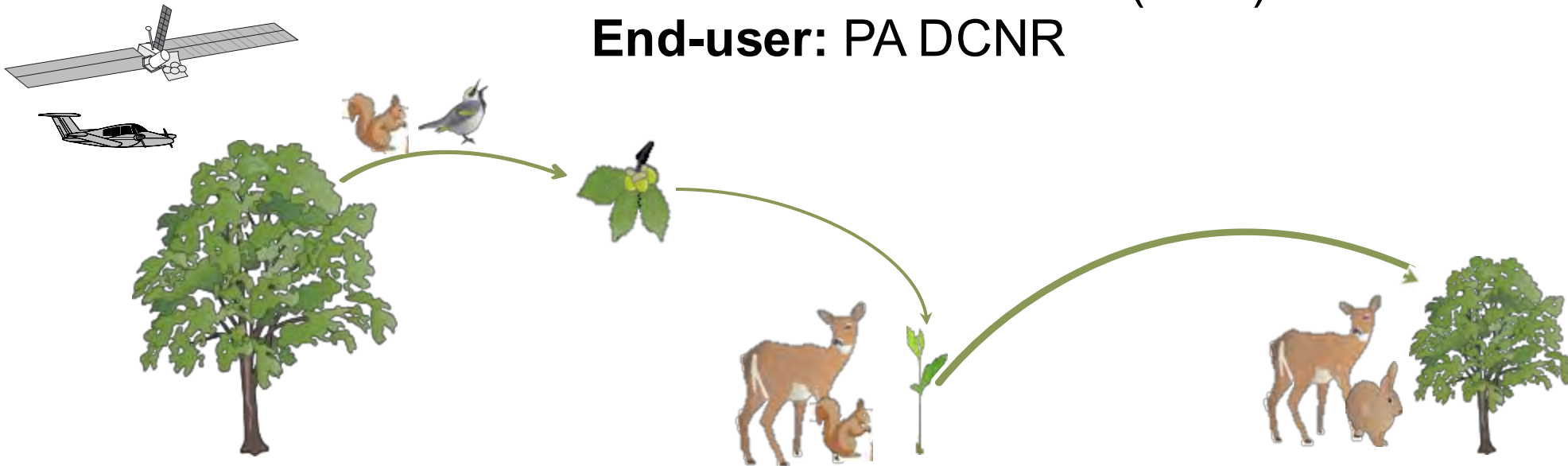


# Determining forest recruitment change through the integration of NASA Earth observation data and predictive modeling



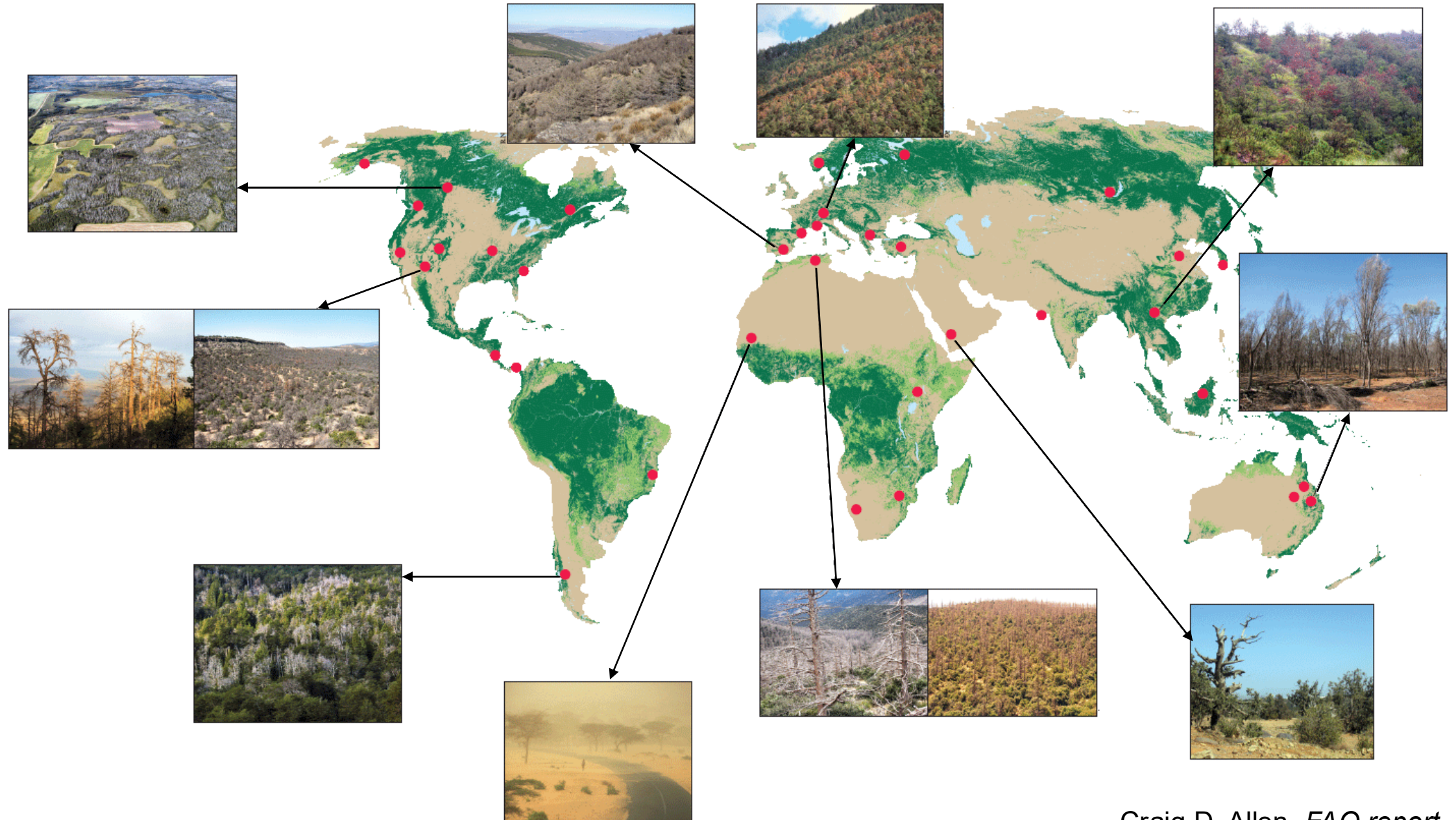
**PI:** Tong Qiu, Duke  
**Co-PIs:** James S. Clark (Duke),  
Marc E. McDill (PSU)  
**End-user:** PA DCNR



