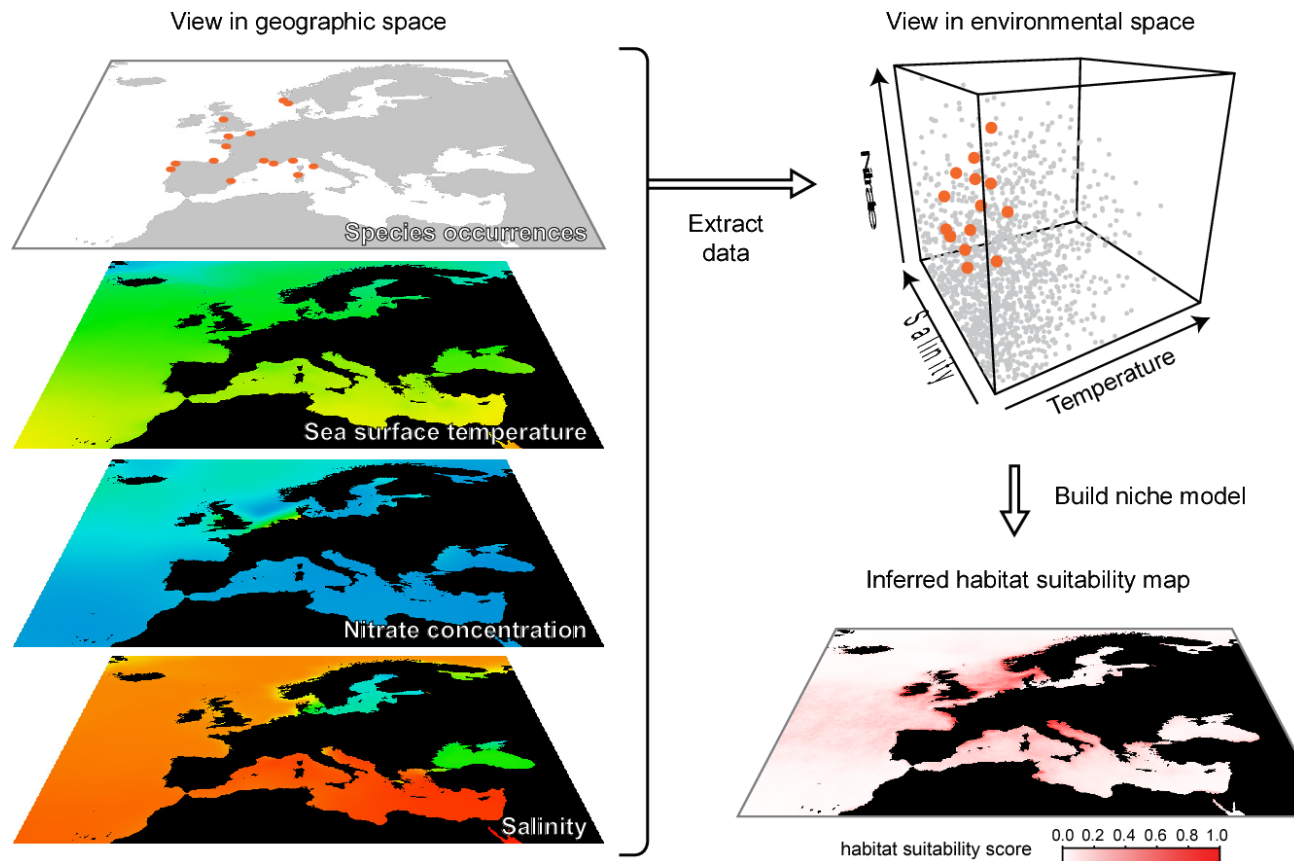
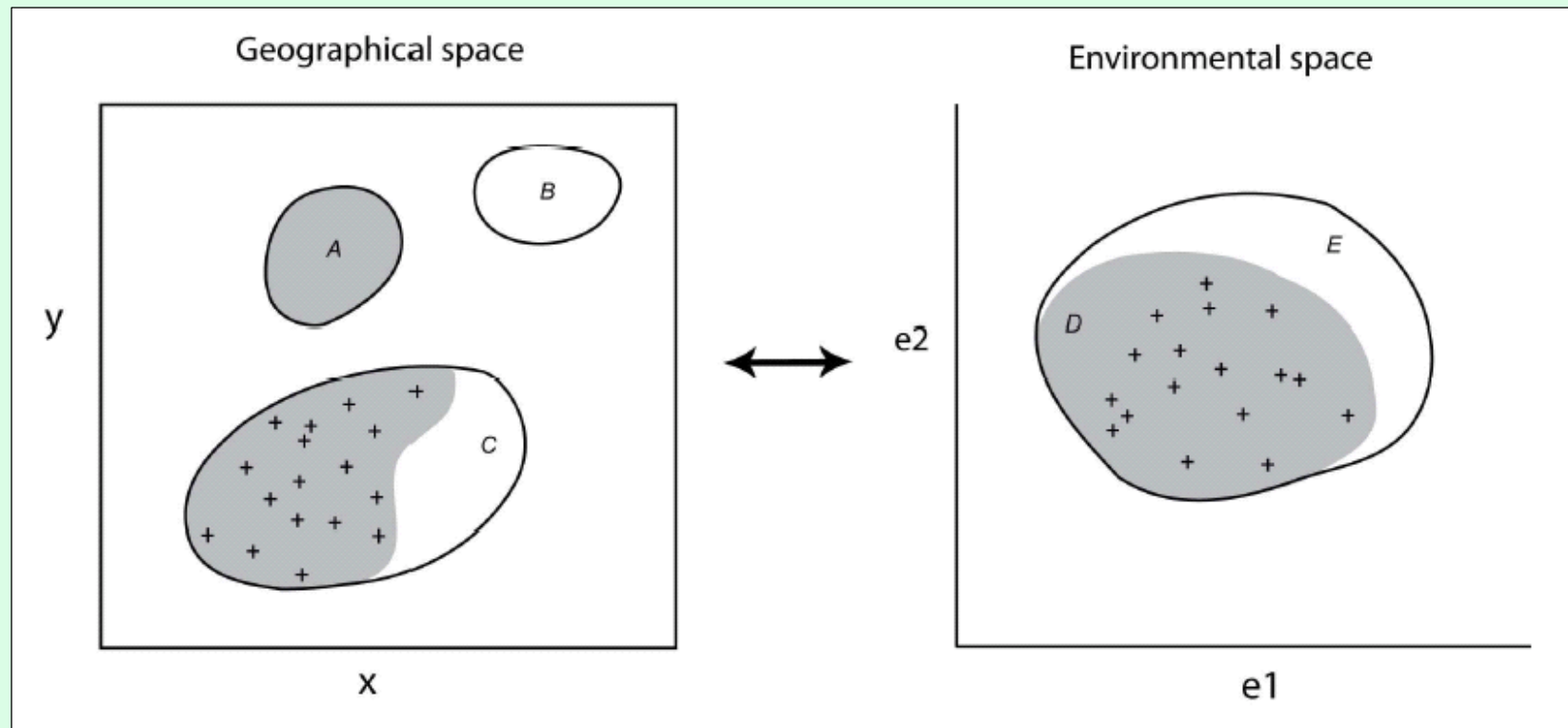


