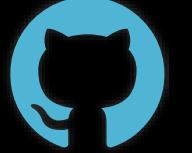


# Do ecological interactions impact geographic distributions of species?

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2016 ESA Annual Meeting, Fort Lauderdale  
Wednesday, August 10



Kévin Cazelles <http://kevincazelles.fr> 

Nicolas Mouquet, David Mouillot & Dominique Gravel

# CONTEXT

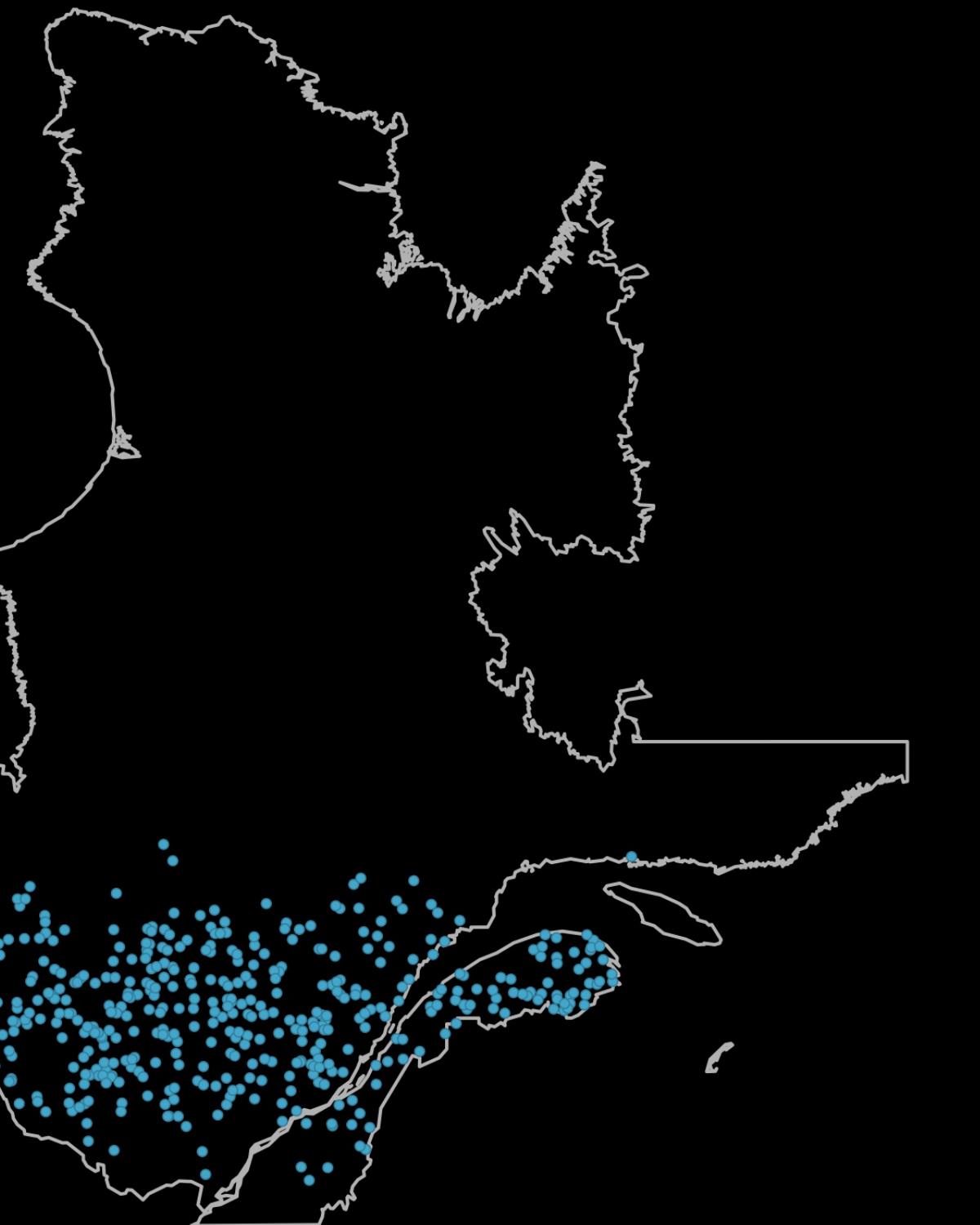
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**Biogeography and ecological interactions**

# Geographic distribution

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**Species A**



**Species B**



# Four categories of factors shaping distributions

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## 1. Climatic + edaphic

# Four categories of factors shaping distributions

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1. Climatic + edaphic

2. Dispersion (landscape structure / dispersion capacities)

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1. Climatic + edaphic

2. Dispersion (landscape structure / dispersion capacities)

3. Ecological interactions

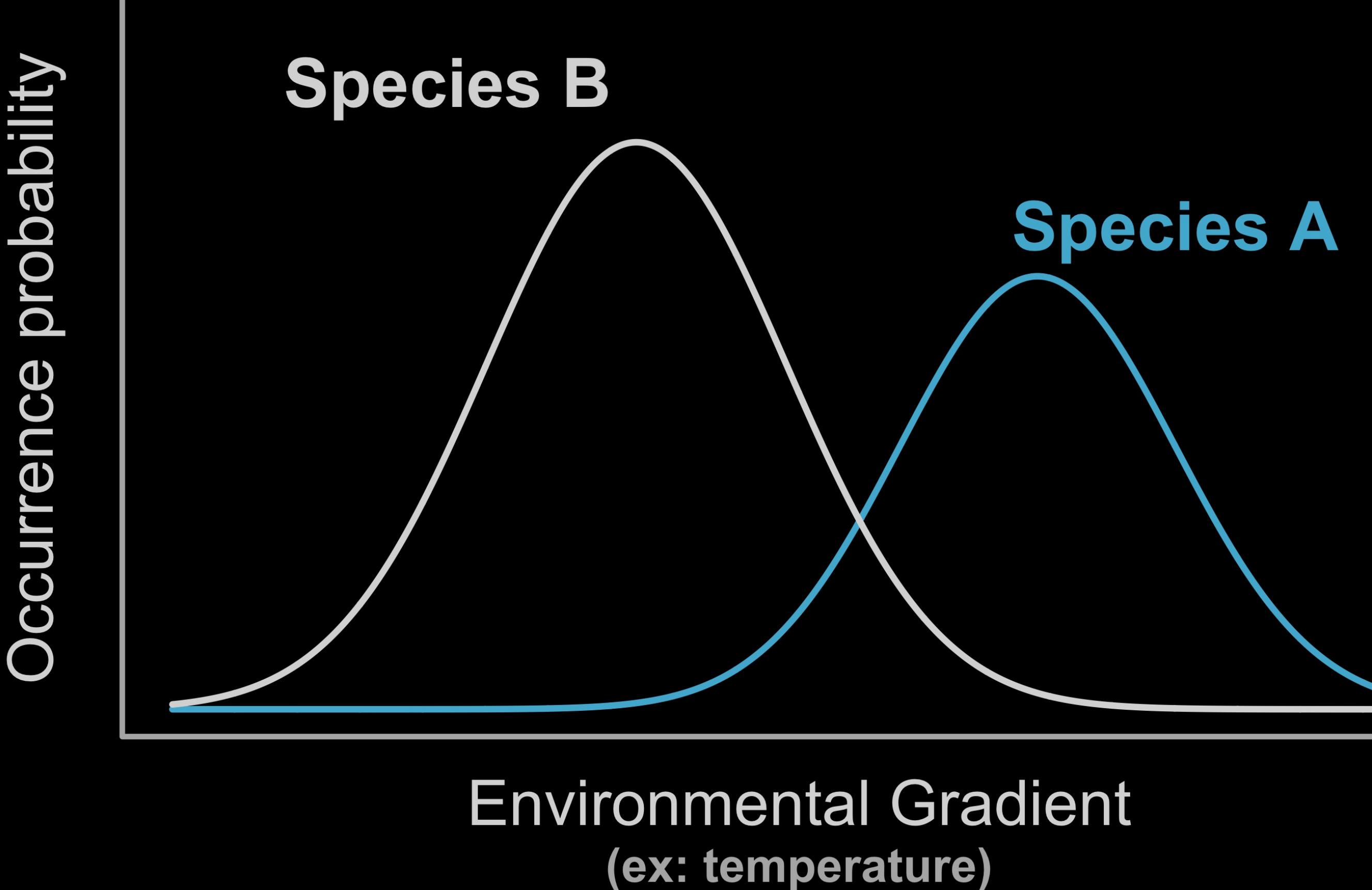
# Four categories of factors shaping distributions

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1. Climatic + edaphic
2. Dispersion (landscape structure / dispersion capacities)
3. Ecological interactions
4. Evolution

