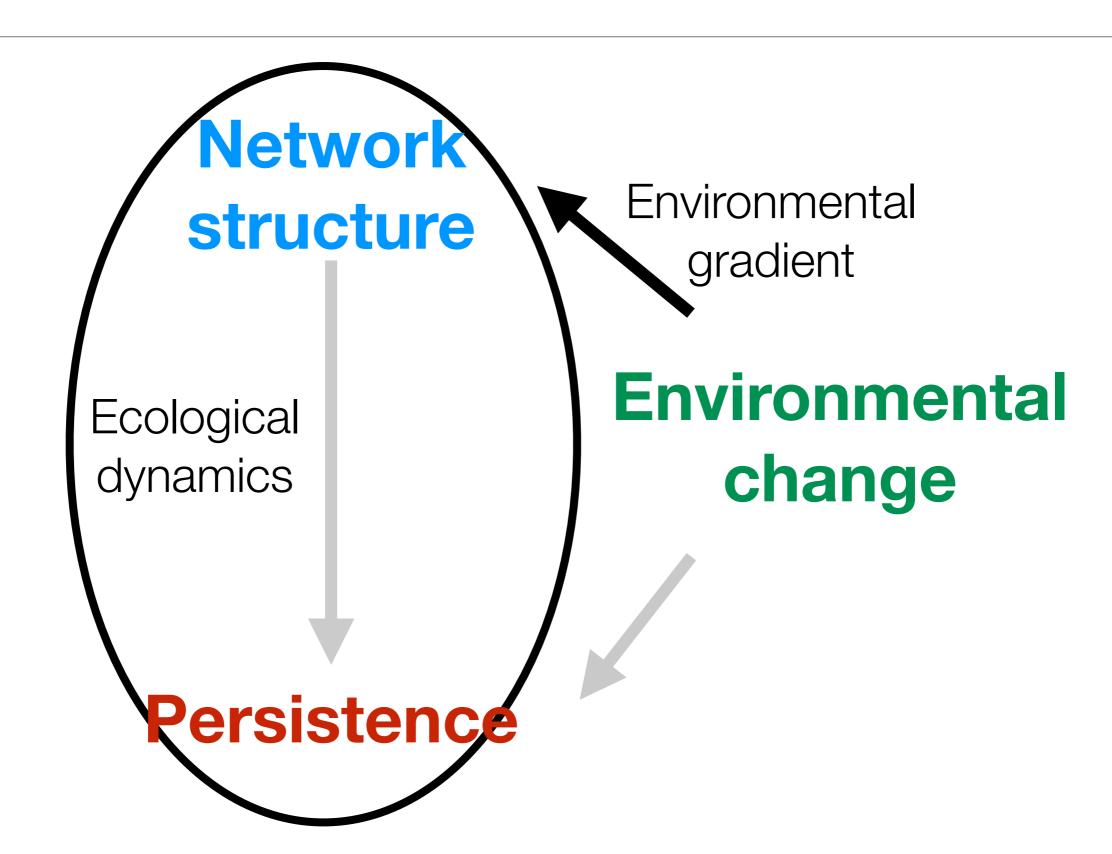


Song et al., *J. Animal Ecology* (2017) Song et al., *J. Animal Ecology* (2019)

### A1: Consistent pattern of network structure along an environmental gradient



## Q2: Does network structure contribute to persistence?

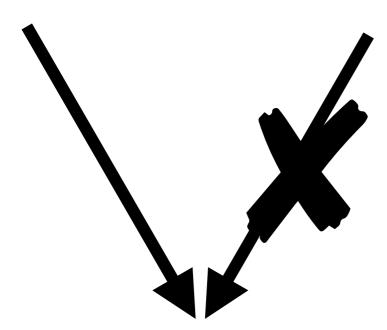


Hypothesis: Mutualistic/Antagonistic dynamics leaves some unique fingerprints on the structures