# Today's agenda

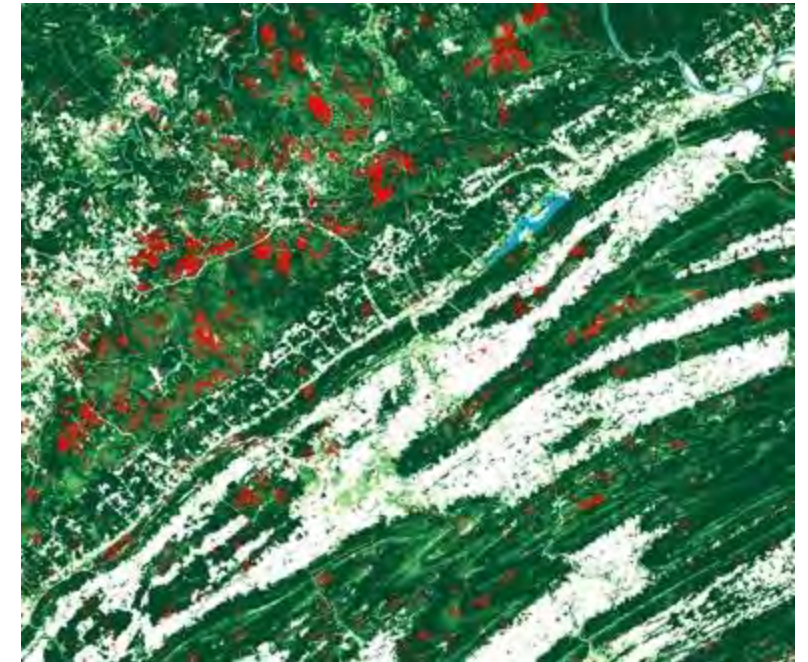
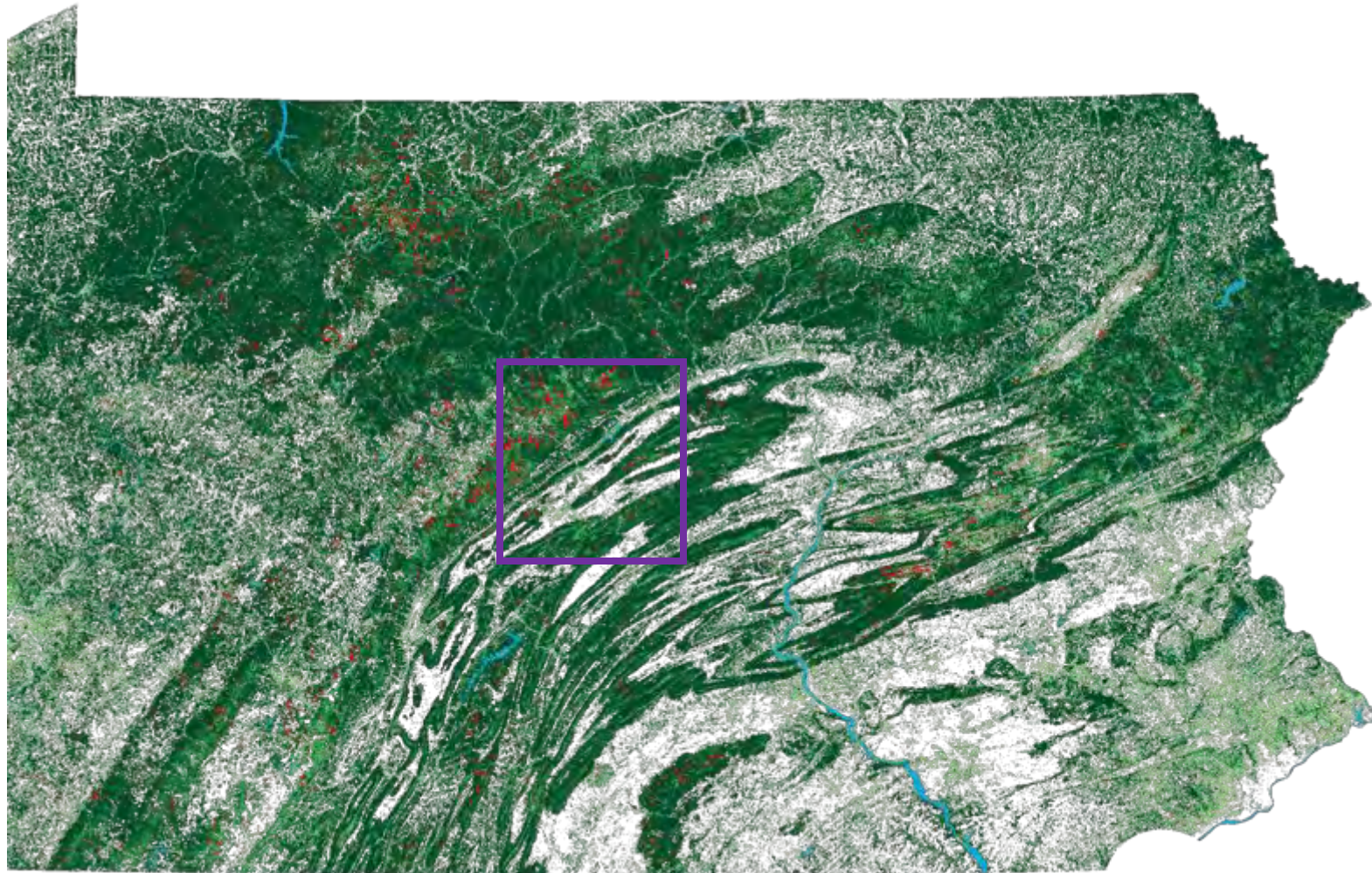
- Motivations and backgrounds
- Decision-making challenges
- Methods
- Current progress
  - Seeding & planting projects
  - Assisted migrations
  - Mitigate climate extremes
- Summary