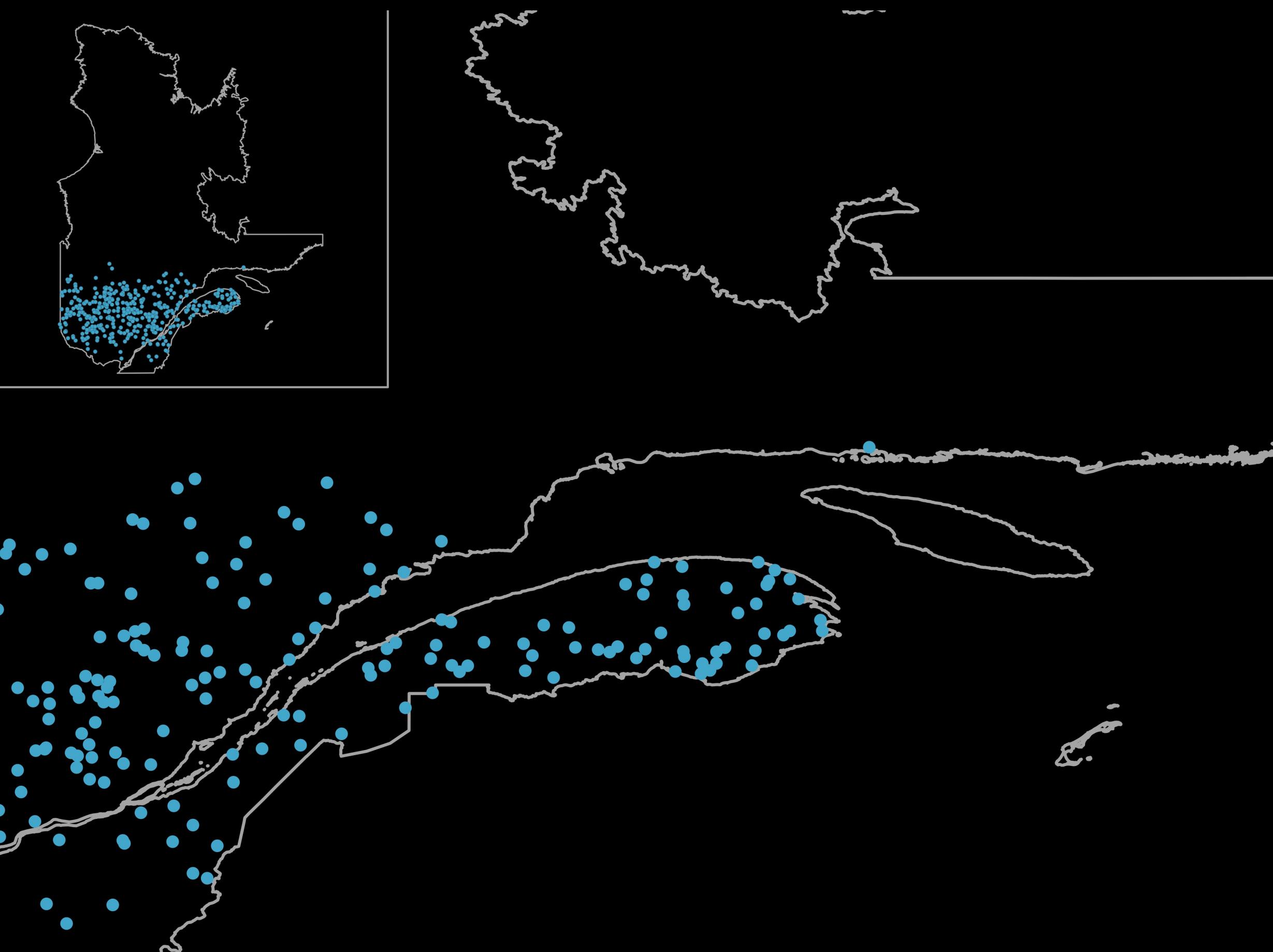
## 1. Climatic

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## 2. Dispersion

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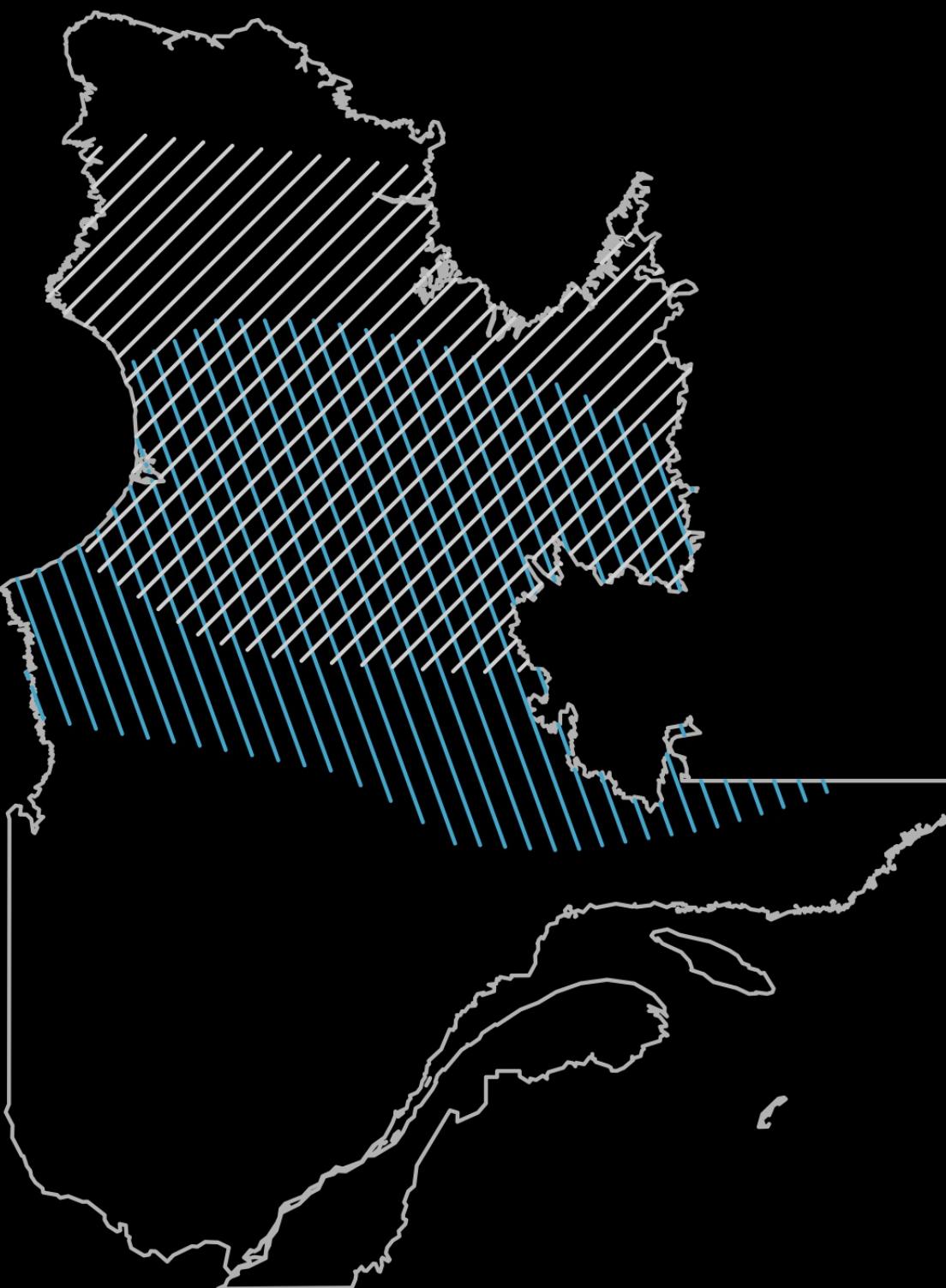
# Species Distribution Models

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Today



Tomorrow



### 3. Ecological interactions

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- B feeds on A

### 3. Ecological interactions

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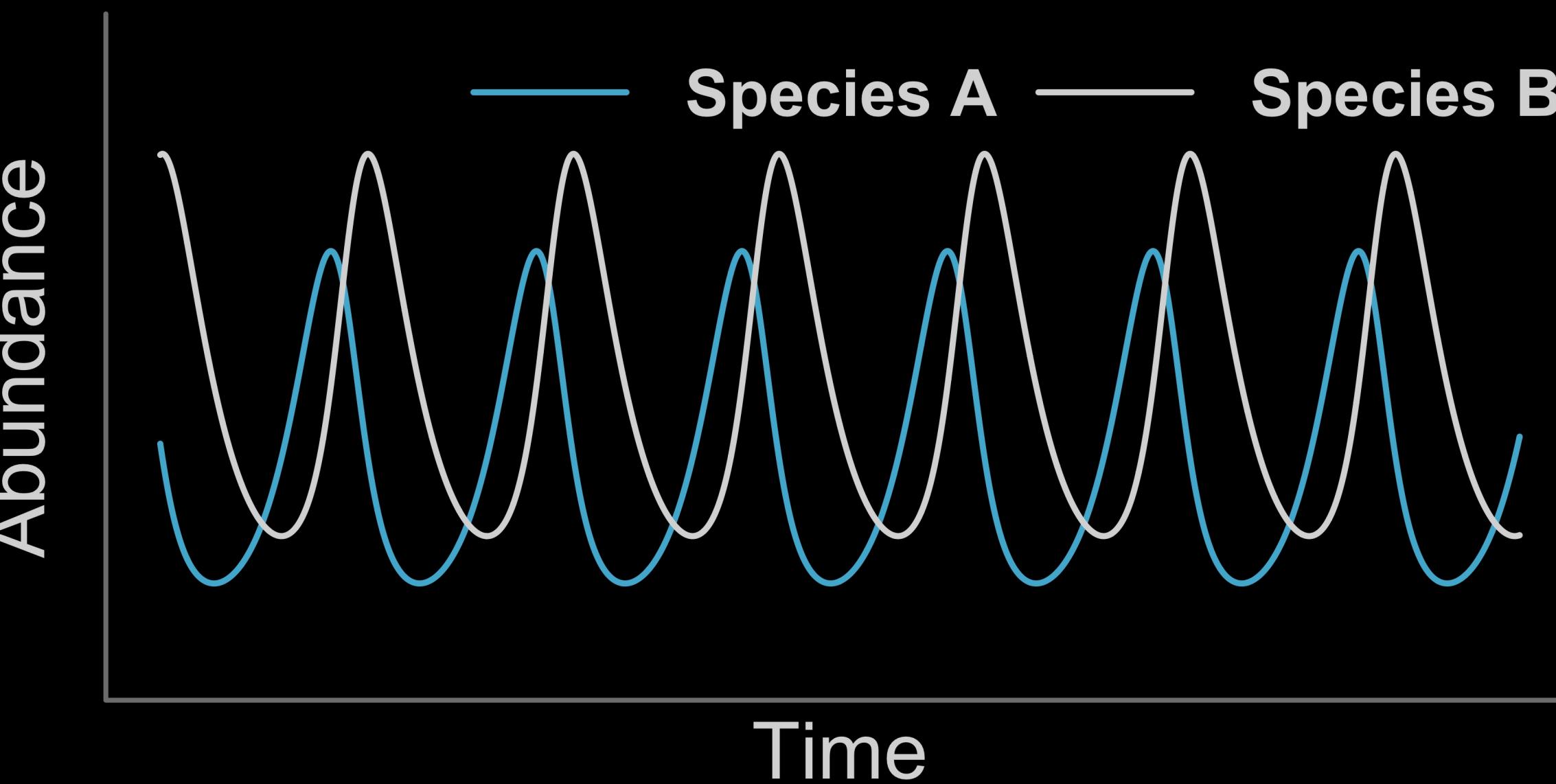
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### 3. Ecological interactions