Mutualistic dynamics

Antagonistic dynamics

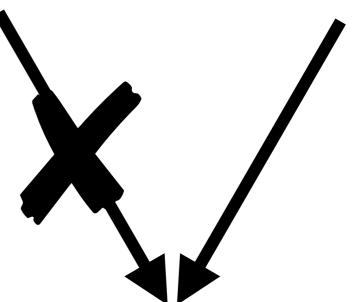
**Nestedness Modularity** 



**Persistence** 

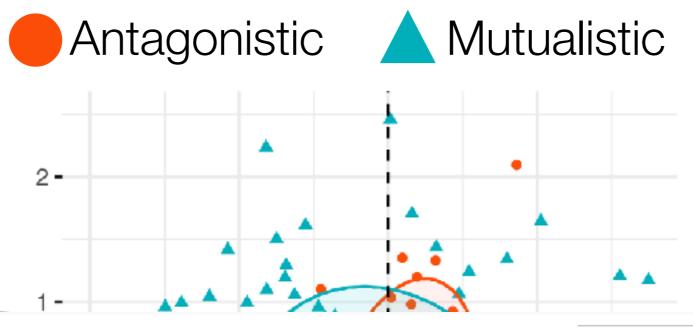
Nestedness Modularity

1



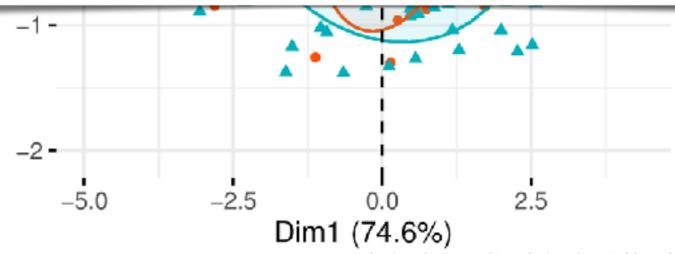
Persistence

### NO empirical evidence that network structure differs between antagonistic and mutualistic networks



ecological networks display

much structural variation, making it difficult to distinguish between mutualistic and antagonistic interactions. We therefore frame the problem as a challenge for the community of scientists interested in computational biology and machine learning.



Michalska-Smith & Allesina, PLoS Comp. Bio. (2019)

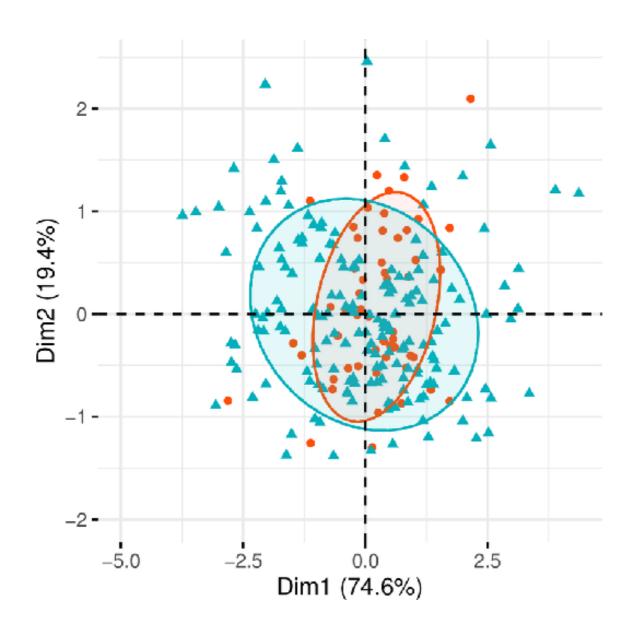
## Network structures differ when the environment is controlled