# Motivations: Global forest dieback under climate change





# Motivations: Regional forest loss in Pennsylvania in 2024



Invasive species & Frost

Data from: Hansen et al., and  
PA DCNR Division of Forest health



## Motivations: PA DCNR Bureau of Forestry



### Seeding/planting:

Meredith Seltzer

## Conservation genetics:

Amanda Penn

### Deer-forest specialist:

# Jim Julian

Emily Domoto

## Foresters:

Brandon Brantner

Chris Firestone

# Benjamin Gamble

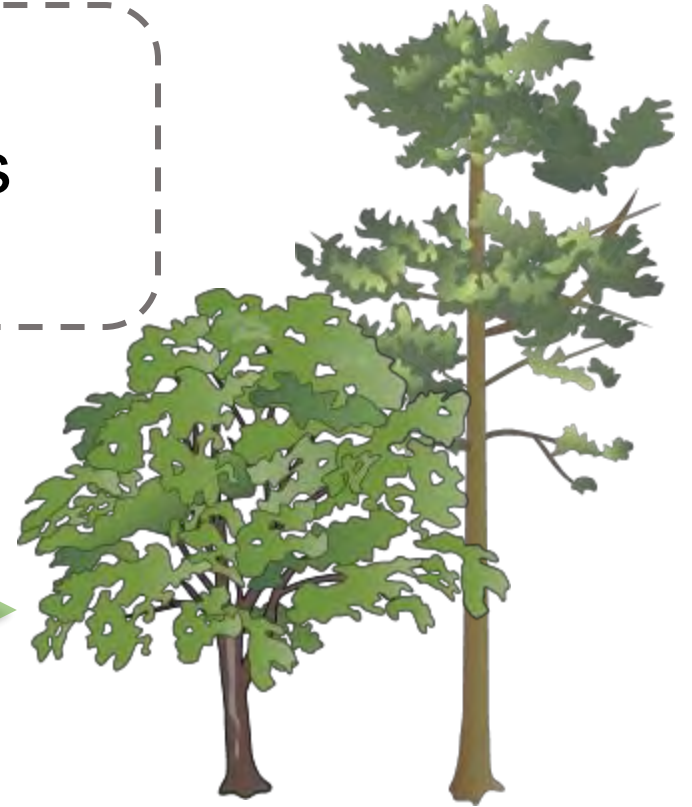
### Managers:

Shawn Lehman

Christian Nicholas

# Decision-making challenges: how to quantify regeneration?

The **patterns** and environmental **drivers** of seed supply and recruits are missing in current tools.