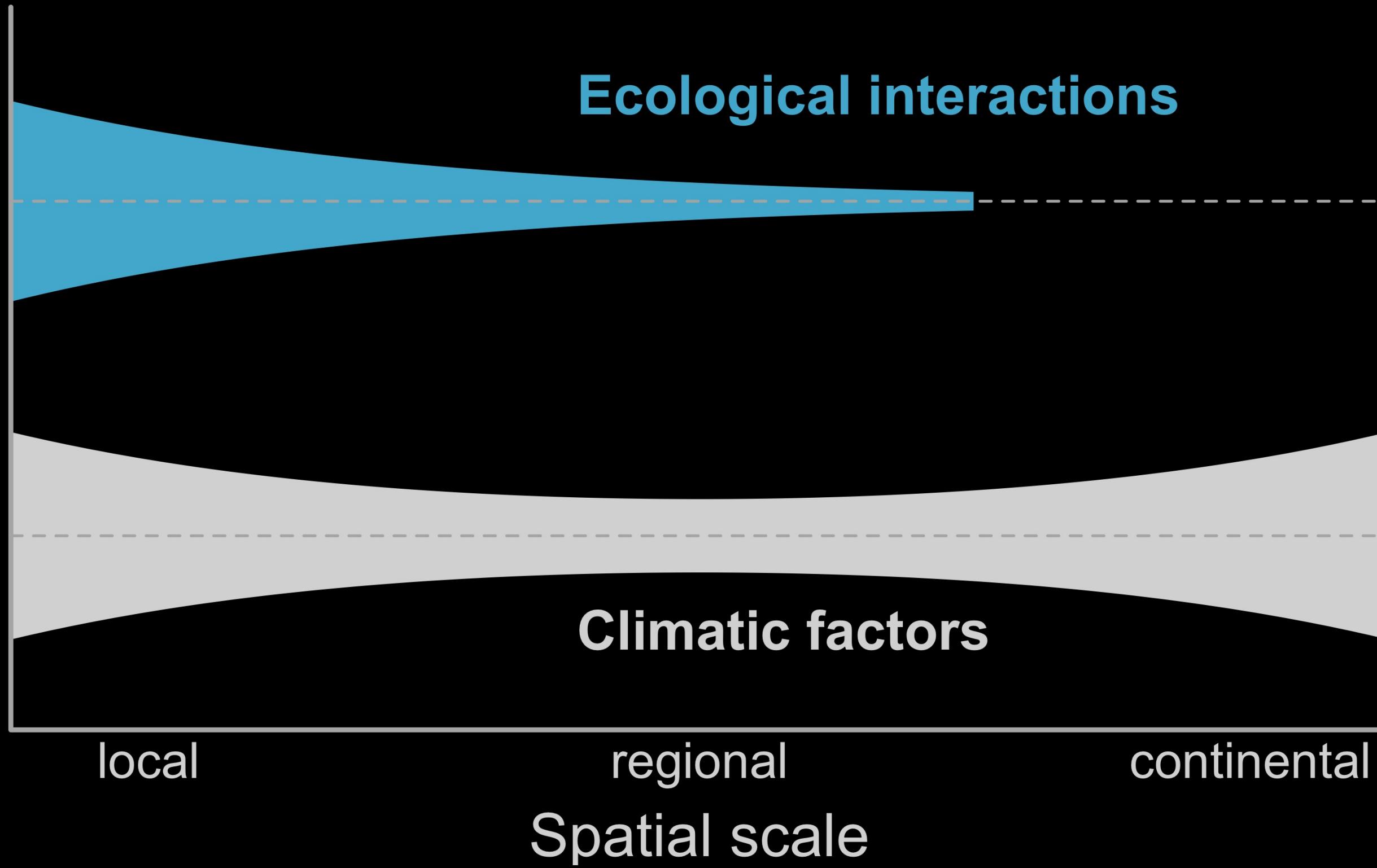
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- B feeds on A



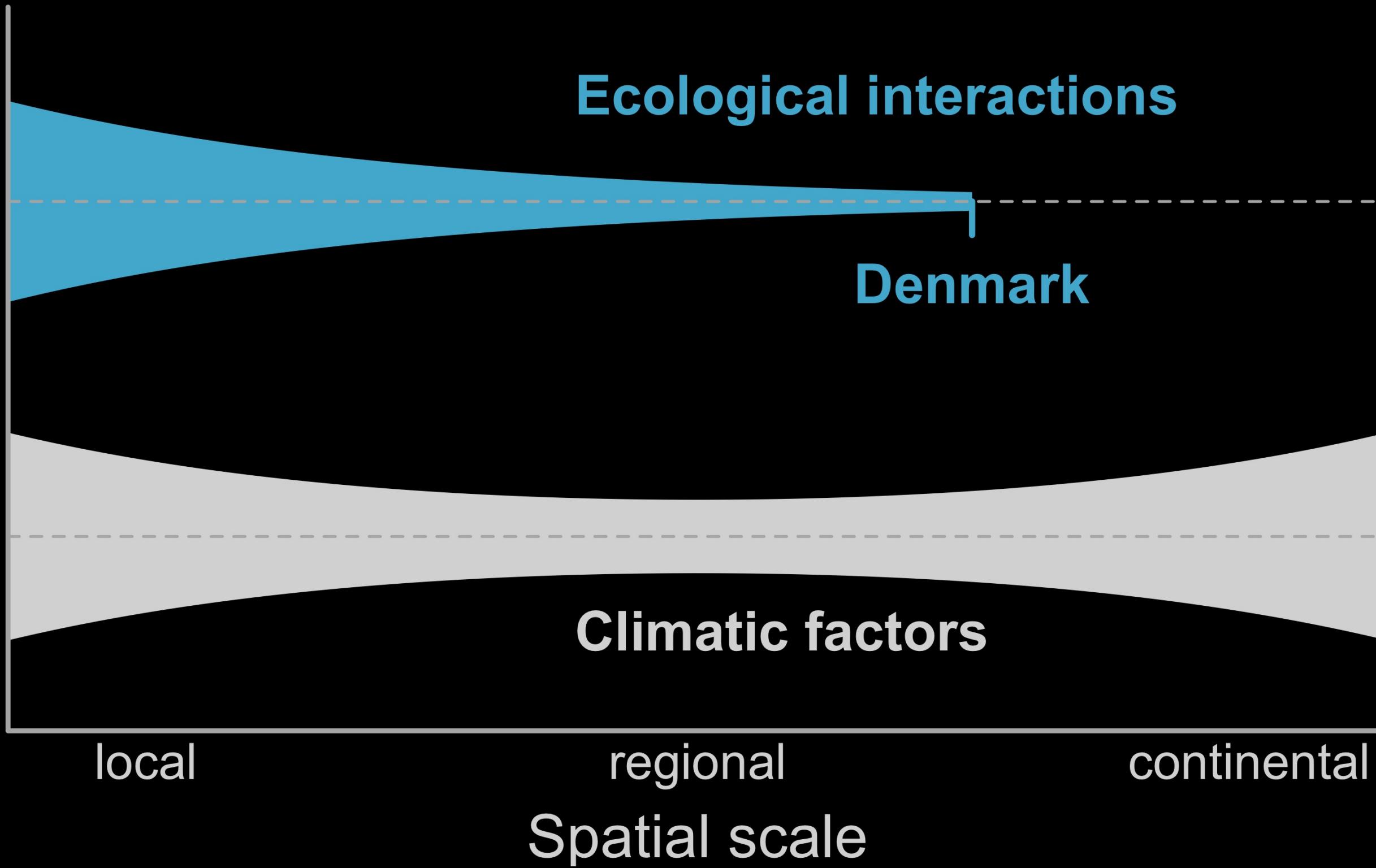
- Extinction probabilities impacted

# A matter of spatial scale?



McGill, B. J. (2010). *Science*.

# A matter of spatial scale?



McGill, B. J. (2010). *Science*.  
Gotelli, N. J. (2010). *PNAS*.

# Ecological information within static occurrence data?

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→ 2 chipmunks species + behavior + tree density = exclusion

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→ positive interactions easier to detect when scaling up

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2016: Do ecological interactions impact geographic distributions of species?

# THEORY

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**Interactions and co-occurrence**

## Co-occurrence

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- Observed co-occurrence :  $P(X_A, X_B)$