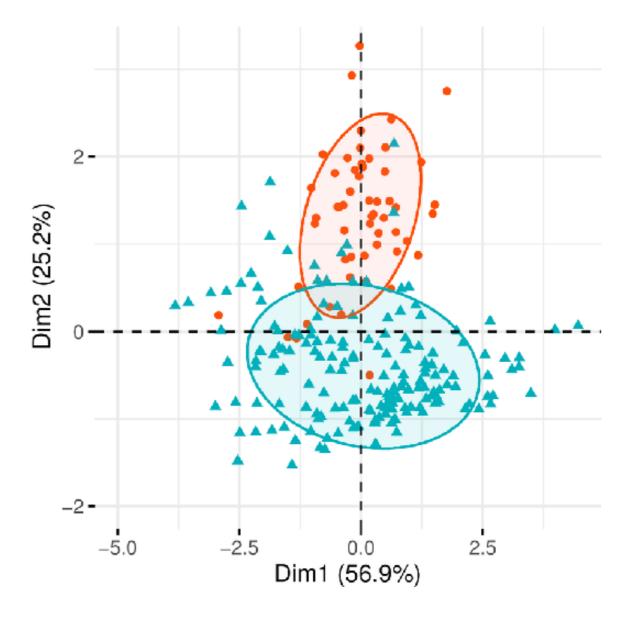


Mutualistic

#### Without environmental information



With environmental information



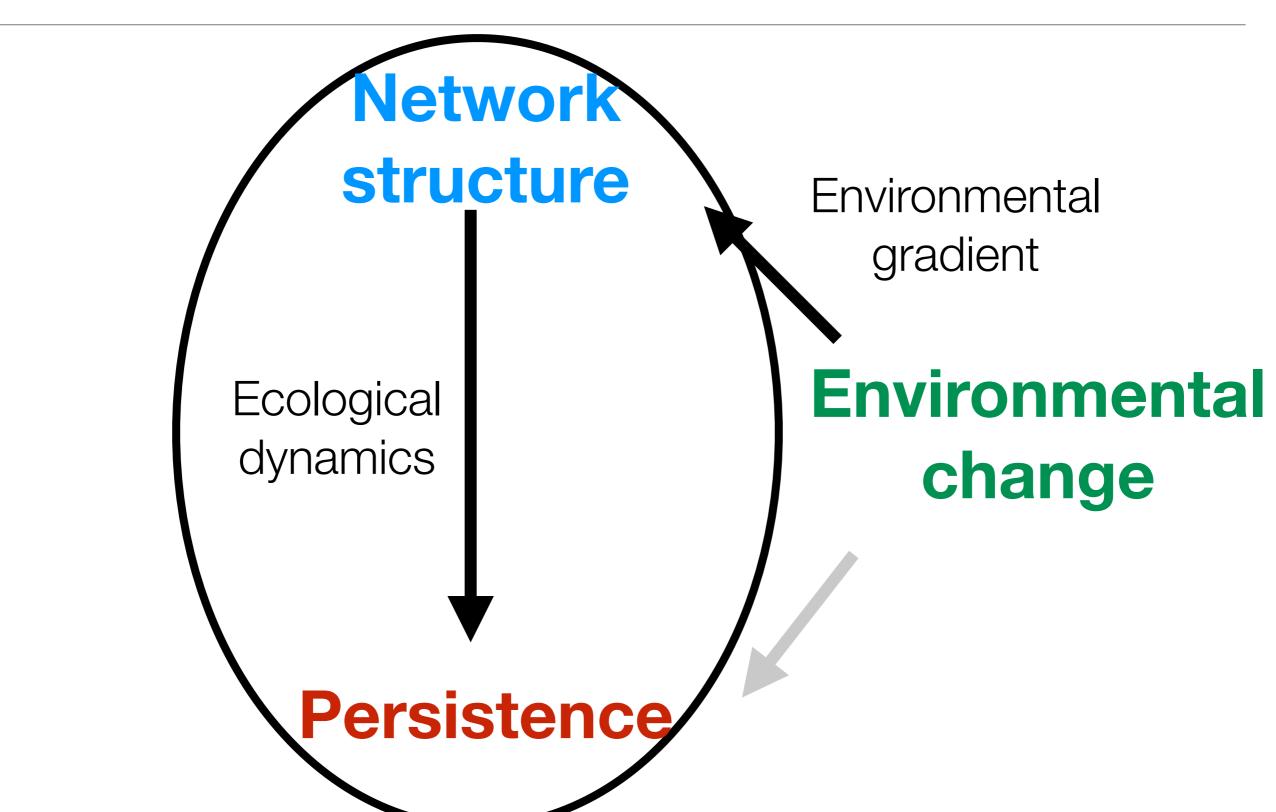
Song & Saavedra, PLOS Comp. Bio. (2020)

# Opposing and predictable patterns of network structures along environmental gradients

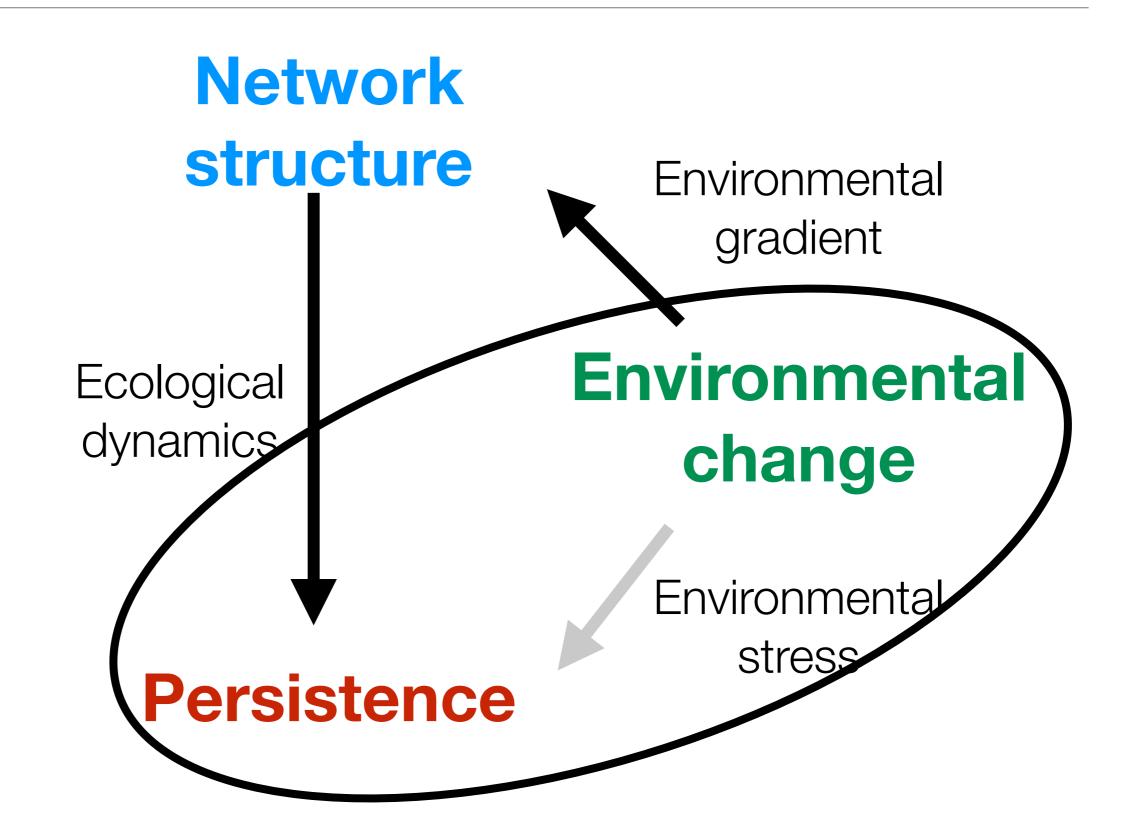
1.00 **Antagonistic Nestedness** 0.75 Structural stability of 0.50 intra-guild **Mutualistic** competition 0.25 Persistence 0.00 0.25 0.50 0.00 0.75 1.00