Intro to Ecological Niche Models with MaxEnt

Eugenio Valderrama ev243@cornell.edu

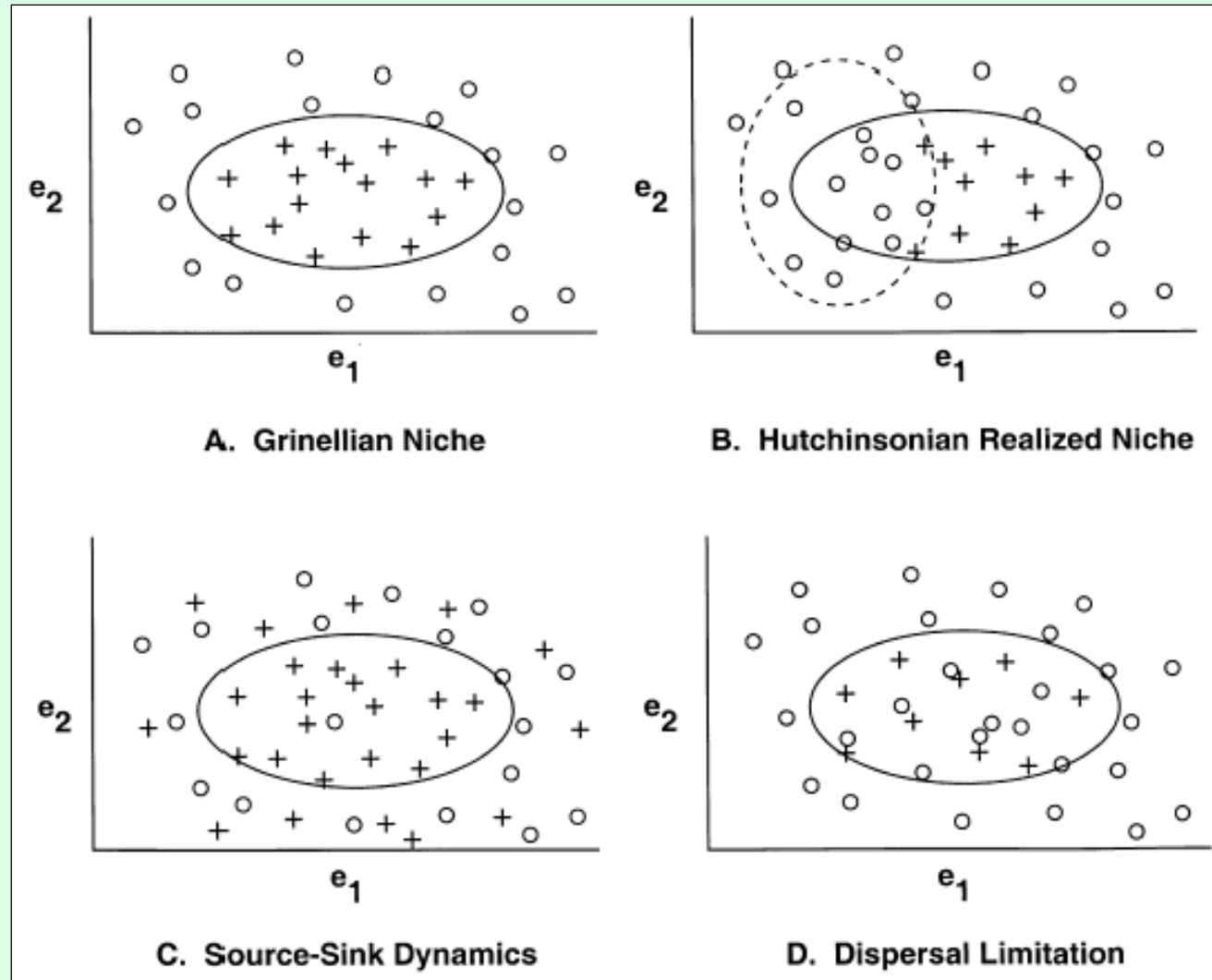


G-space and E-space



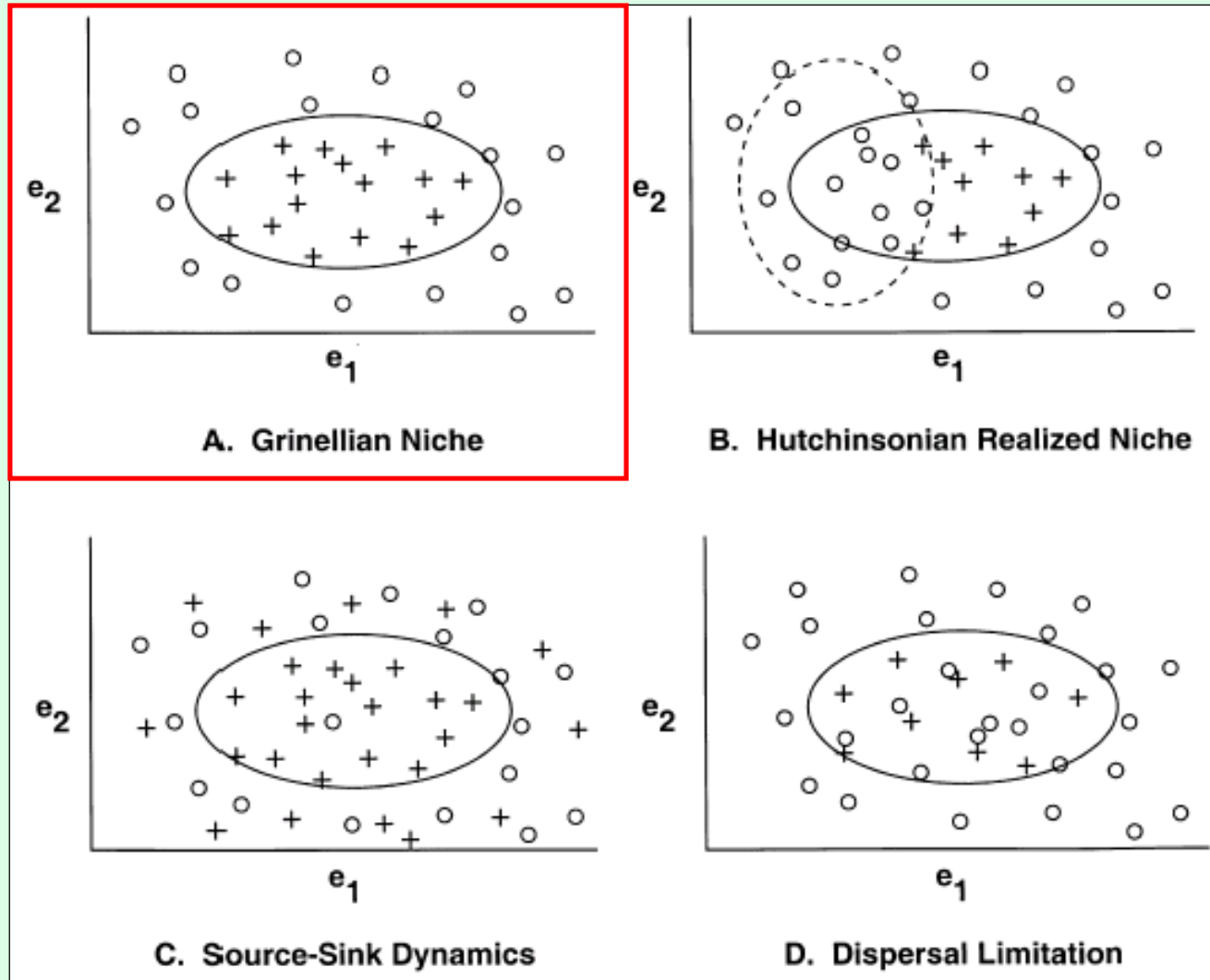
(Pearson, 2008)