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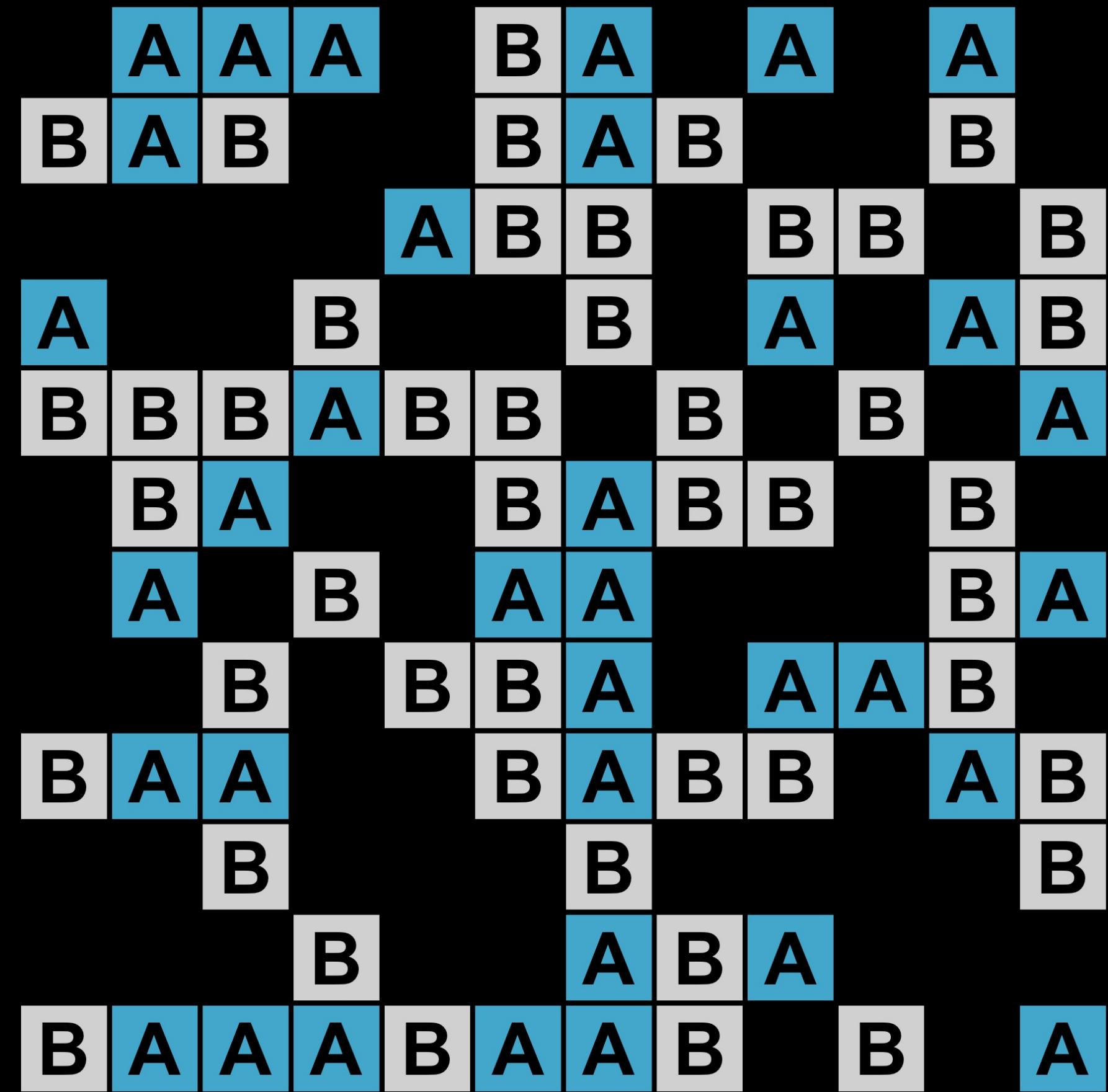
Historically, species in competition Diamond, 1975

→ *Checkerboard distribution*

→ *C-score*

## *Checkerboard distribution*

---



## Z-score (standardized co-occurrence)

---

$$\frac{\text{"observed co-occurrence" } - \mu}{\sigma}$$

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$\mu$  → **expected co-occurrence**

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**Scenarios**

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1. Sites are identical (Homogeneous, Veech 2013)

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1. **Sites are identical (Homogeneous, Veech 2013)**
2. **Environmental conditions are taken into account (SDM)**

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1. Sites are identical (Homogeneous, Veech 2013)
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### Scenarios

1. **Sites are identical (Homogeneous, Veech 2013)**
2. **Environmental conditions are taken into account (SDM)**
  - a. **Generalised Linear Model (GLM)**
  - b. **Random Forest (RF)**

## Shorthest path

---

A  
↑  
D

A  
↑  
B  
↑  
D

A  
↑  
C  
↑  
B  
↑  
D

## Shorthest path

---

A  
↑  
D

A  
↑  
B  
↑  
D

A  
↑  
C  
↑  
B  
↑  
D

ABCD  
A0100  
B1010  
C0101  
D0010

## Shortest path

---

A  
↑  
D

A  
↑  
B  
↑  
D

A  
↑  
C  
↑  
B  
↑  
D

ABCD
A0100
B1010
C0101
D0010

ABCD
A0123
B1012
C2101
D3210

# Shortest path + co-occurrence

---

## 1. Distributions + network

→ Nice datasets

# Shortest path + co-occurrence

---

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## 2. SDM for all species

→ Integrating physiological requirements

# **Shortest path + co-occurrence**

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## **1. Distributions + network**

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## **2. SDM for all species**

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## **3. Network topology**

→ Shortest path for all pairs and mean degree in

# Shortest path + co-occurrence

---

## 1. Distributions + network

→ Nice datasets

## 2. SDM for all species

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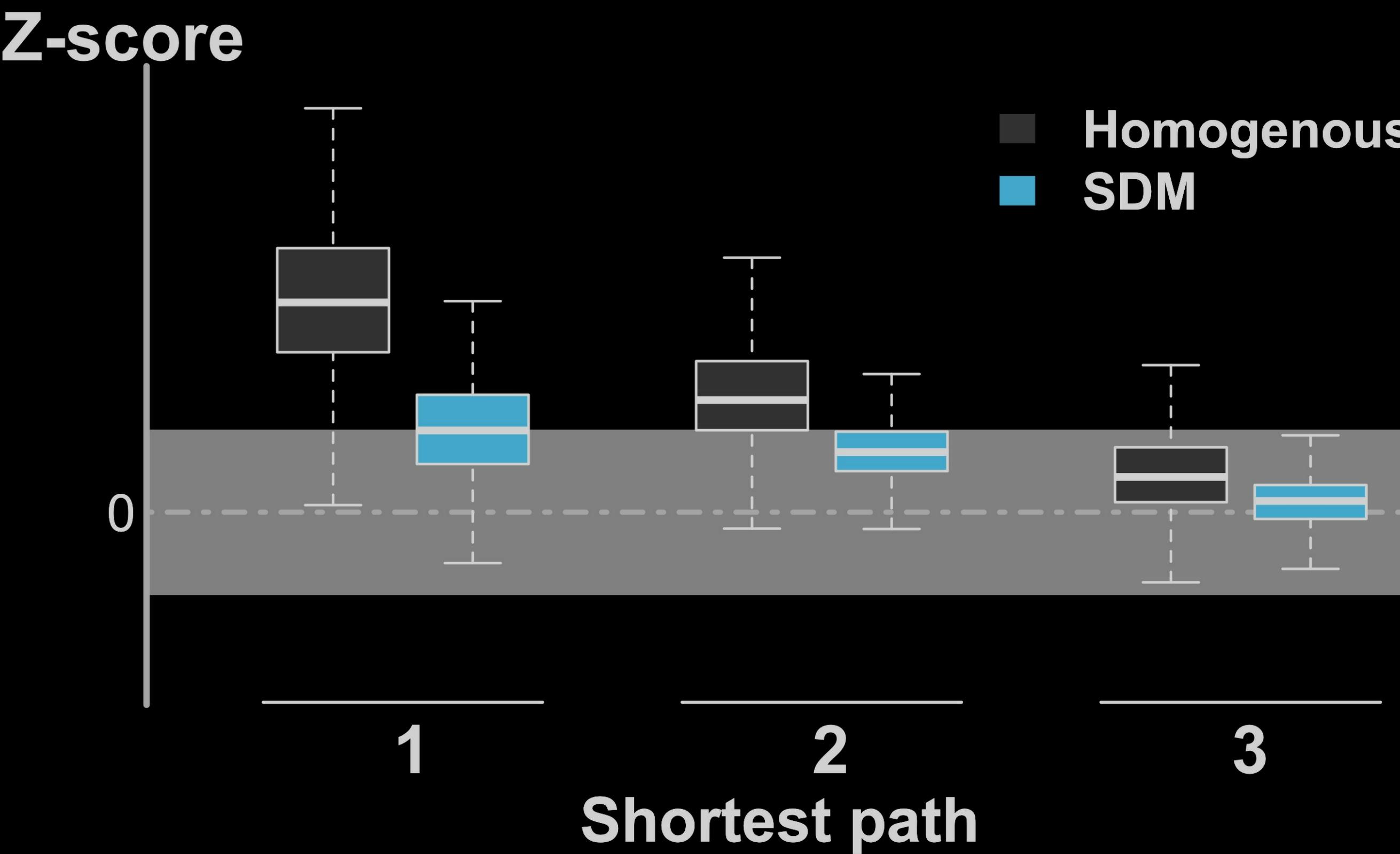
## 3. Network topology