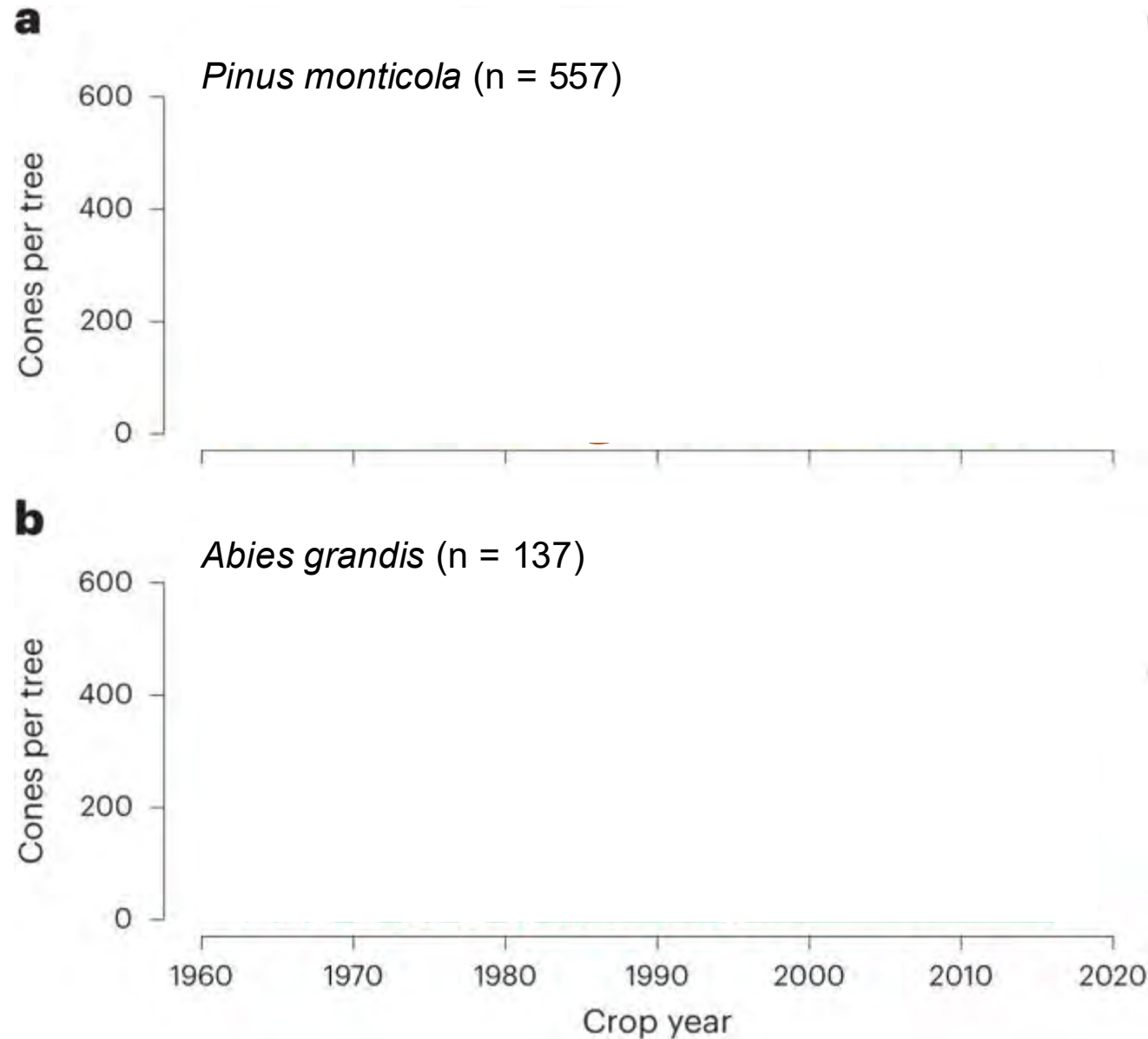


Seed Production

Seedlings

Adult Trees

# Decision-making