Temperature variability (scaled)

#### A2: Network structure contributes to persistence



## Q3: Can we disentangle the effects of environmental stress on persistence?



## The scheme of disentangling the effects of environmental stress

Environmental stress

More changes in intrinsic growth rates

select

Higher structural stability of intrinsic growth rates

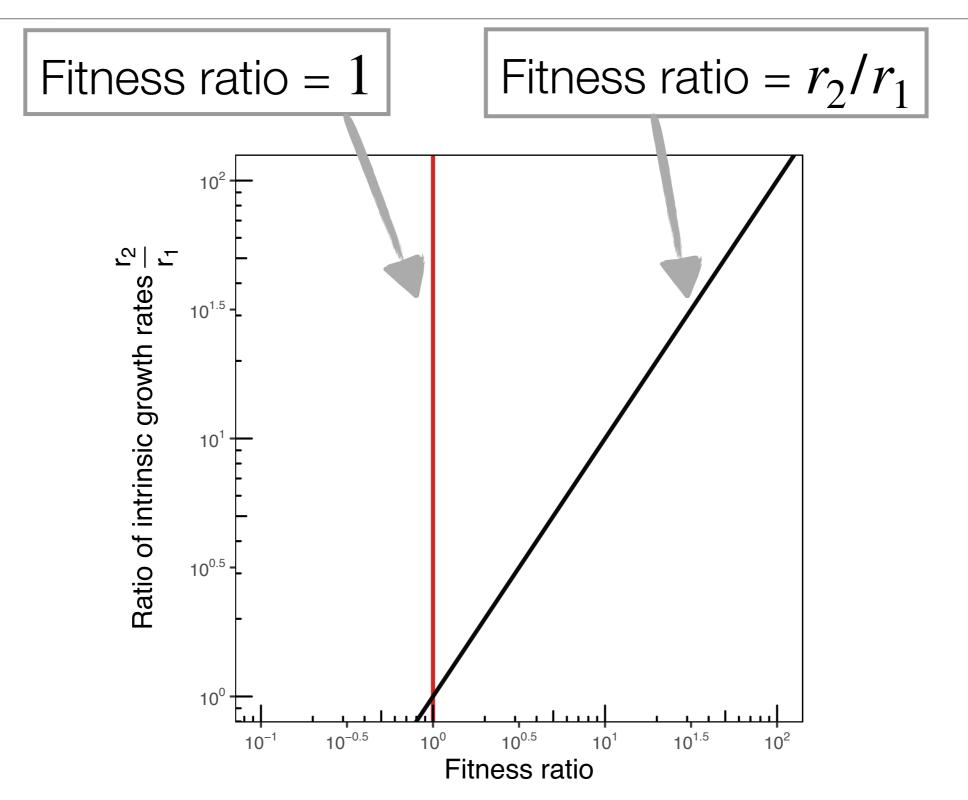