→ Shortest path for all pairs and mean degree in

## 4. Co-occurrence for all pairs (3 scenarios)

→ Look at distribution of Z-score

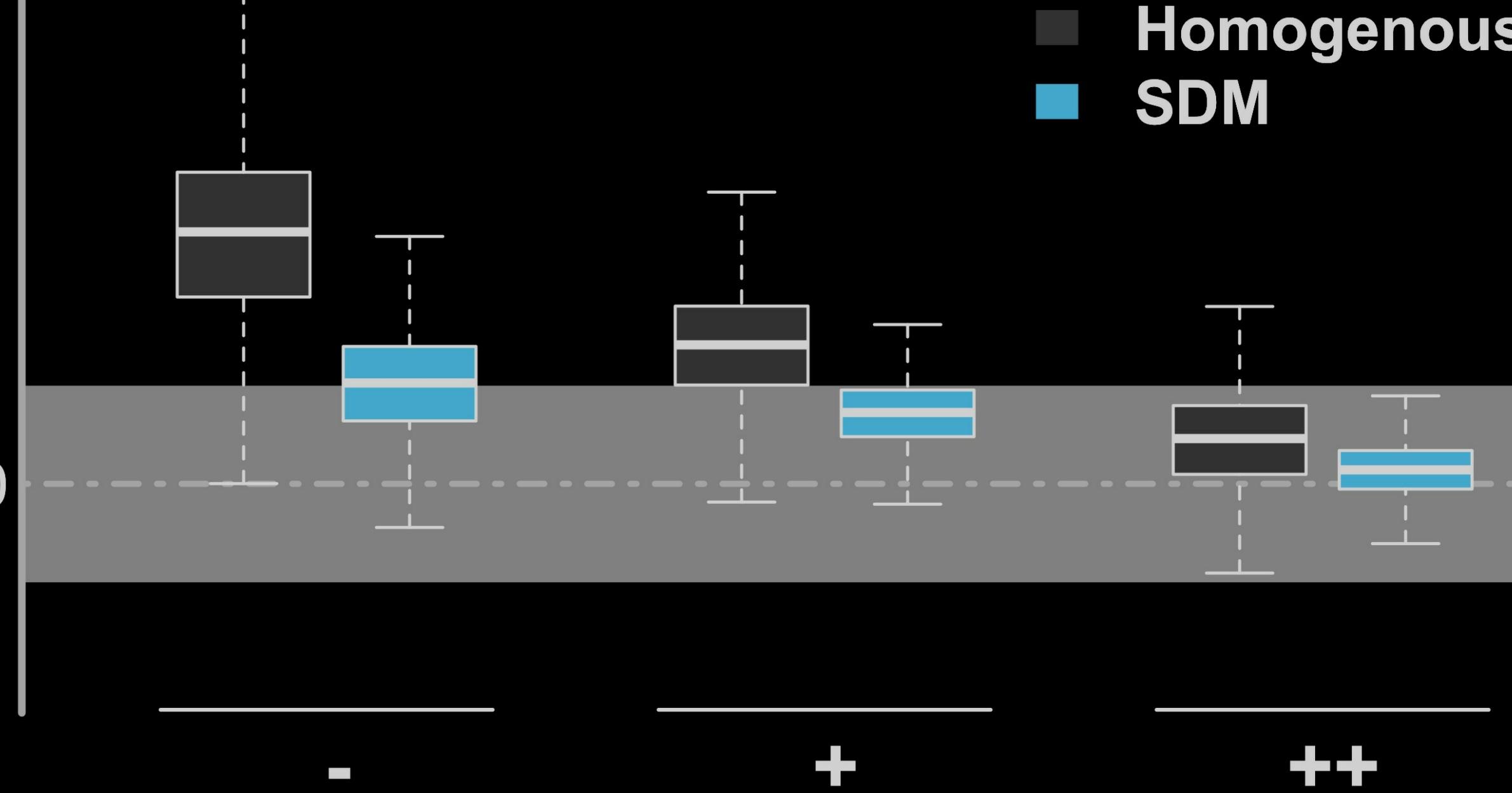
## Expectations



Cazelles K., et al. (2016) *Journal of Theoretical Ecology*.

# Expectations

Z-score



Interactions

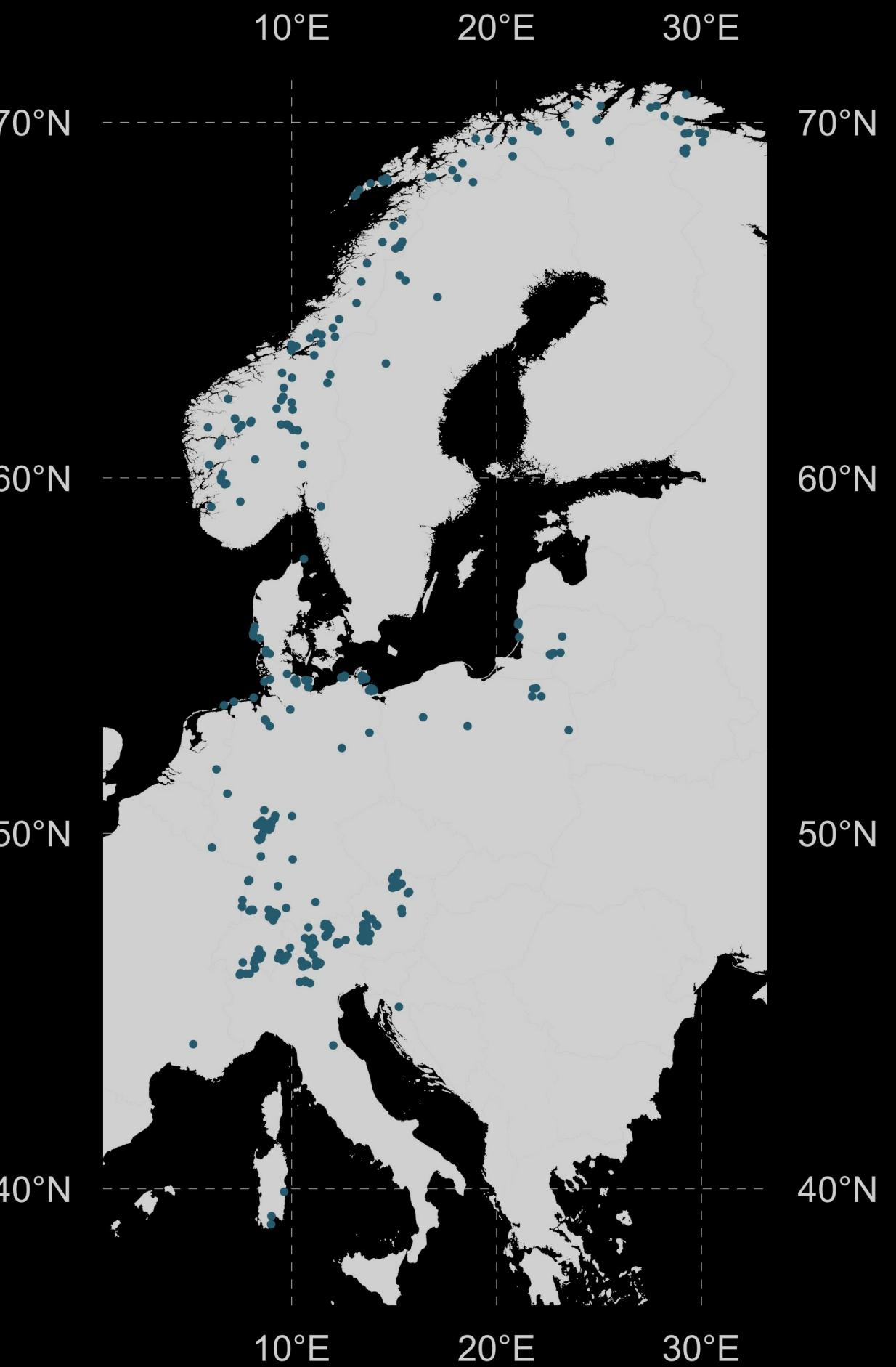
Cazelles K., et al. (2016) *Journal of Theoretical Ecology*.

# APPLICATION

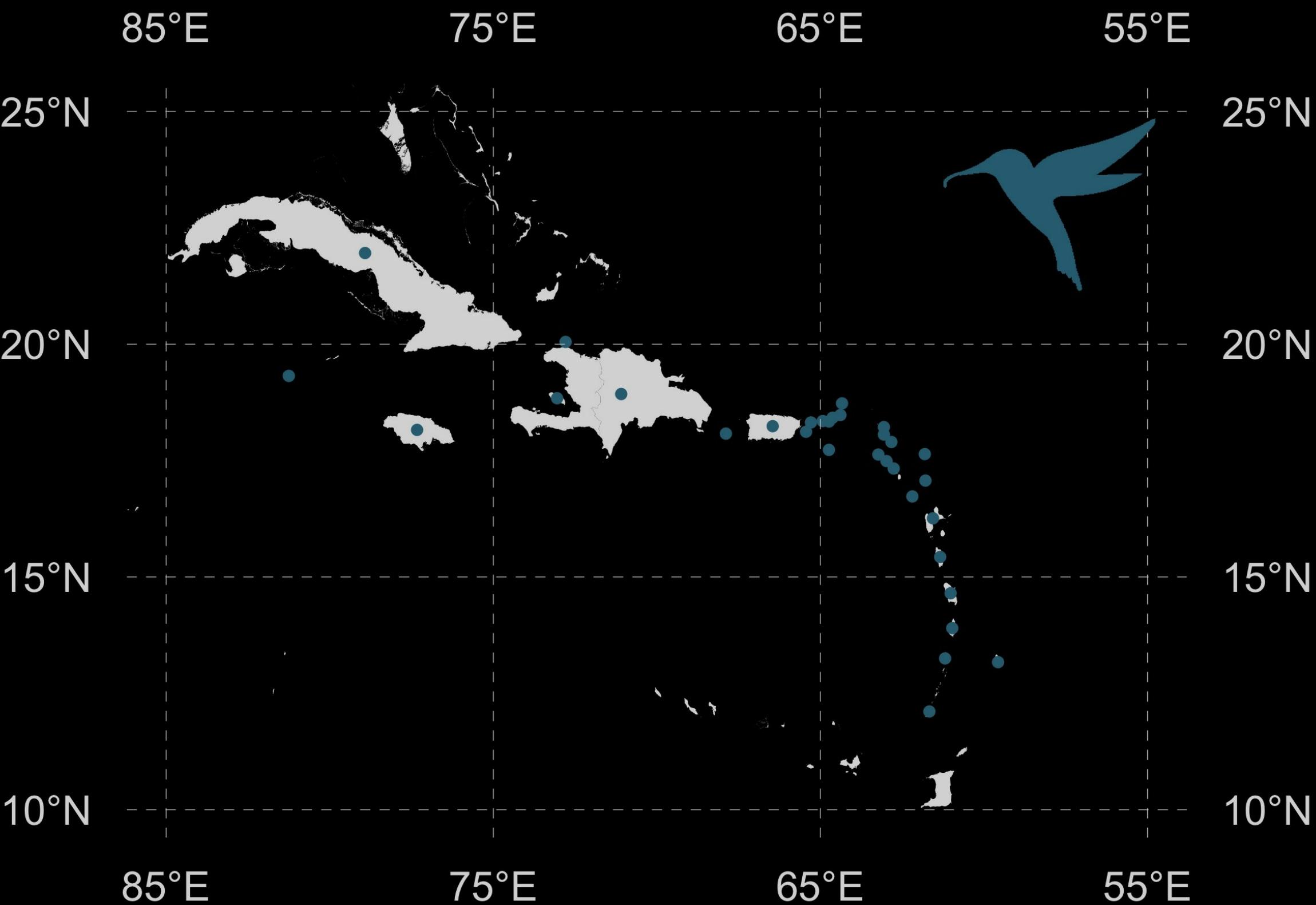
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**Real datasets**