challenges: fecundity data

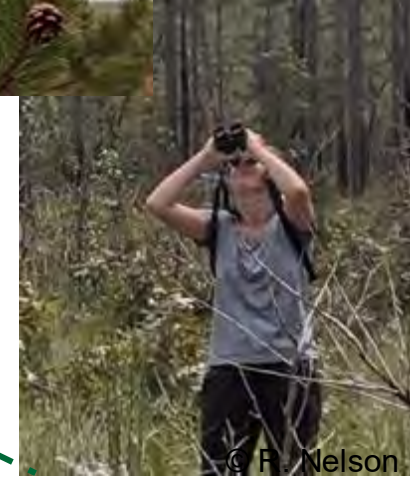
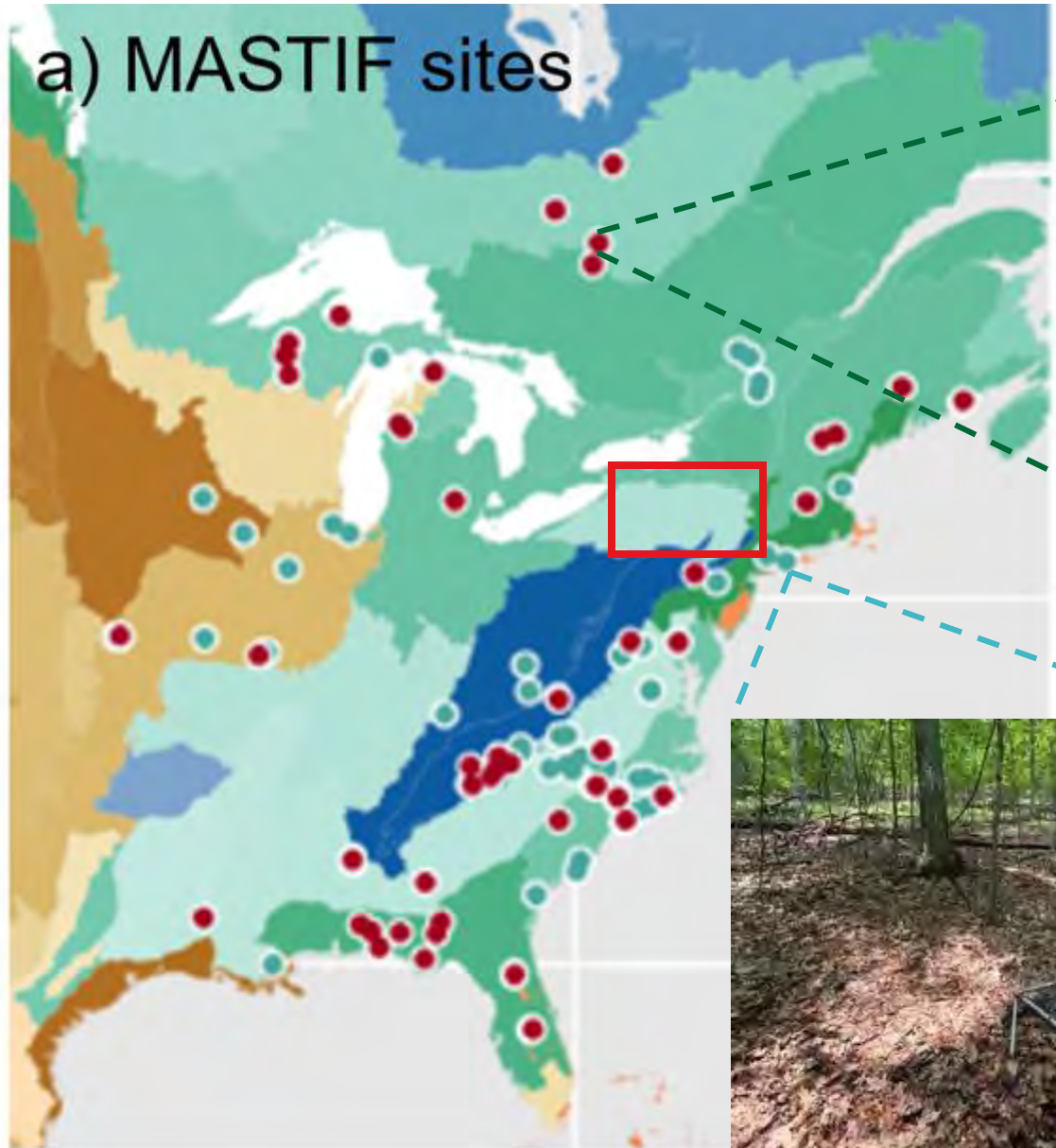