More changes in competition strength

select

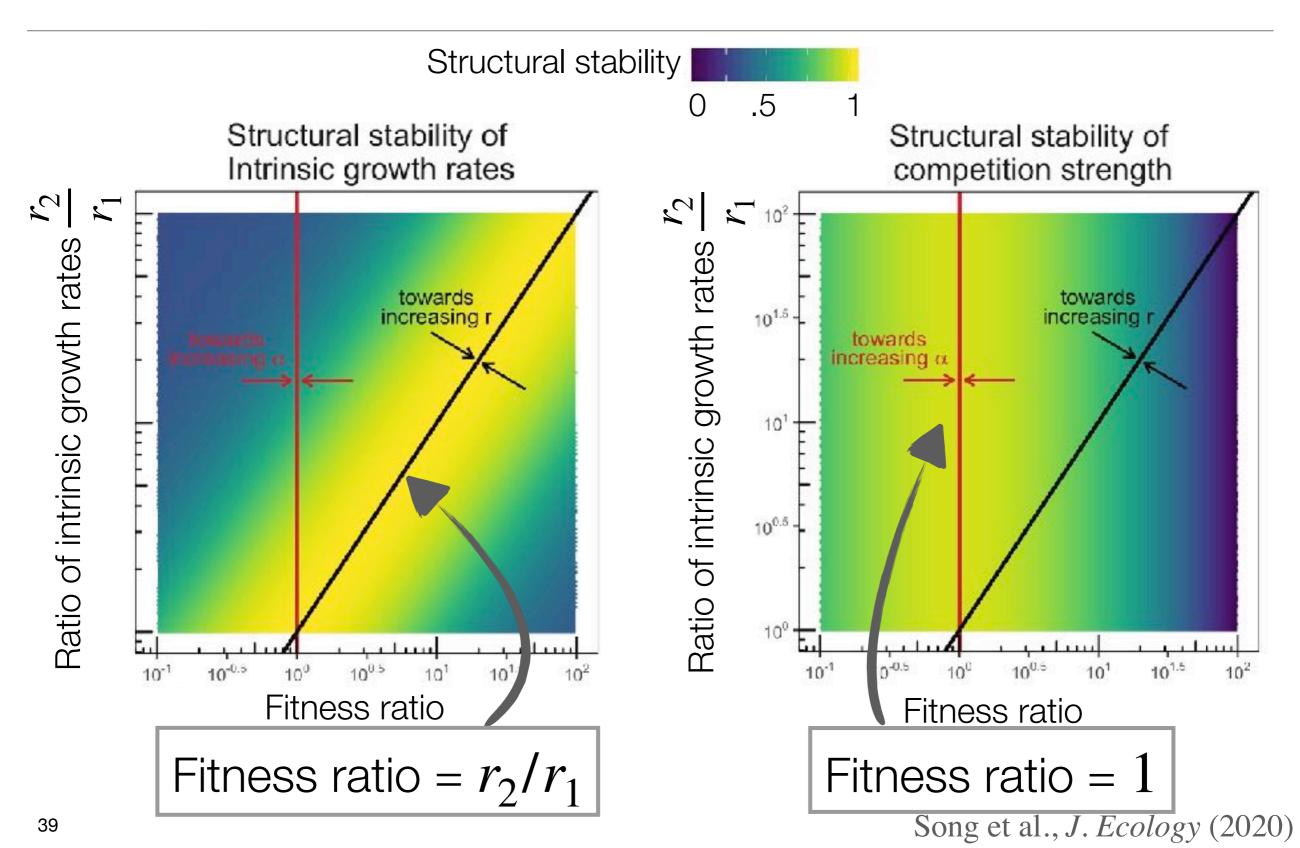
Higher structural stability of competition strength

Ecological community

## Generic trade-off between structural stability of competition strength and intrinsic growth rates



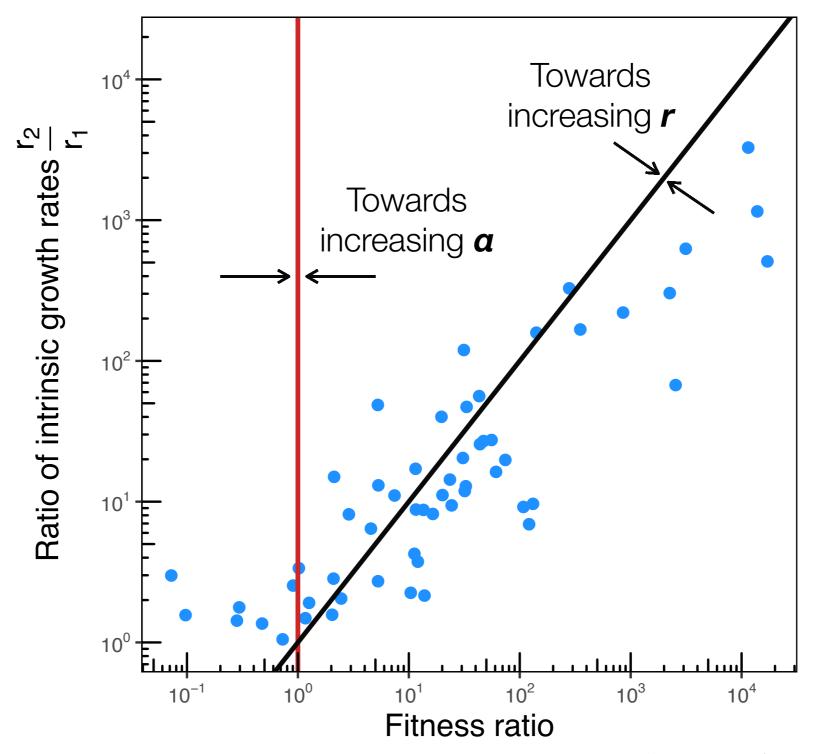
# Generic trade-off between structural stability of competition strength and intrinsic growth rates