# Salix / Herbivores / Parasitoids (>150 species)

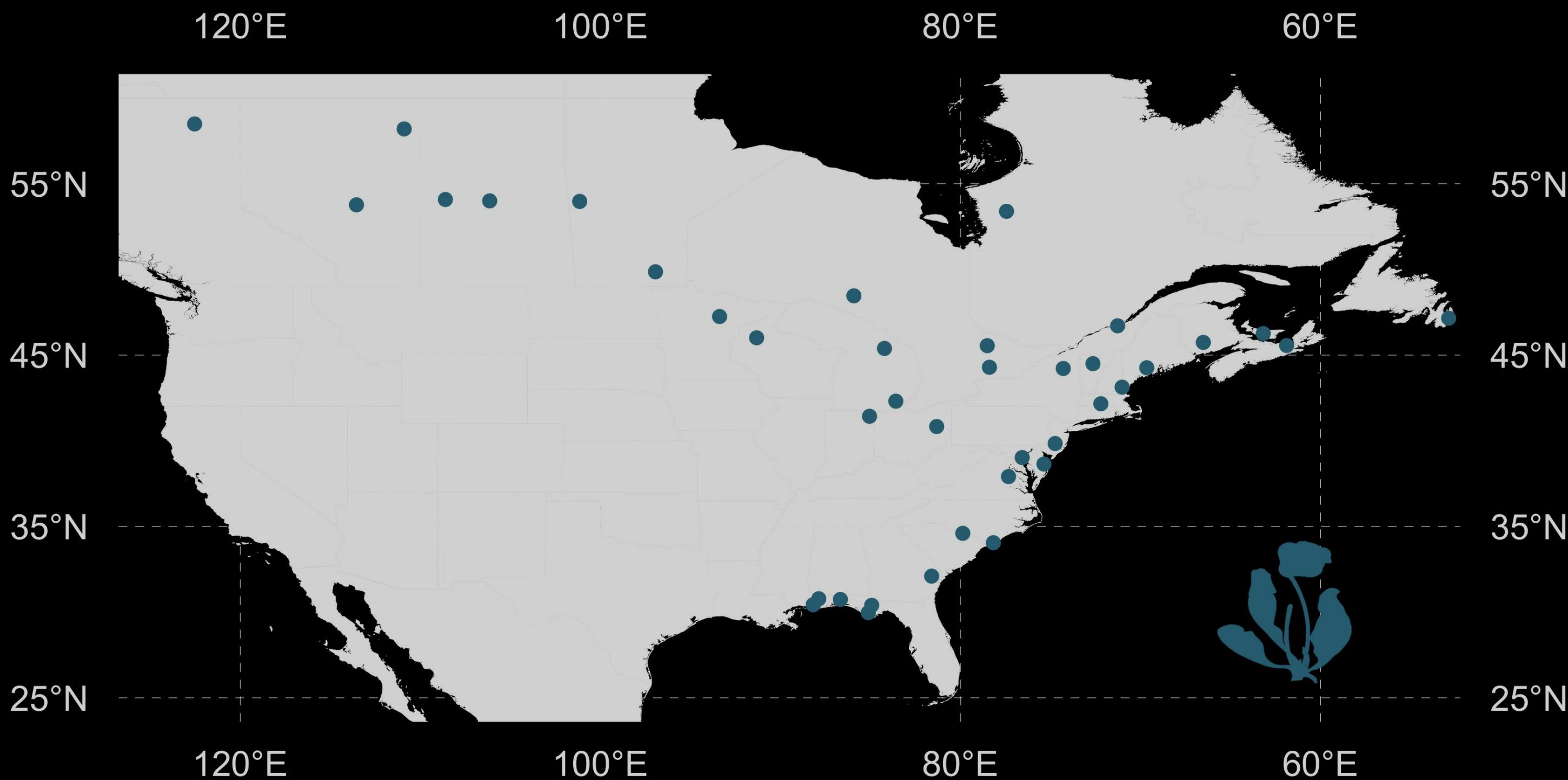


# 10 Hummingbirds / 52 host plants on 32 islands



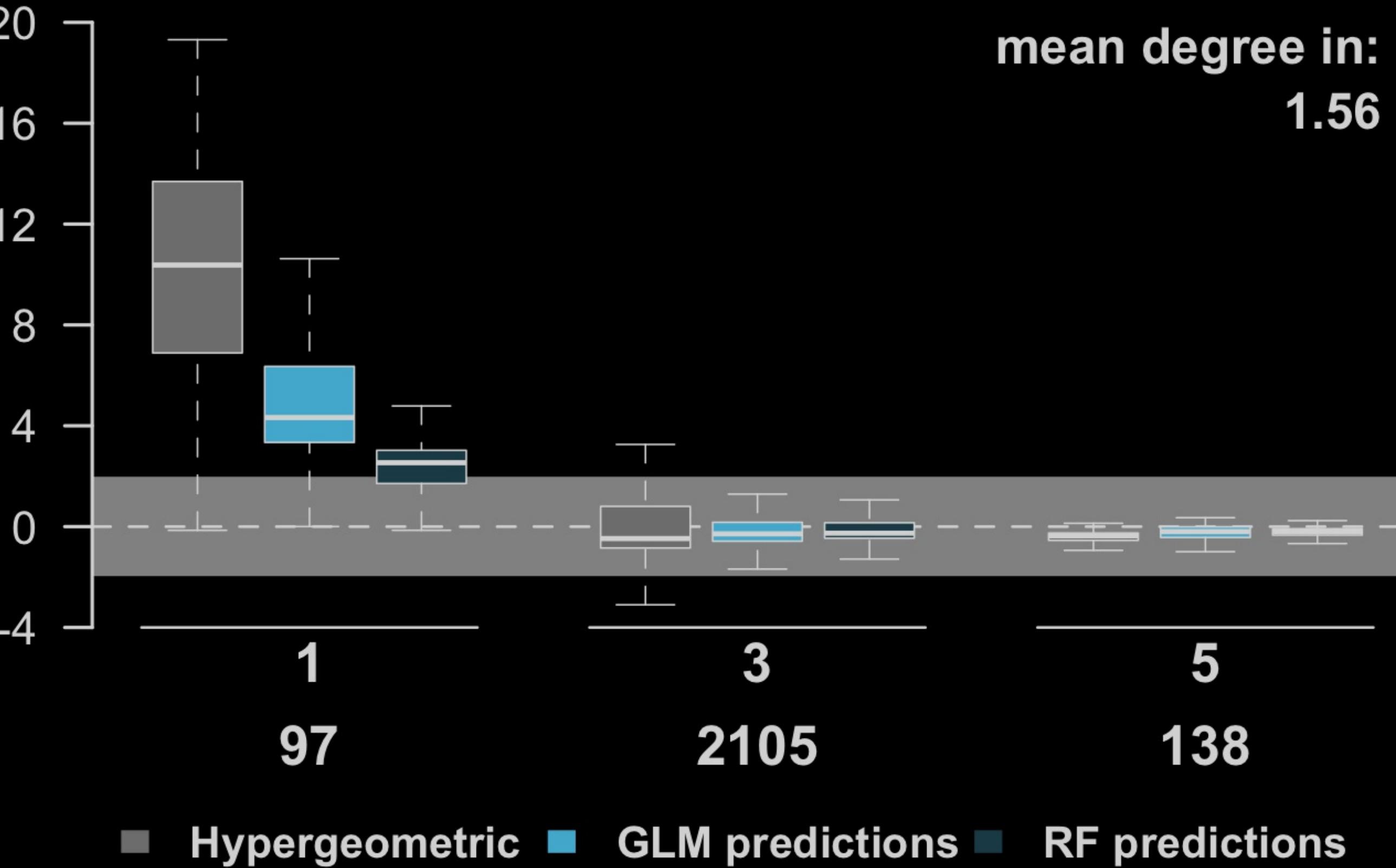
Martín González., et al. (2015). *Global Ecology and Biogeography*