Niche theory



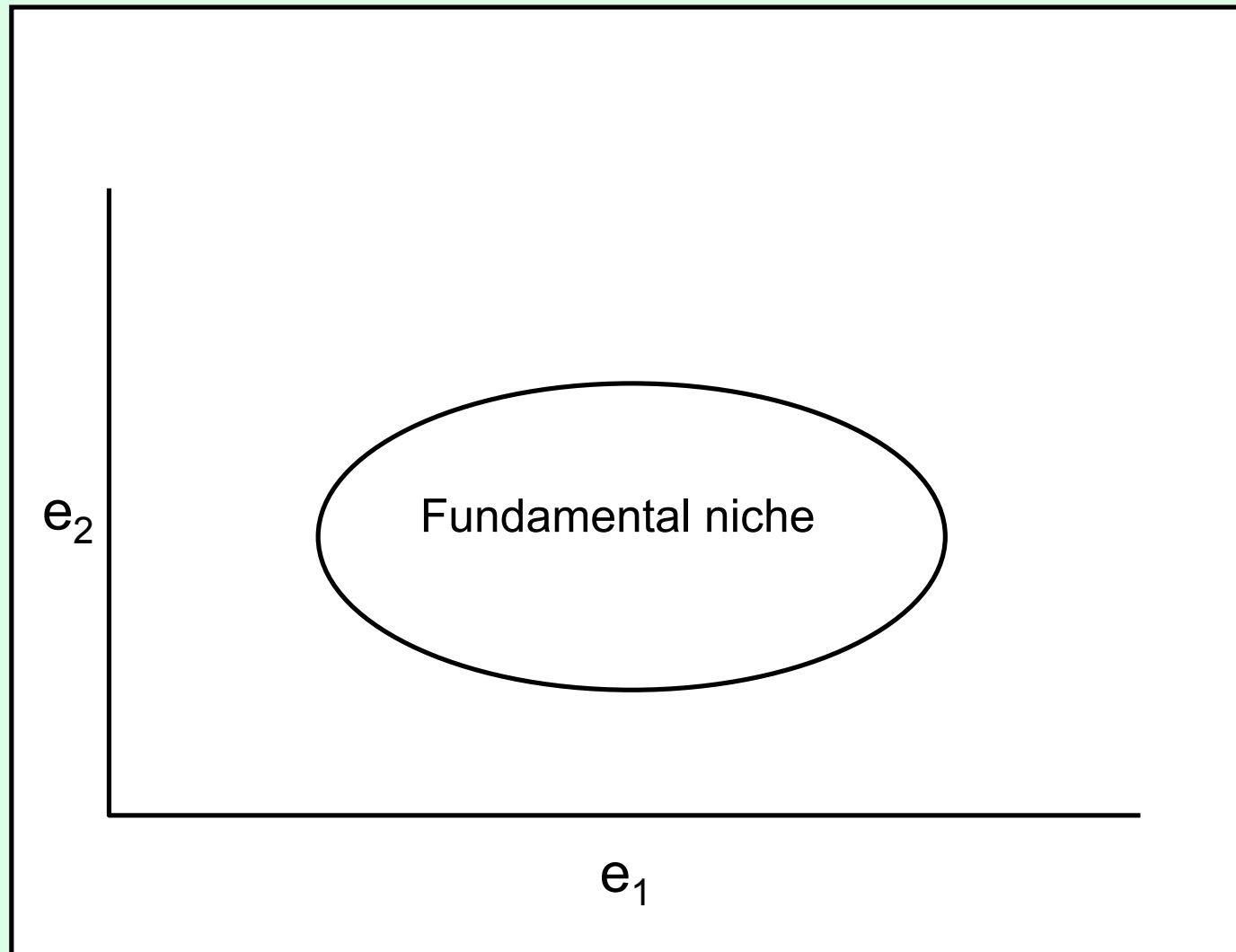
(Pulliam, 2000)

Niche theory



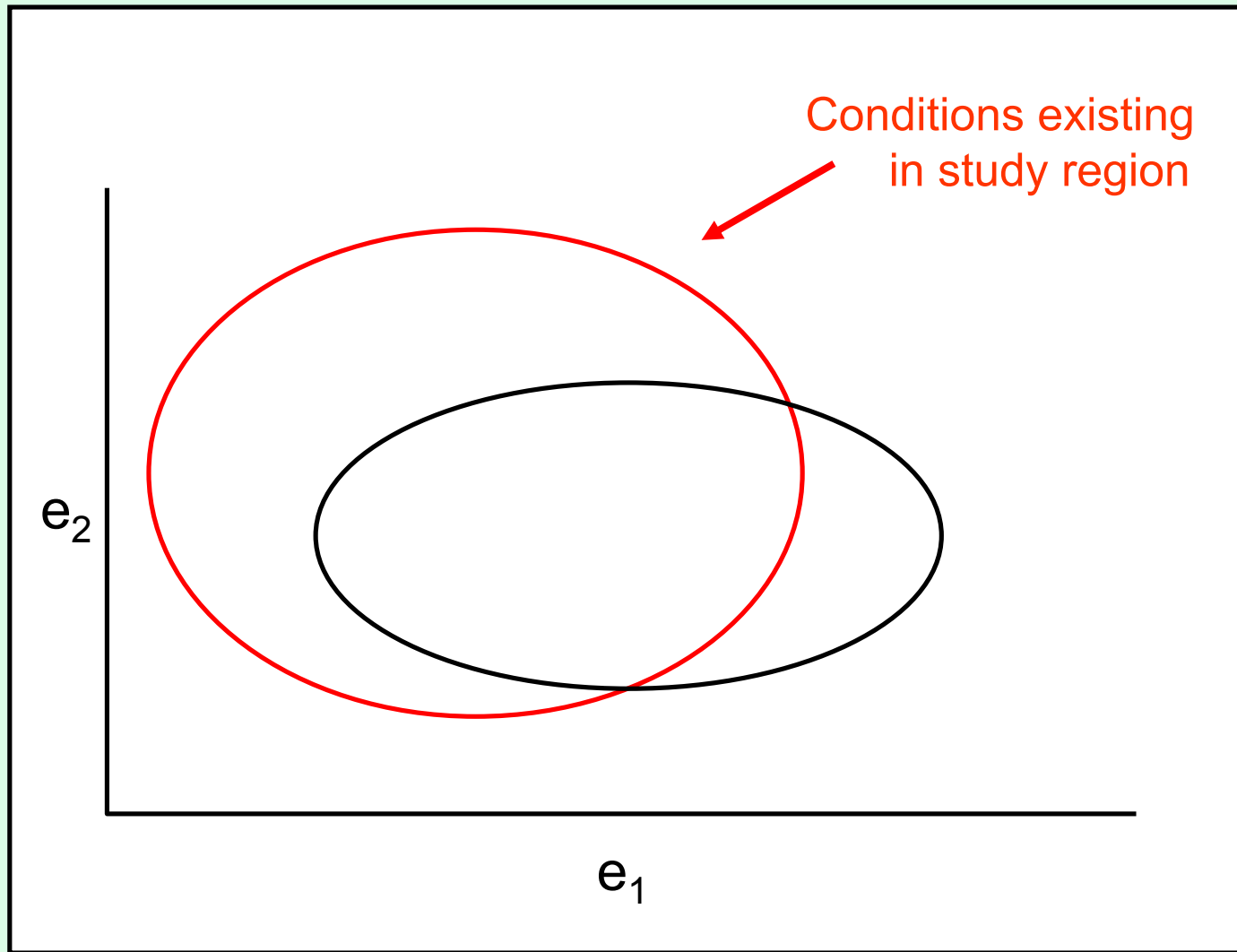
(Pulliam, 2000)