## Order-of-magnitude variations

- between individuals
- between years
- between species



# Decision-making challenges: sampling gaps



Crop count

**Masting  
inference and  
forecast  
(MASTIF)**  
1M+ trees,  
5M+ tree  
years  
100+ species



Seed traps

Clark et al., *Ecol. Monogr.* 2019  
Clark et al., *Nature Comm.*, 2020  
Qiu et al., *PNAS*, 2021  
Qiu et al., *Nature Comm.*, 2022  
Qiu et al., *Nature Plants.*, 2023



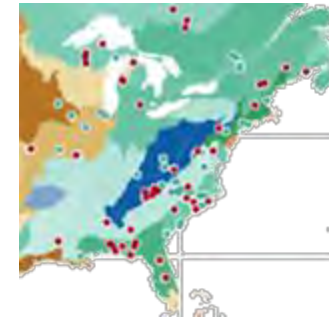
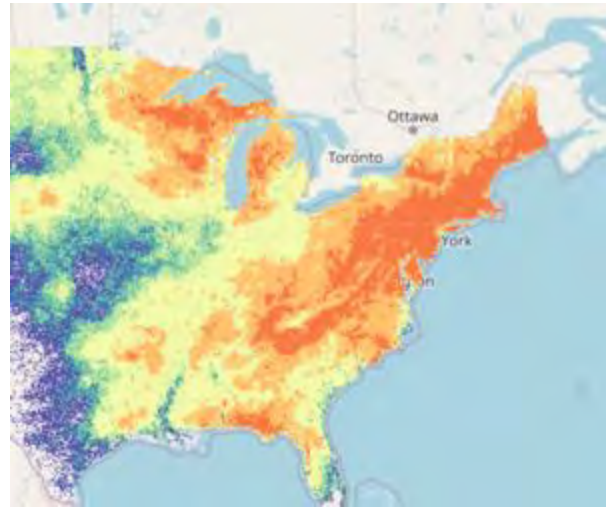
# Project overview and objectives: 2024 to 2028



- **Translate satellite and airborne remotely sensed products into fecundity, recruitment, and vertebrate abundance at biogeographic scales.**
- **Develop predictive models of recruitment changes as a function of seed supply and environment-vertebrate interactions.**

# Project overview and objectives: 2024 to 2028

- Evaluate how different management practices and climate change scenarios affect the migration capacity for each species across the eastern U.S.