# Micro-organisms community of the Pitcher plants leafs (>50 species)



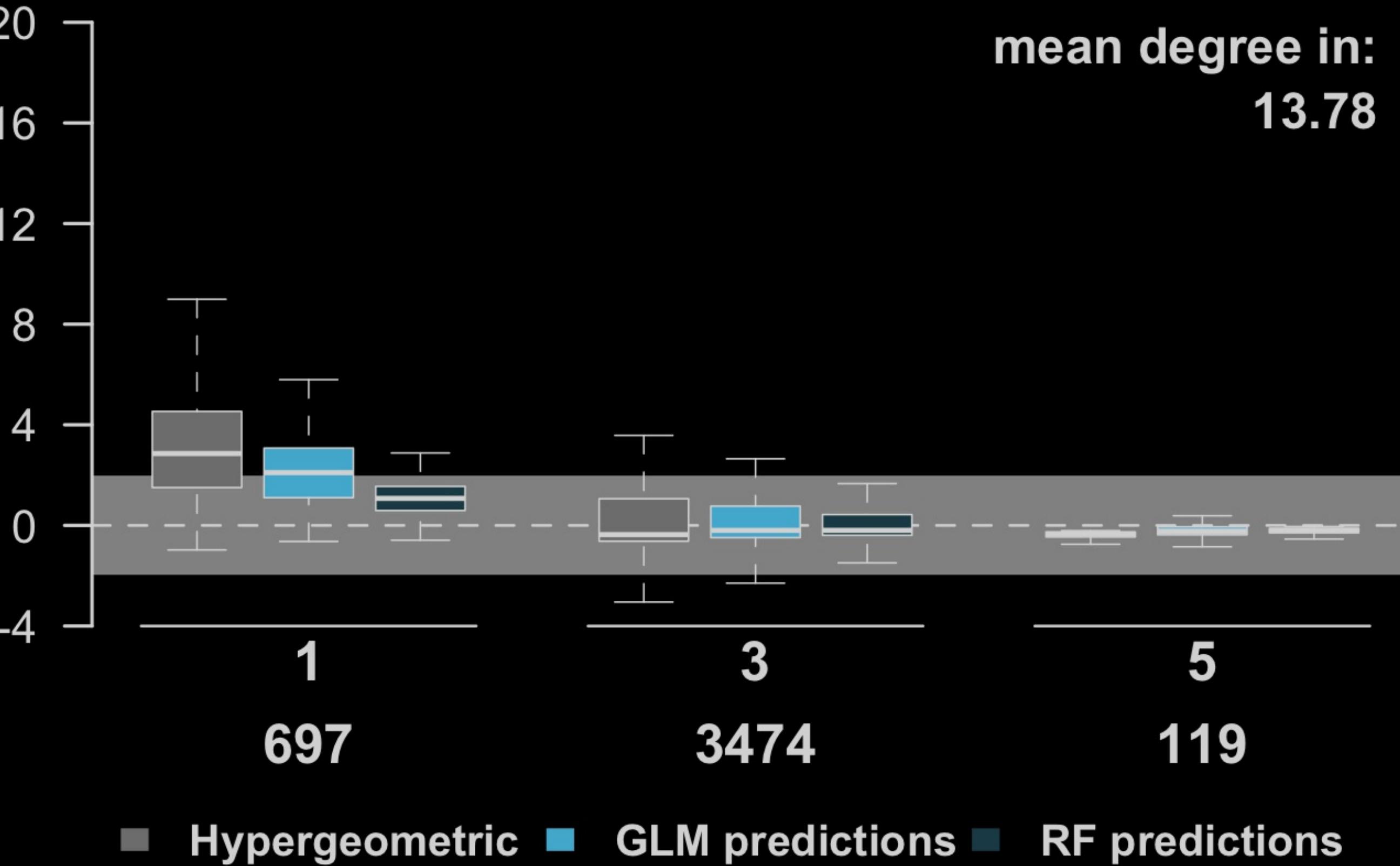
# Salix / Herbivores

Z-score



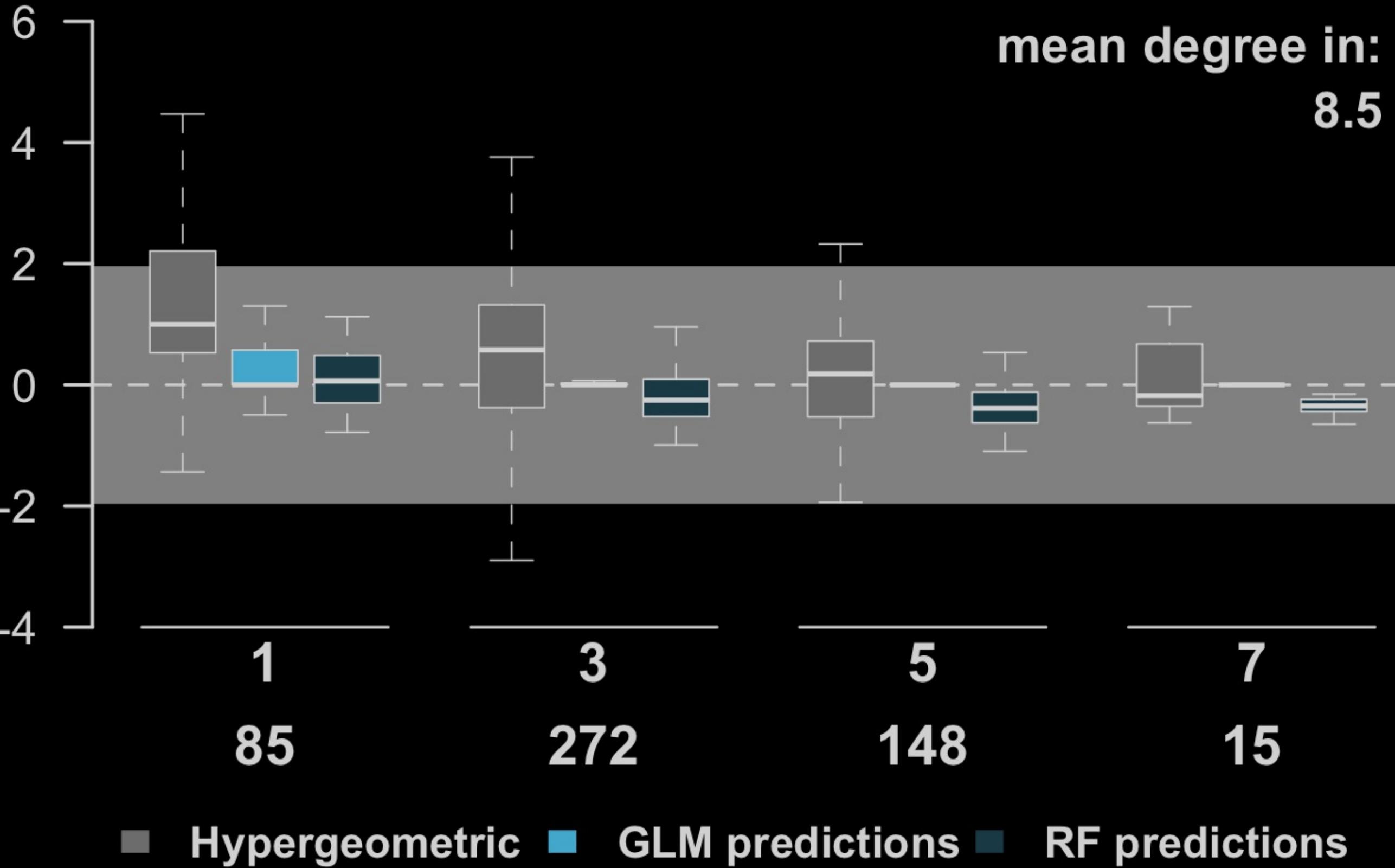
# Herbivores / Parasitoids

Z-score



# Hummingbirds / host plants

Z-score



# Pitcher plants leafs community

Z-score

6  
4  
2  
0  
-2  
-4

mean degree in:  
**20.15**

1                    2                    3  
**762**              **630**              **39**

■ Hypergeometric ■ GLM predictions ■ RF predictions

# CONCLUSION

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**Integrating interaction in biogeography**

So, do ecological interactions impact geographic distributions of species?

---

**YES**

So, do ecological interactions impact geographic distributions of species?

---

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Can we detect them in static occurrence data?

→ it may be a matter of network topology.

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1. → in networks with high connectance, species can be considered as independent.

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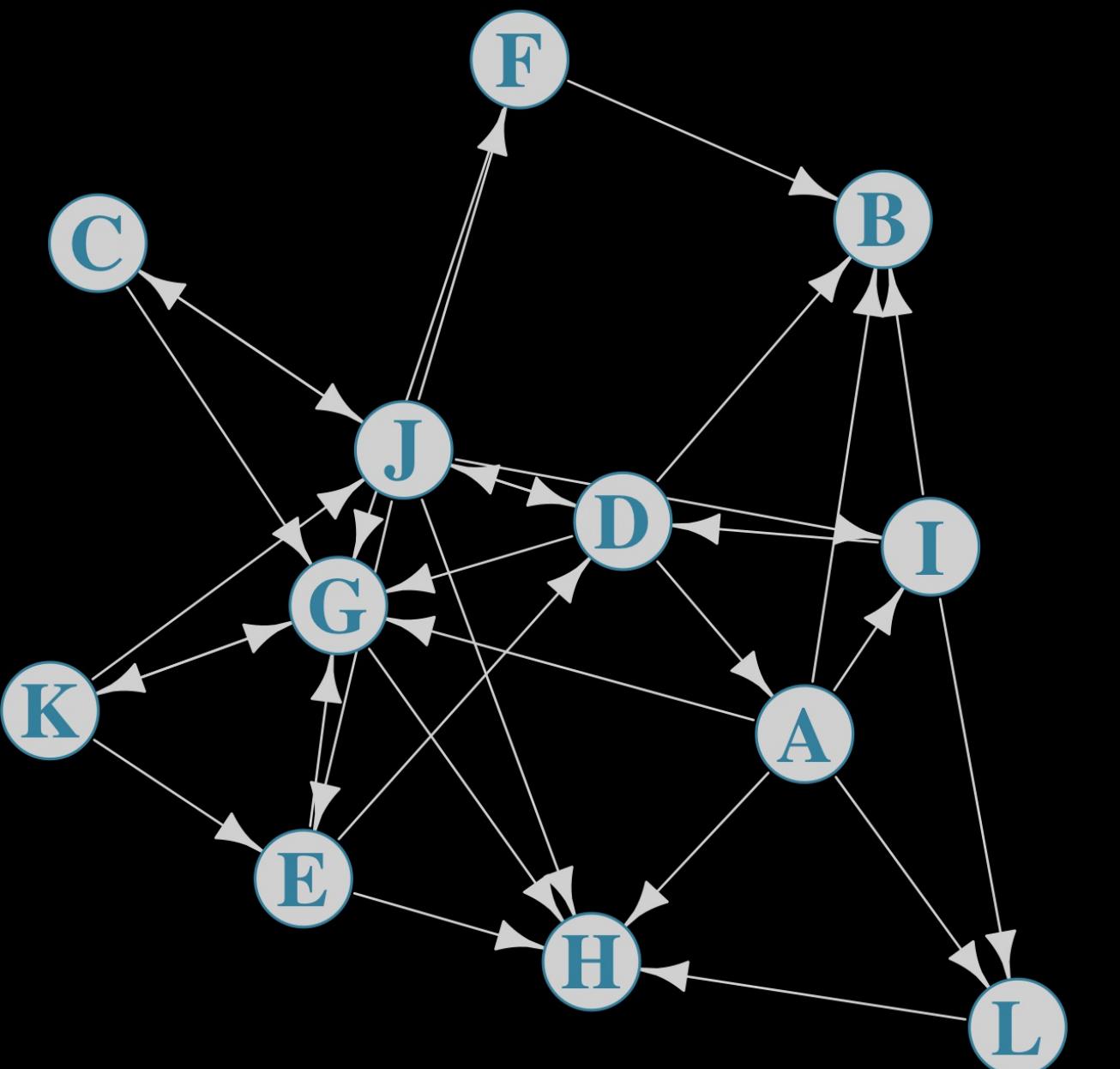
→ it may be a matter of network topology.

1. → in networks with high connectance, species can be considered as independent.
2. → species separated by more than one link can be considered as independent.