Niche theory



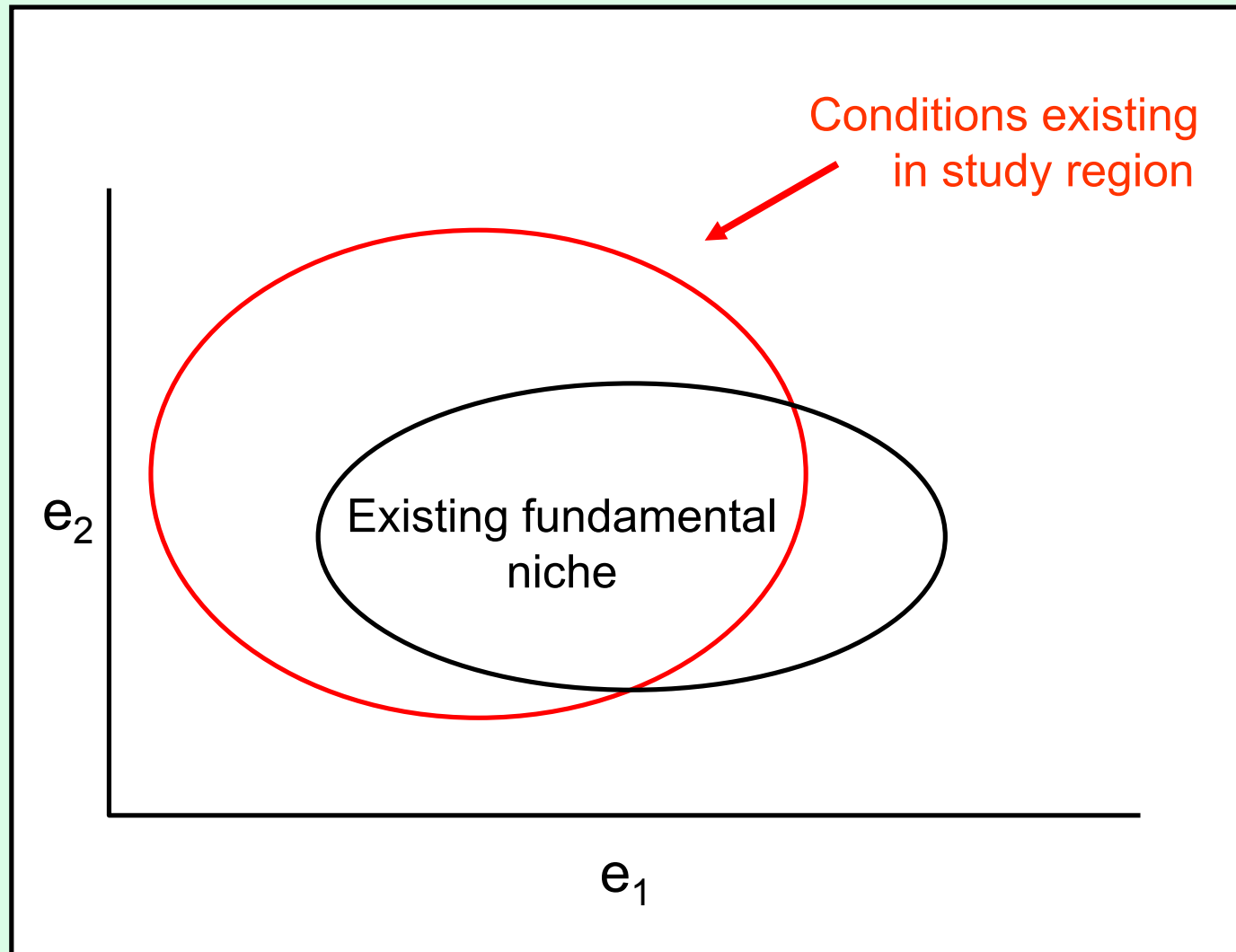
(Pulliam, 2000)

Niche theory



(Jackson and Overpeck, 2000)

Niche theory



(Jackson and Overpeck, 2000; their “potential niche”)

Non-equilibrium distributions

Occupied distributions may be smaller than *abiotically suitable distributions* due to:

1. Contingent factors
 - a. lack of dispersal
 - b. local extinction

Non-equilibrium distributions

Occupied distributions may be smaller than *abiotically suitable distributions* due to:

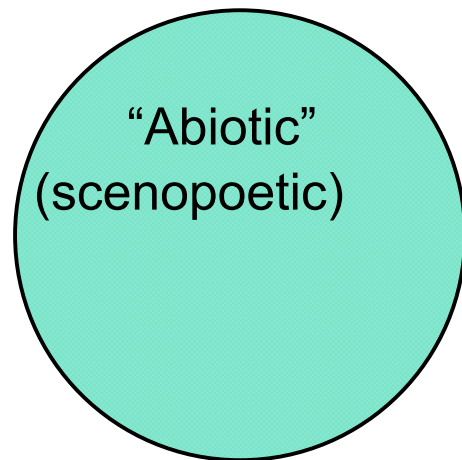
1. Contingent factors
 - a. lack of dispersal
 - b. local extinction
2. Biotic interactions (e.g., competition)

Non-equilibrium distributions

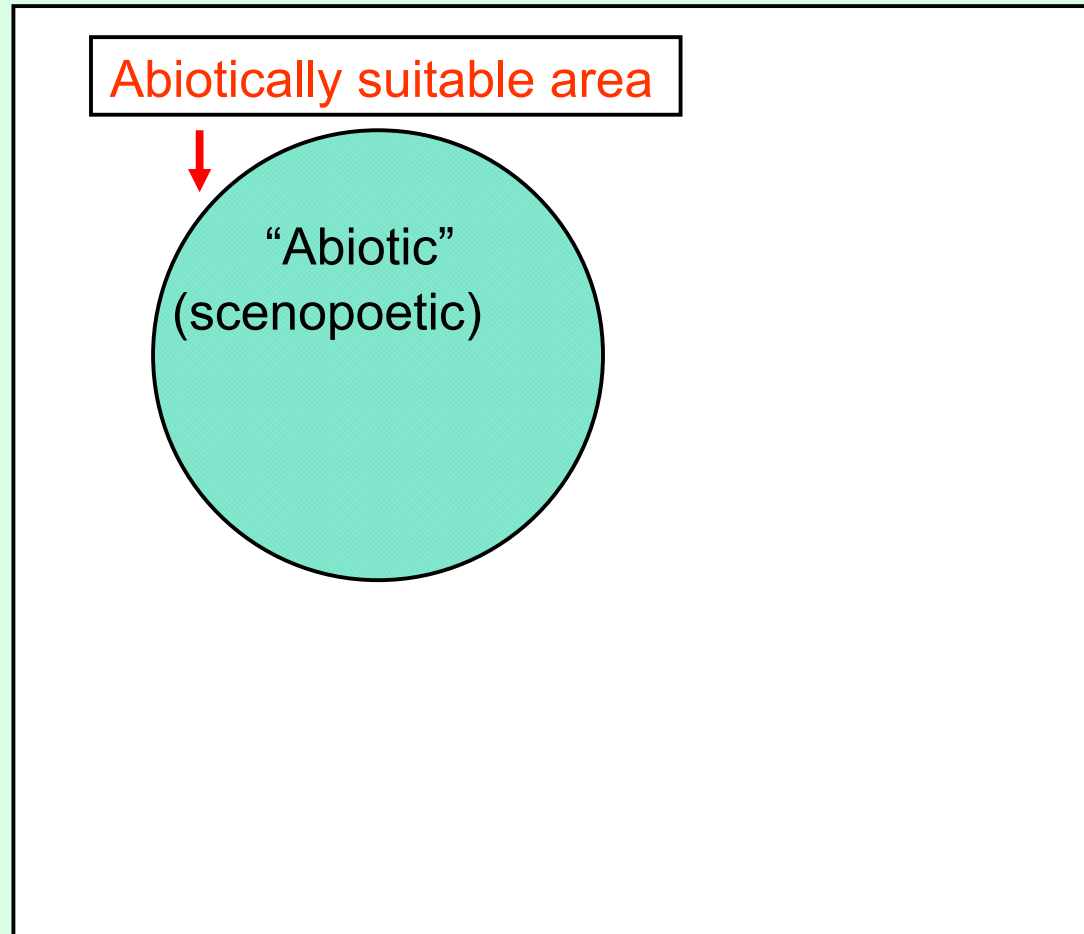
Occupied distributions may be smaller than *abiotically suitable distributions* due to:

1. Contingent factors
 - a. lack of dispersal
 - b. local extinction
2. Biotic interactions (e.g., competition)
3. Human modifications of the landscape