**Sampling on seeds/seedlings**

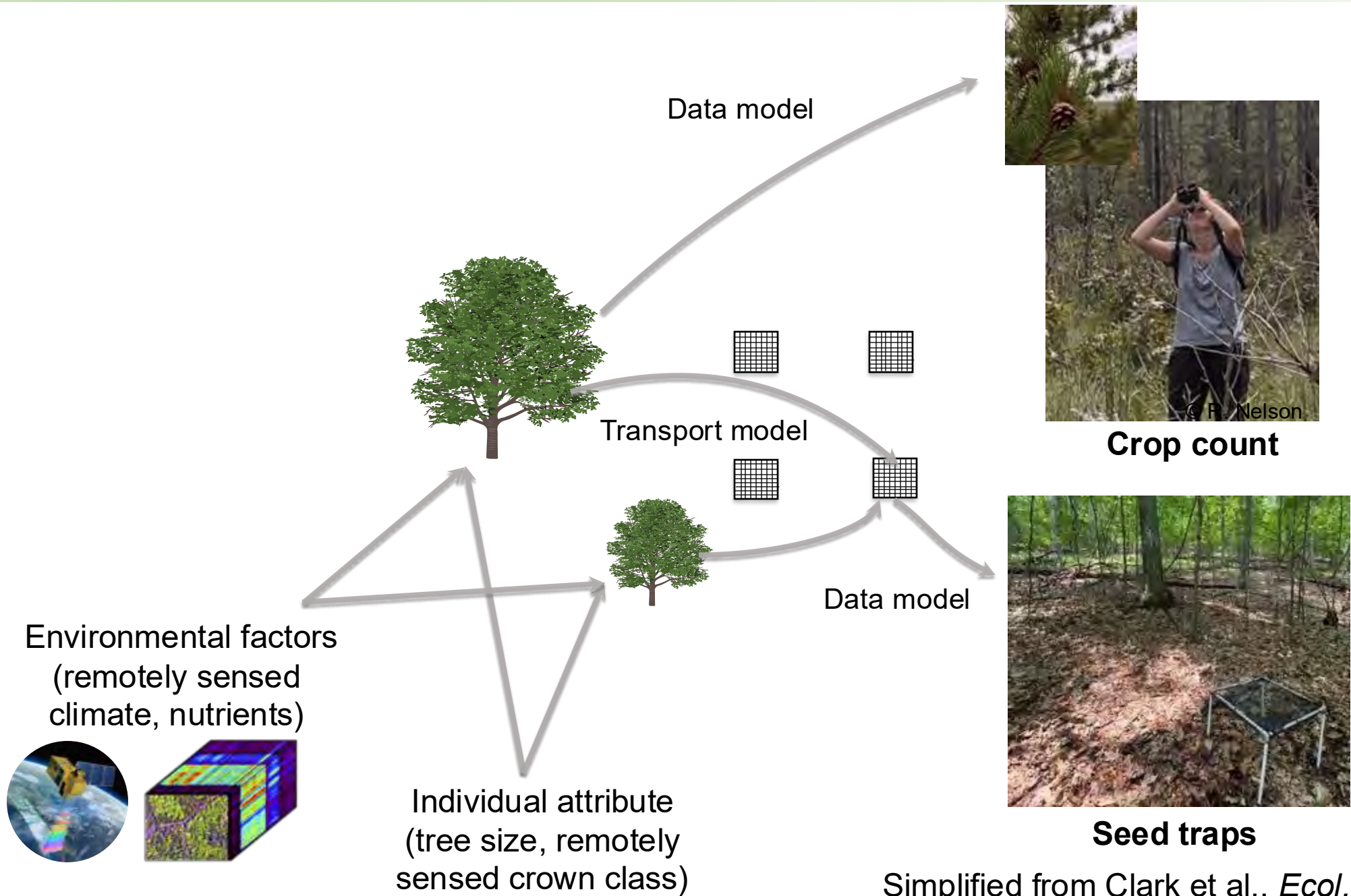
- Develop an interactive R Shiny web-based tool that will guide sustainable forest practices and protected area management.



- Seeding/Planting
- Assisted migration
- Mitigate climate extreme
- Landscape-level management
- etc.