# Are our predictions reliable?

---

Tomorrow



# Are our predictions reliable?

---

# Are our predictions reliable?

---

→ as long as interactions are abundant enough

## Are our predictions reliable?

---

- as long as interactions are abundant enough
- if species assemblages move together

## Are our predictions reliable?

---

- as long as interactions are abundant enough
- if species assemblages move together
- How likely it is?

Not very much I guess.

# Toward a more integrative biogeography

---

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---

- We should not assume *a priori* that species are independent units

# Toward a more integrative biogeography

---

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- Not only a spatial scale matter ...

# Toward a more integrative biogeography

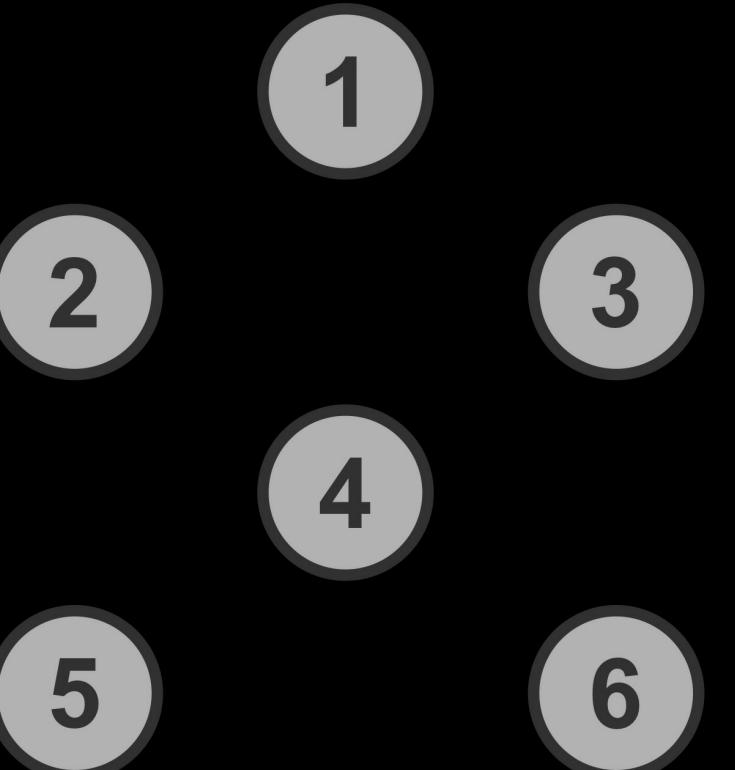
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- We should not assume *a priori* that species are independent units
- Not only a spatial scale matter ...  
... but also a matter of relevant biological unit for biogeography.

# Toward a more integrative biogeography

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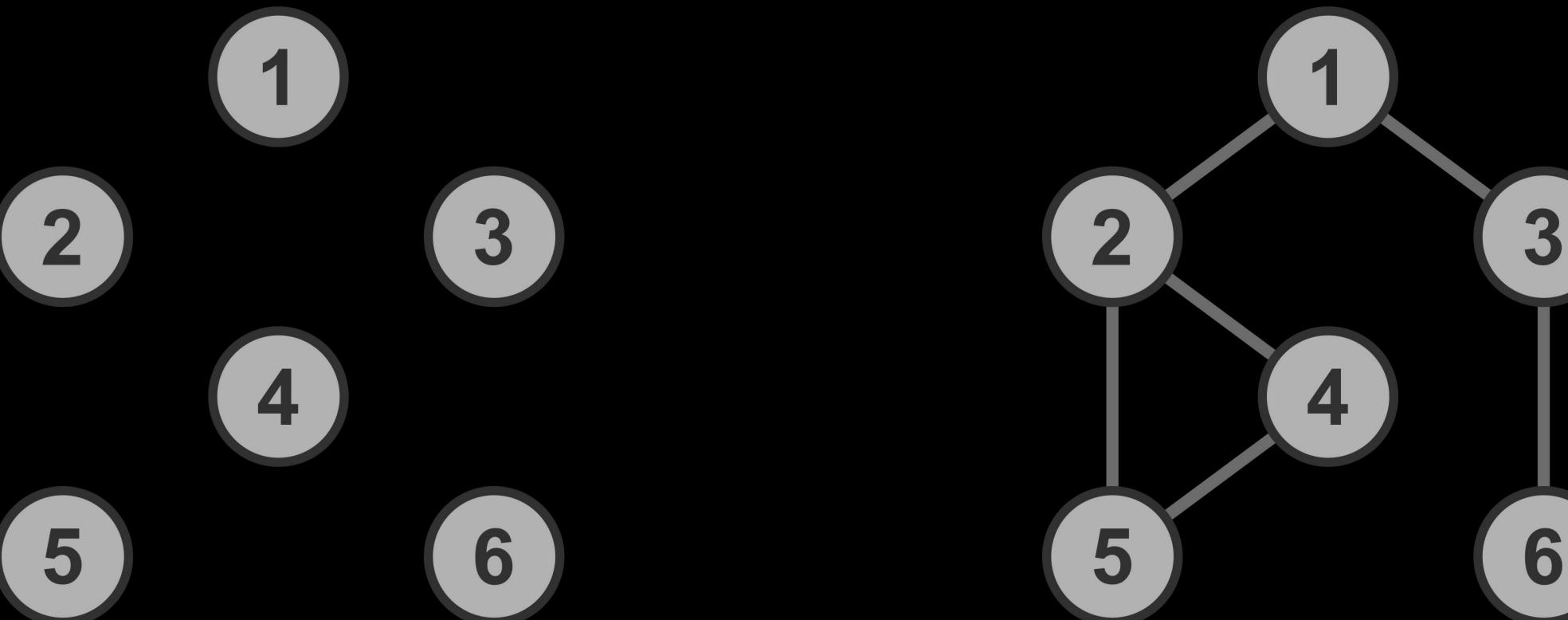
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# ACKNOWLEDGMENT

---

## People

- Tomas Roslin
- Benjamin Baiser
- Bo Dalsgaard
- Louise J. Lehmann
- Allan Timmermann
- Ana M Martín González
- Andrea Baquer

## Funding agencies

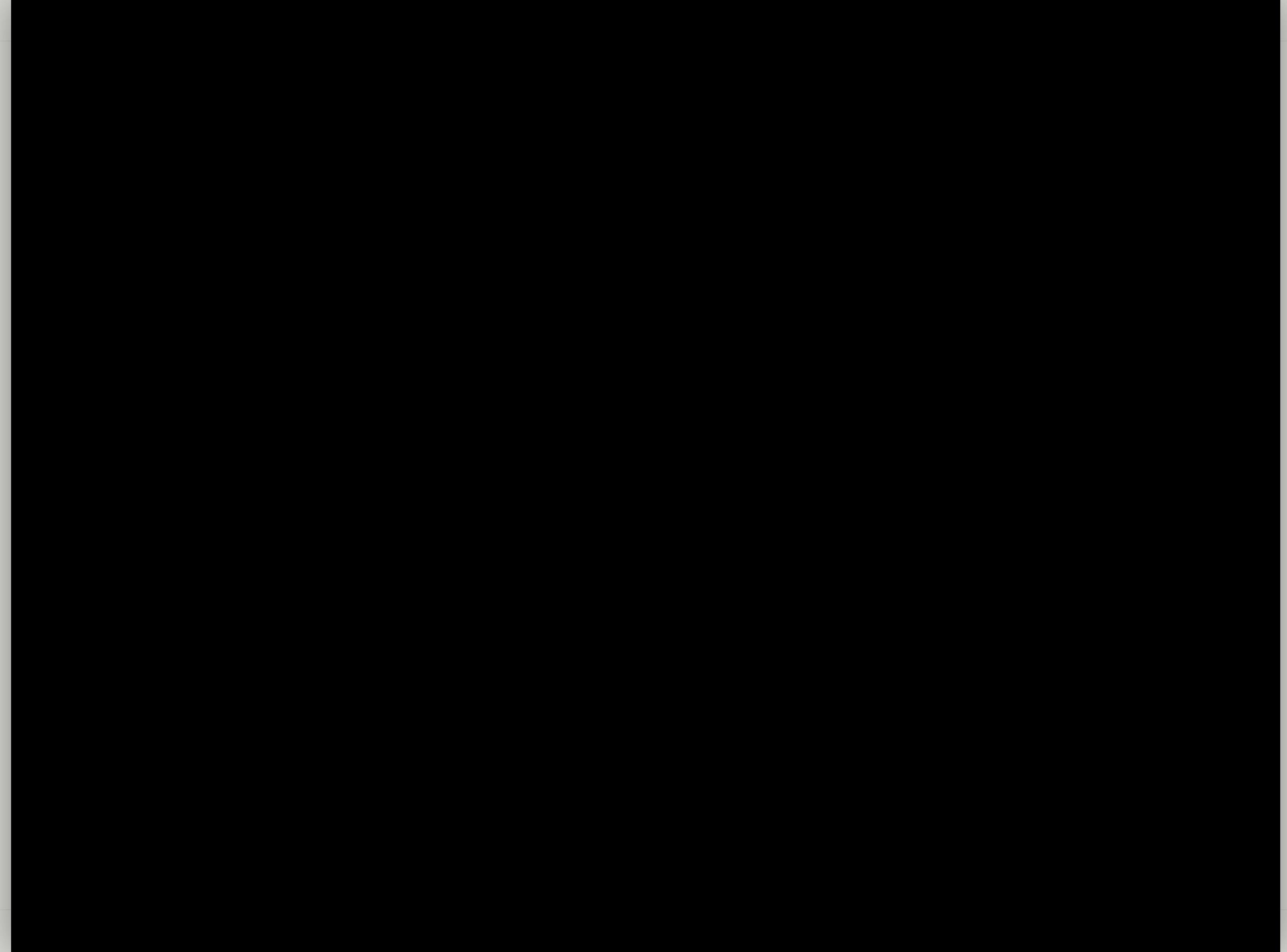
- FRQNT

- Frontenac

# THANK YOU FOR YOUR ATTENTION

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**Any question?**



## Co-occurrence and shortest path