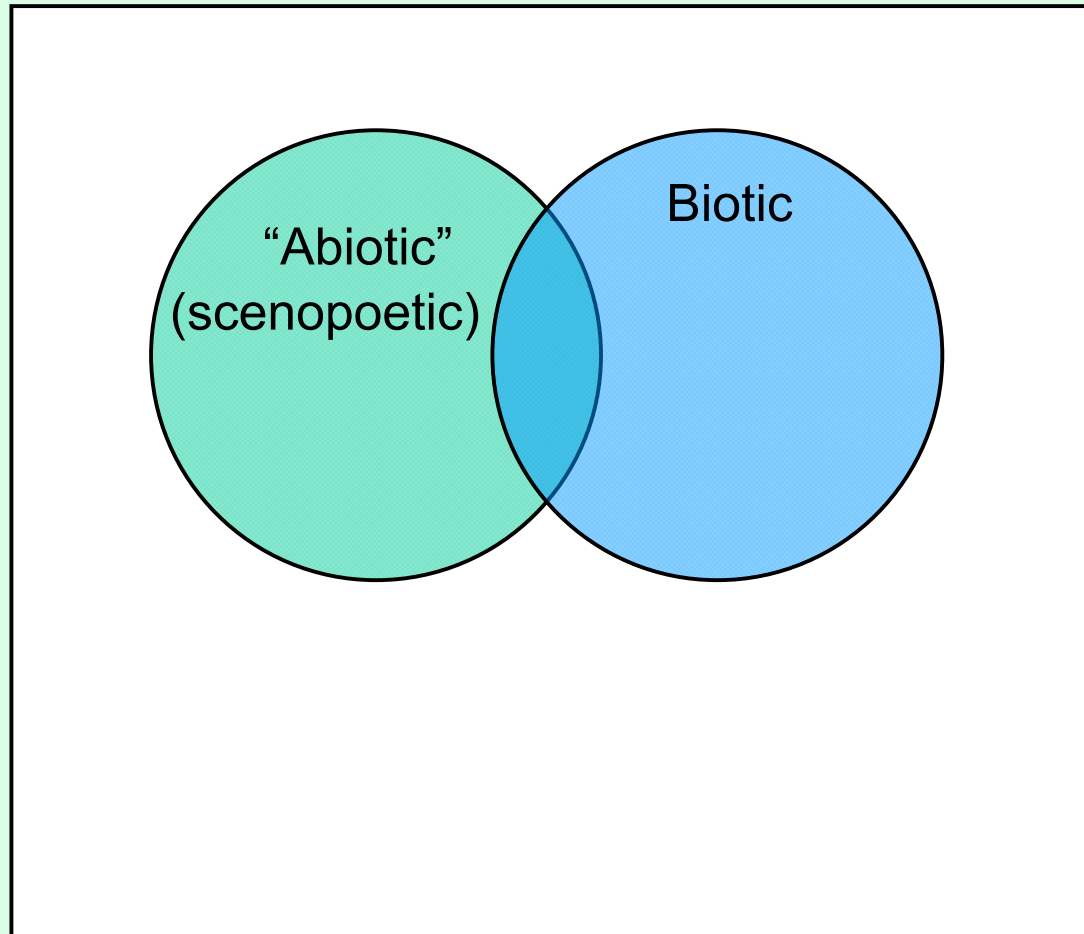
Non-equilibrium distributions



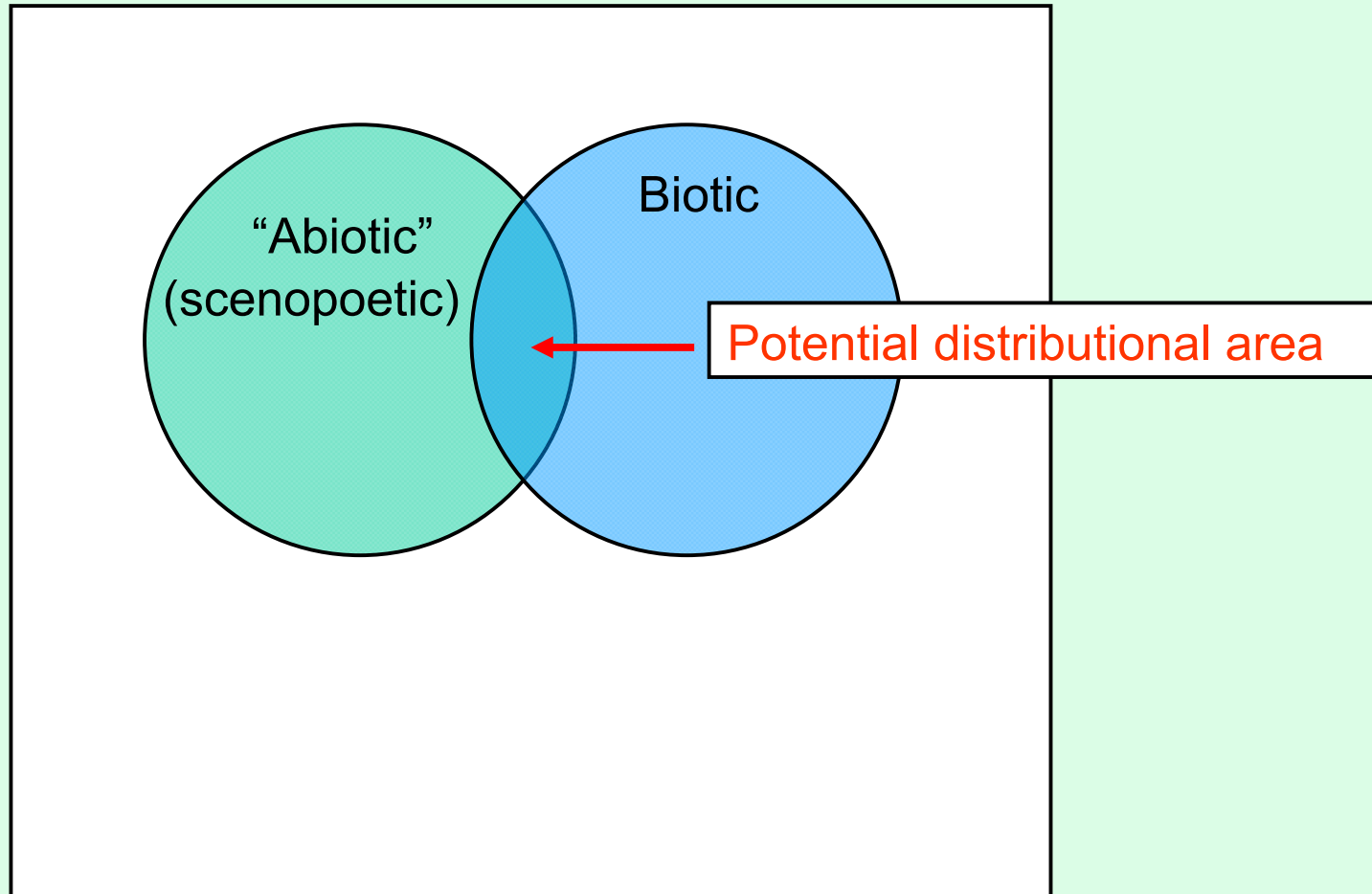
Non-equilibrium distributions



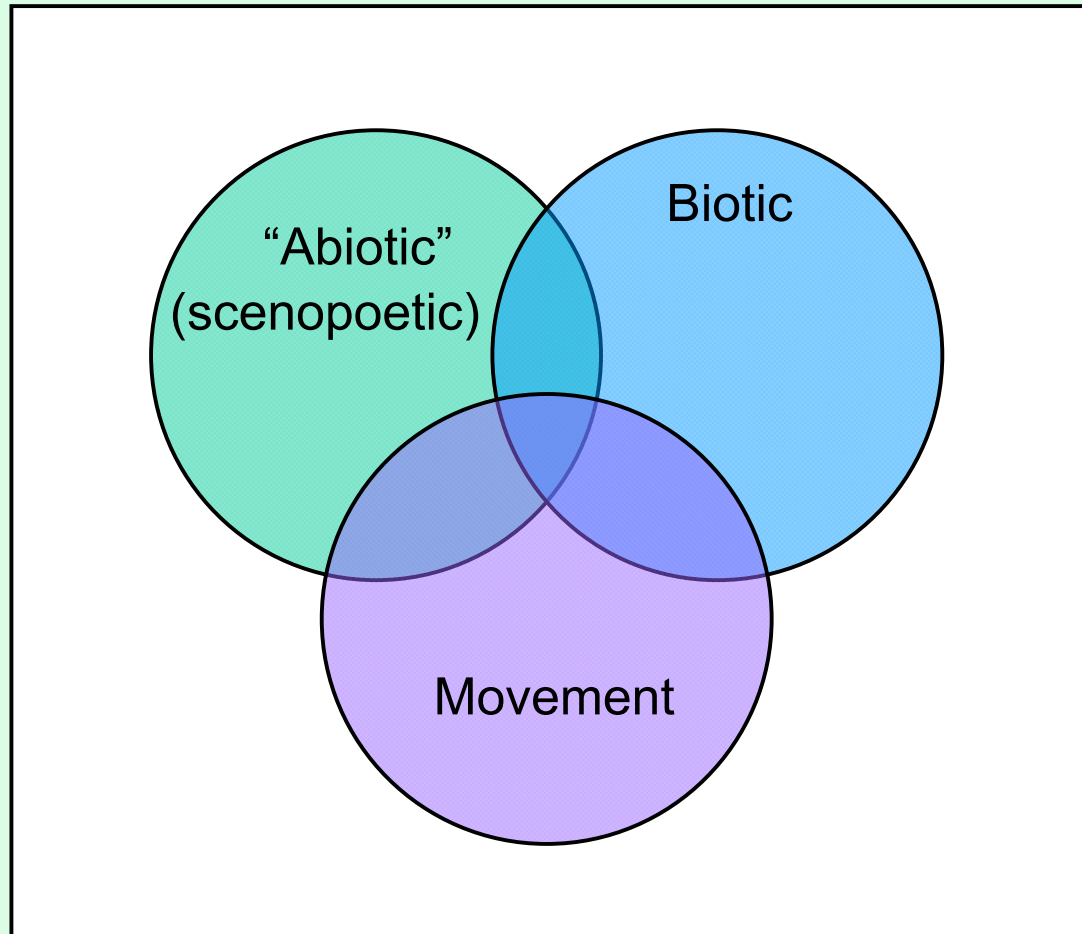
Non-equilibrium distributions