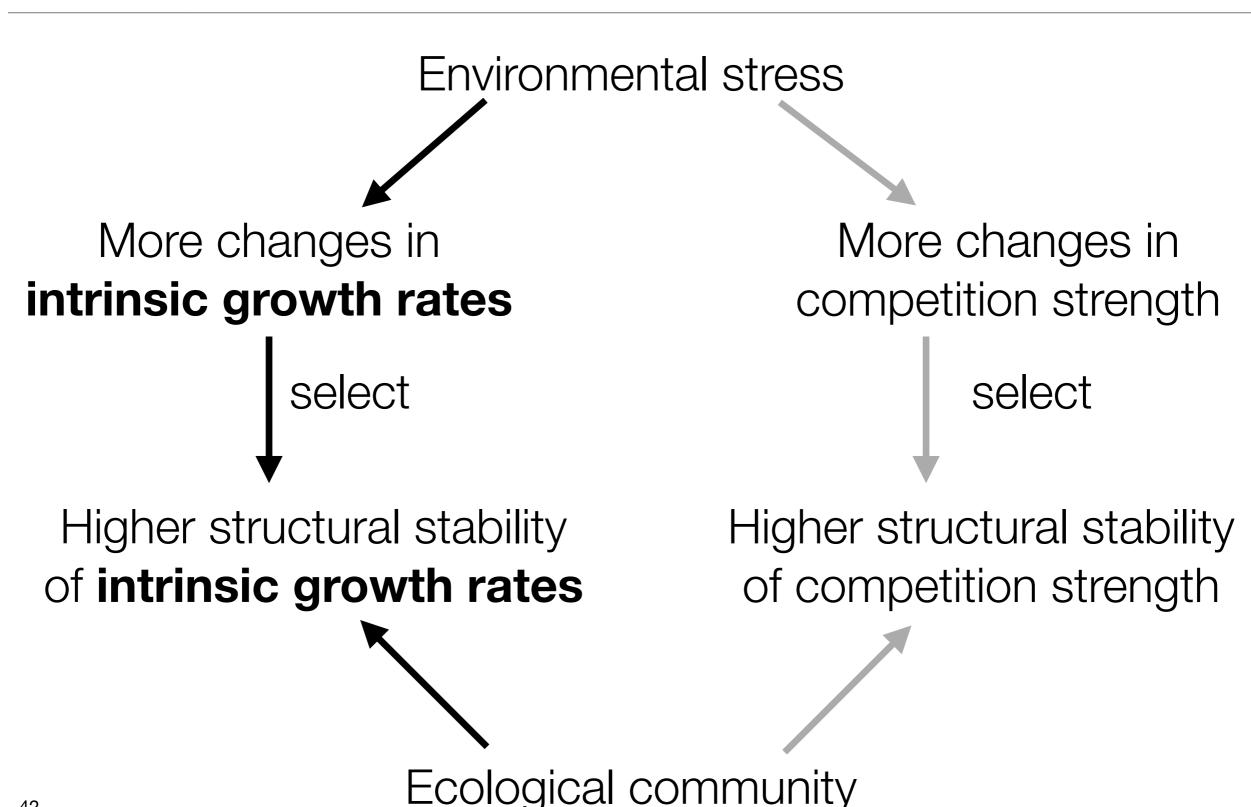
### Experiments of annual plant competition



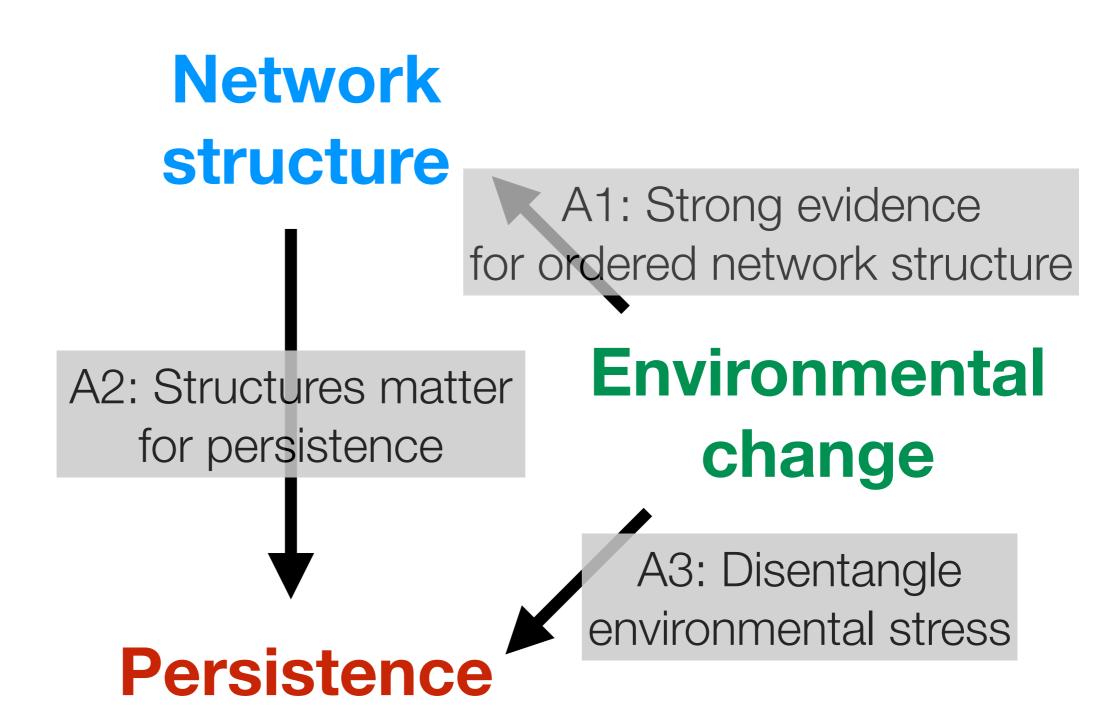
# Annual plants exhibit a preference to maximize structural stability of intrinsic growth rates