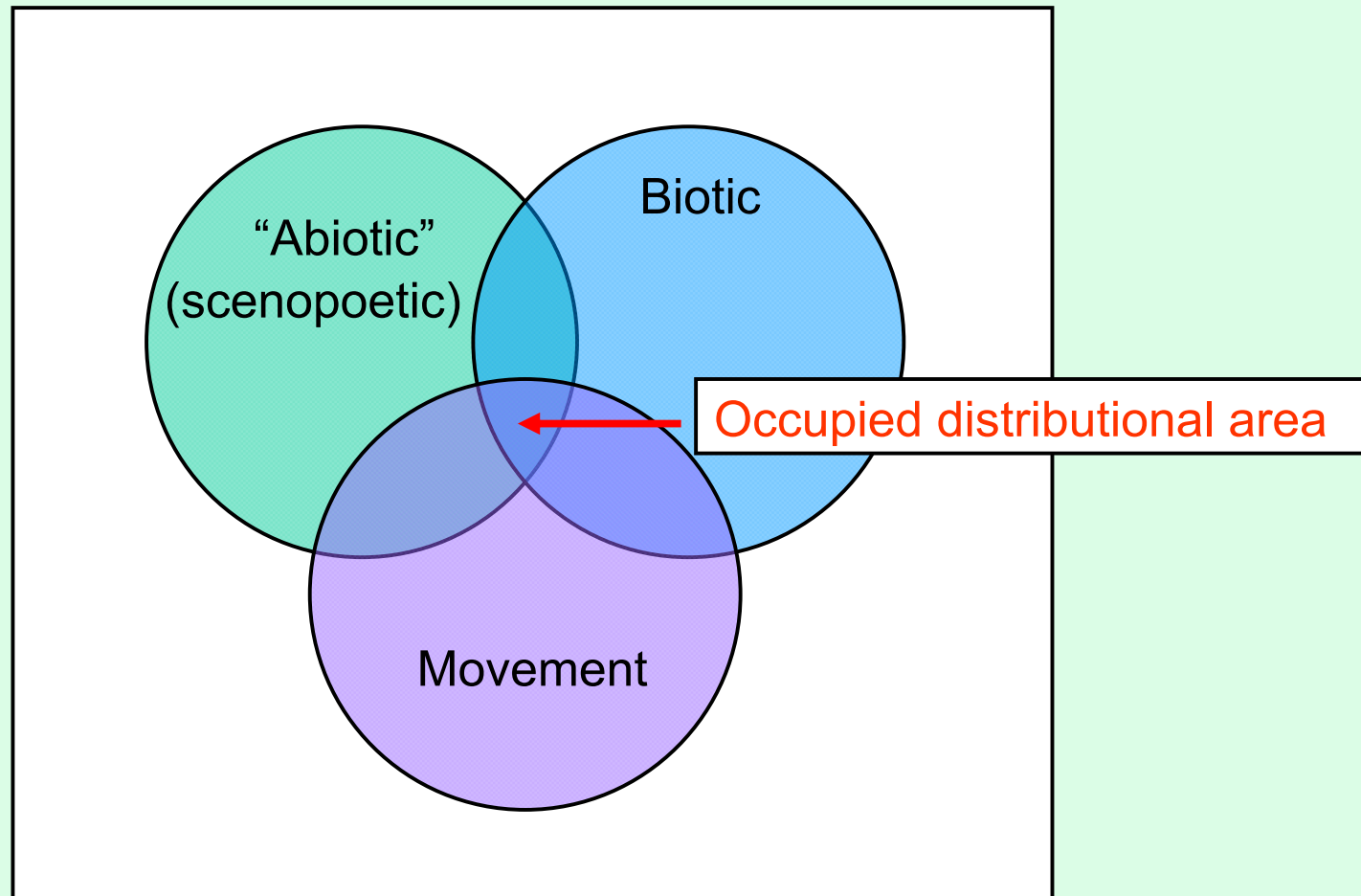
Non-equilibrium distributions



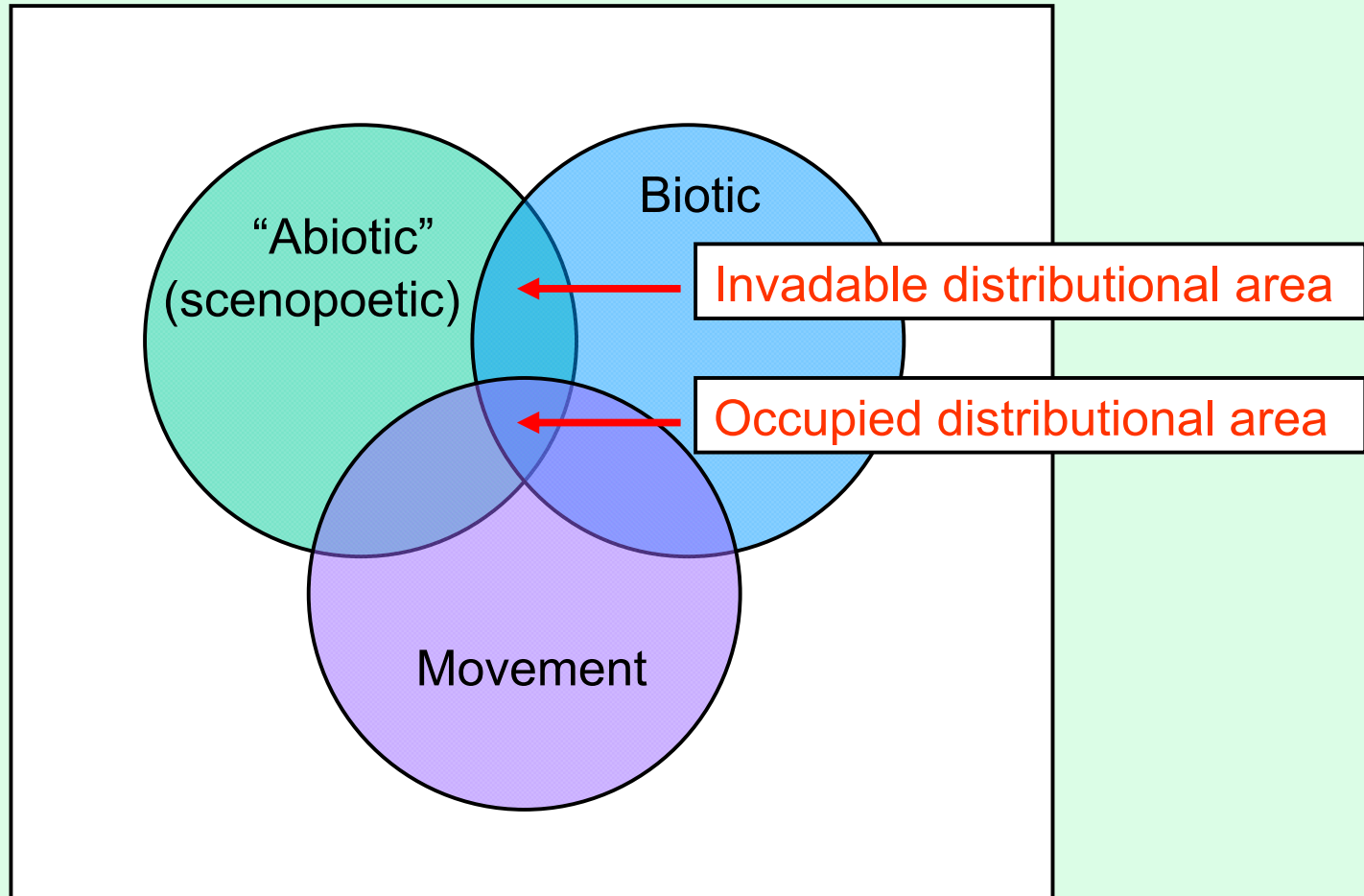
Non-equilibrium distributions



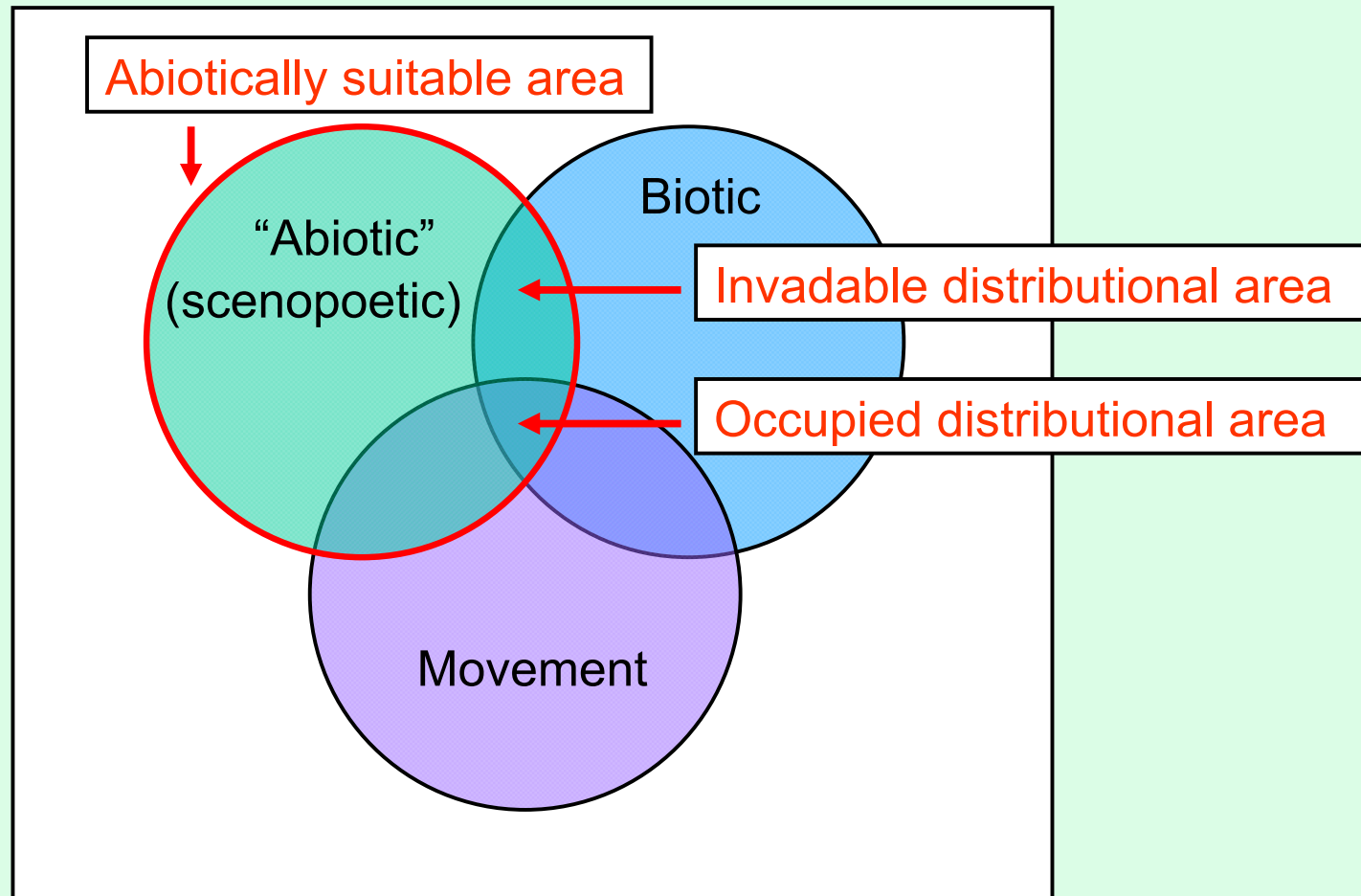
Non-equilibrium distributions



Non-equilibrium distributions



Non-equilibrium distributions



The Problem: Species Habitat Modeling

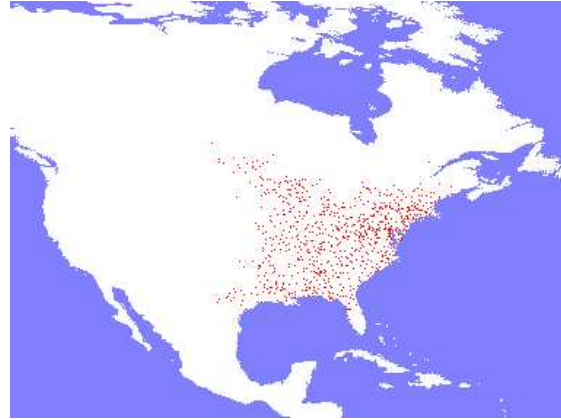
- **goal**: model distribution of plant or animal species

The Problem: Species Habitat Modeling

- **goal:** model distribution of plant or animal species

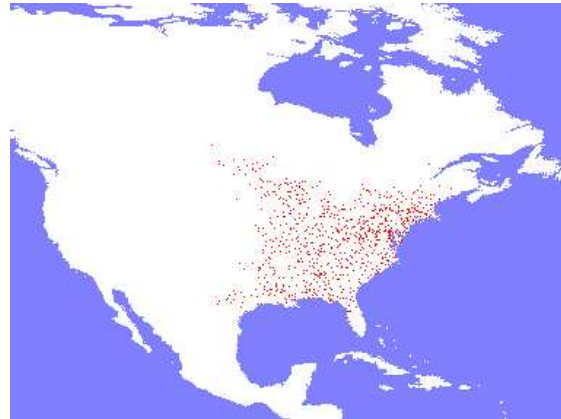
The Problem: Species Habitat Modeling

- **goal**: model distribution of plant or animal species
- **given**: presence records

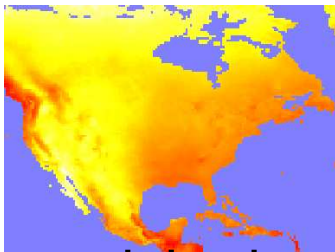


The Problem: Species Habitat Modeling

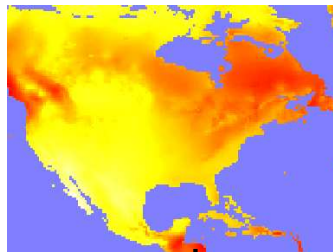
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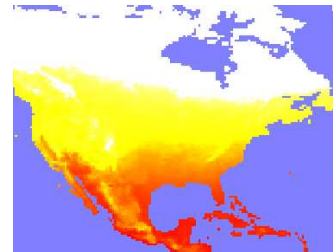
- **given:** environmental variables



precipitation



wet days

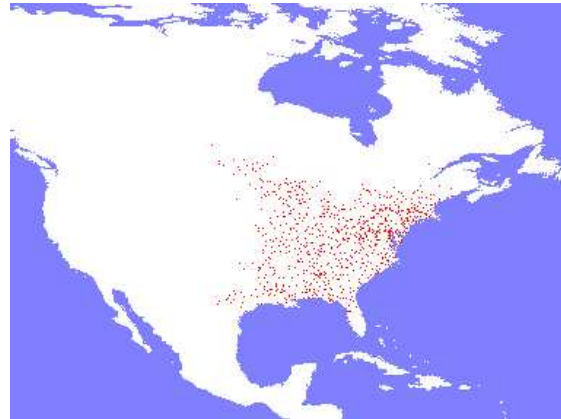


avg. temp.

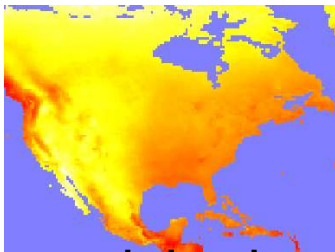
...

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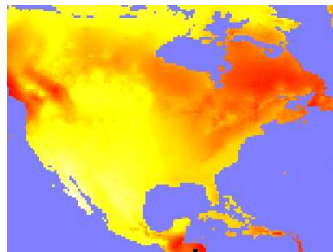
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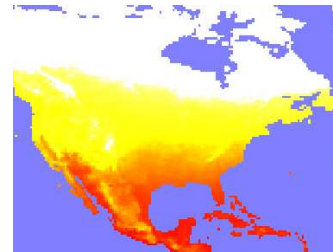
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precipitation



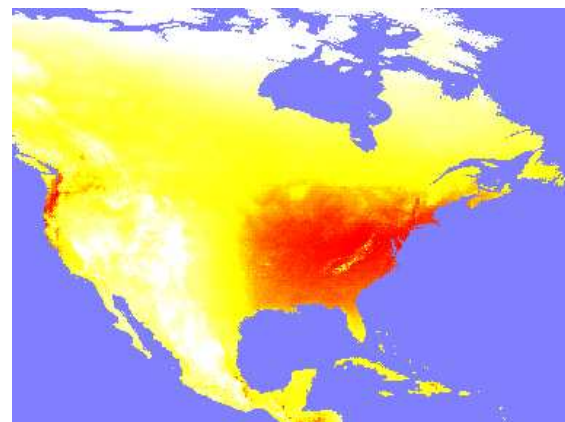
wet days



avg. temp.

...

- **desired output:** map of range



Biological Importance

- **fundamental** question: what are survival requirements (niche) of given species?
- core problem for **conservation** of species
- **first step** for many applications:
 - reserve design
 - impact of climate change
 - discovery of new species
 - clarification of taxonomic boundaries

Our Approach

- assume presence records come from probability distribution π
- try to estimate π
- apply maximum entropy approach

Maximum Entropy (Maxent) method

Estimates *target probability distribution*

by finding probability distribution (statistical model) of *maximum entropy* (i.e., most spread out, closest to uniform)

subject to *constraints*

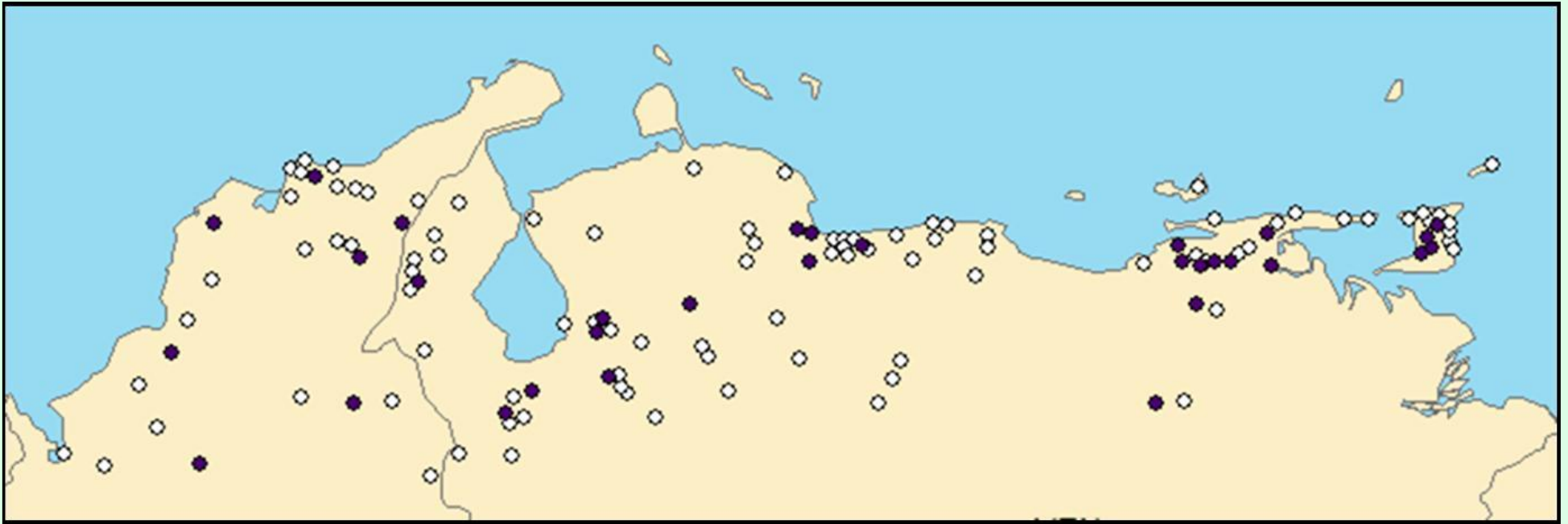
Maximum Entropy (Maxent) method

Constraints: what we know about the features

Data from the sample points (the known occurrence localities, in our case)

Random subsets

random split-sample approach: easy test, cannot detect overfitting to bias



White: calibrate the model

Black: evaluate the model

Now we will review the output of MaxEnt and the interpretation of the results

Please leave us your anonymous feedback in this link:

<https://docs.google.com/forms/d/1yVSL1IPiFVuJqPPi0v19oQBGyoJqZBoDEYLTcHTpB-M/edit?usp=sharing>

it is super, super important for us!!

Many of the slides were taken from presentations by
Robert P. Anderson & Robert Schapire