### A3: The effects of environmental stress on persistence can be disentangled

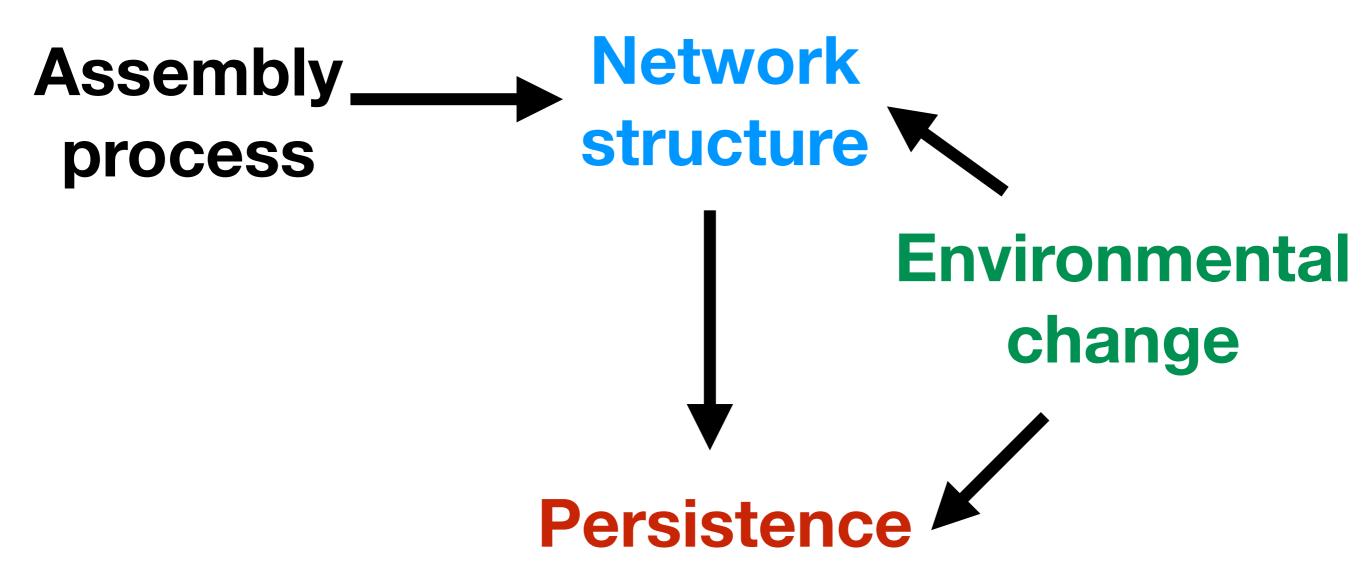


# Moving towards an environment-dependent understanding of network structures



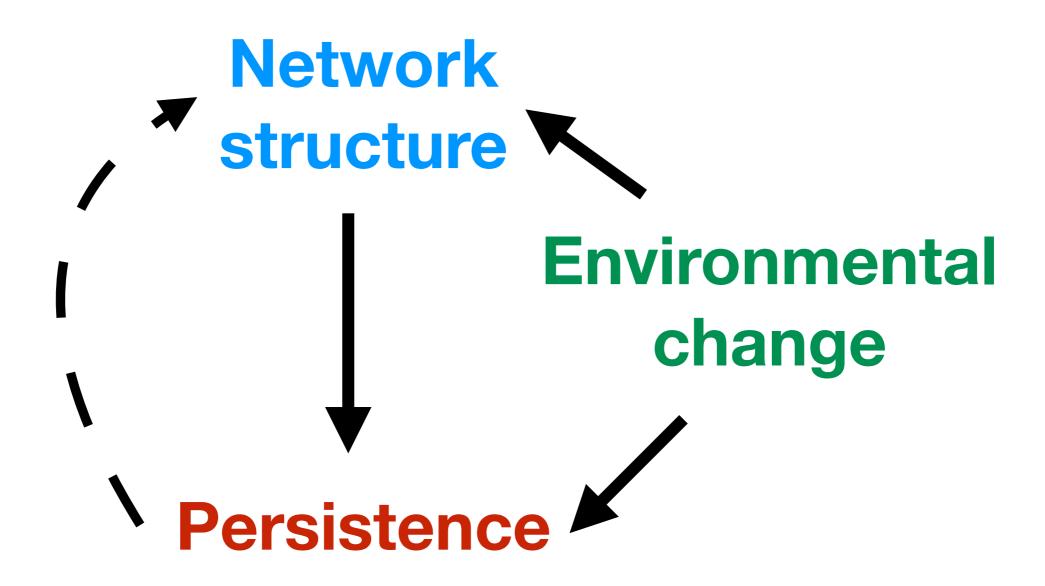
Many potential applications of the framework

- Elucidating the assembly rules of ecological communities



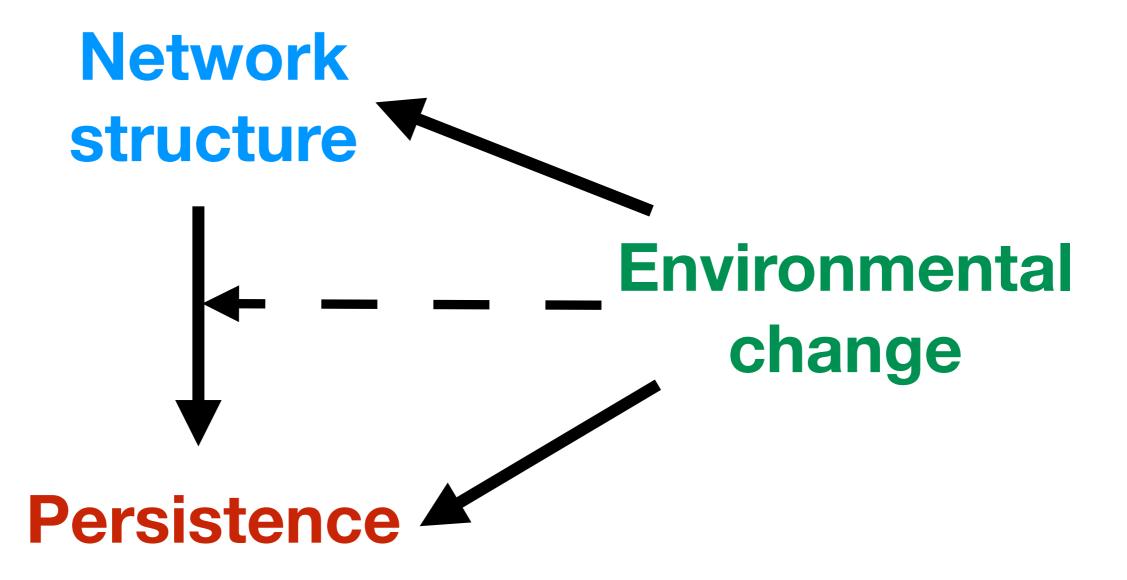
#### Many potential applications of the framework

- Understanding phenological events

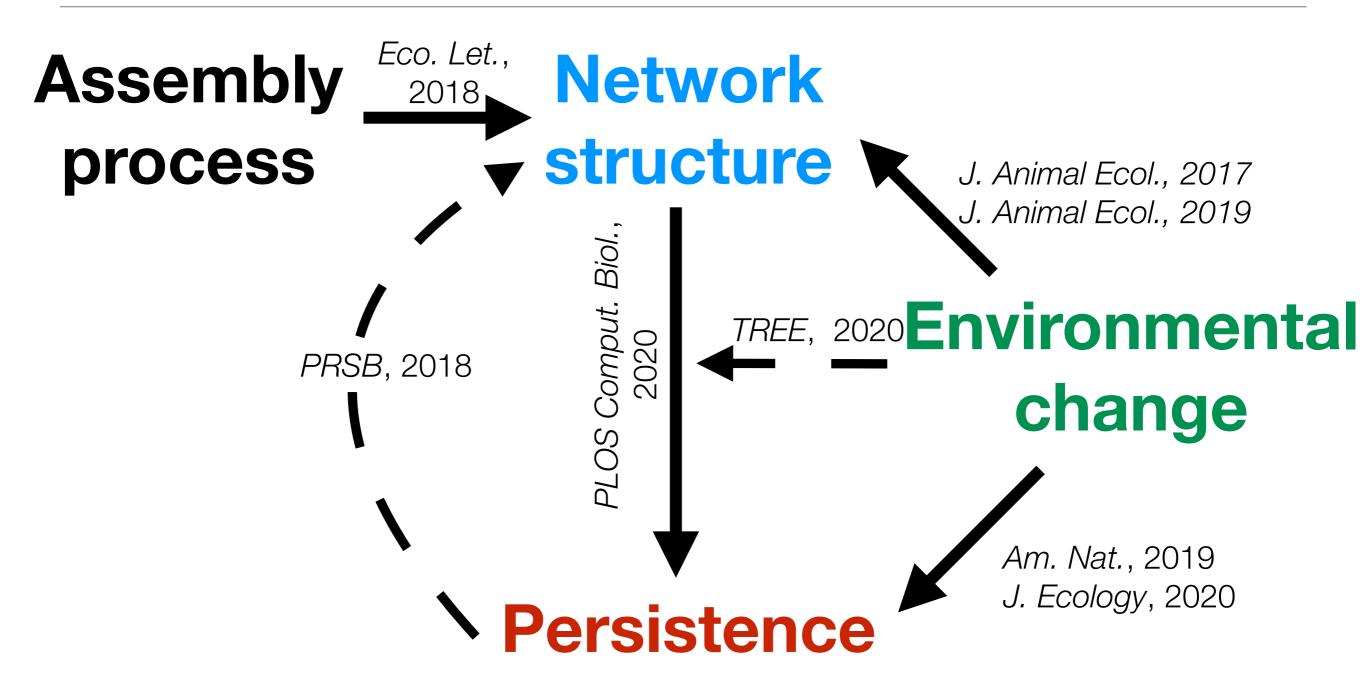


#### Many potential applications of the framework

- Understanding the switch of species interaction types



## Summary of the environment-dependent framework



J. Theo Bio., 2018 Ecology, 2018 Eco. Evo., 2018

#### 谢谢大家

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