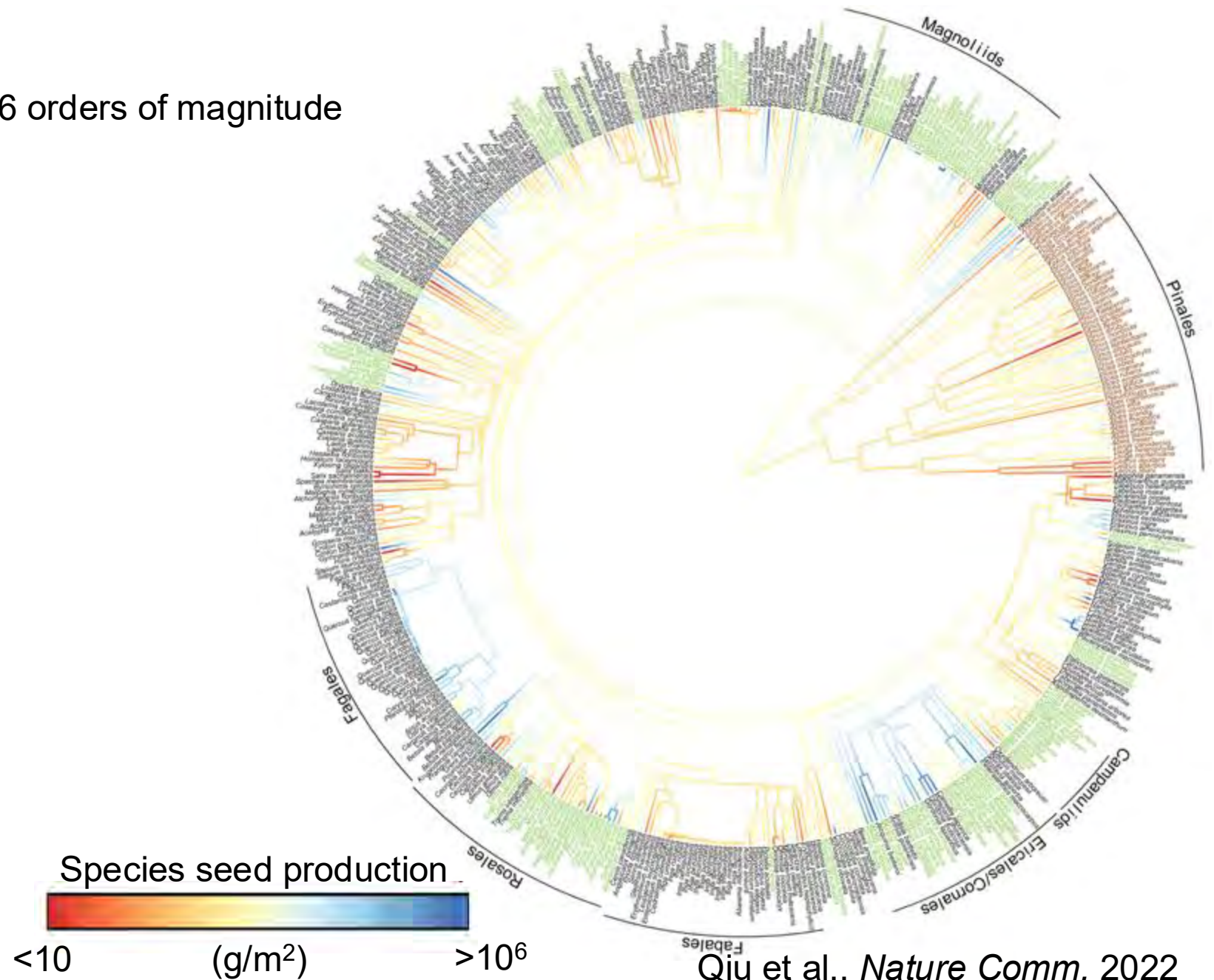
# Methods: Synthesis of ecological big data and remote sensing



Simplified from Clark et al., *Ecol. Monogr.* 2019

# Seeding project: variations across species

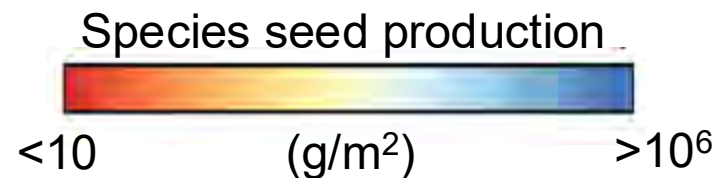
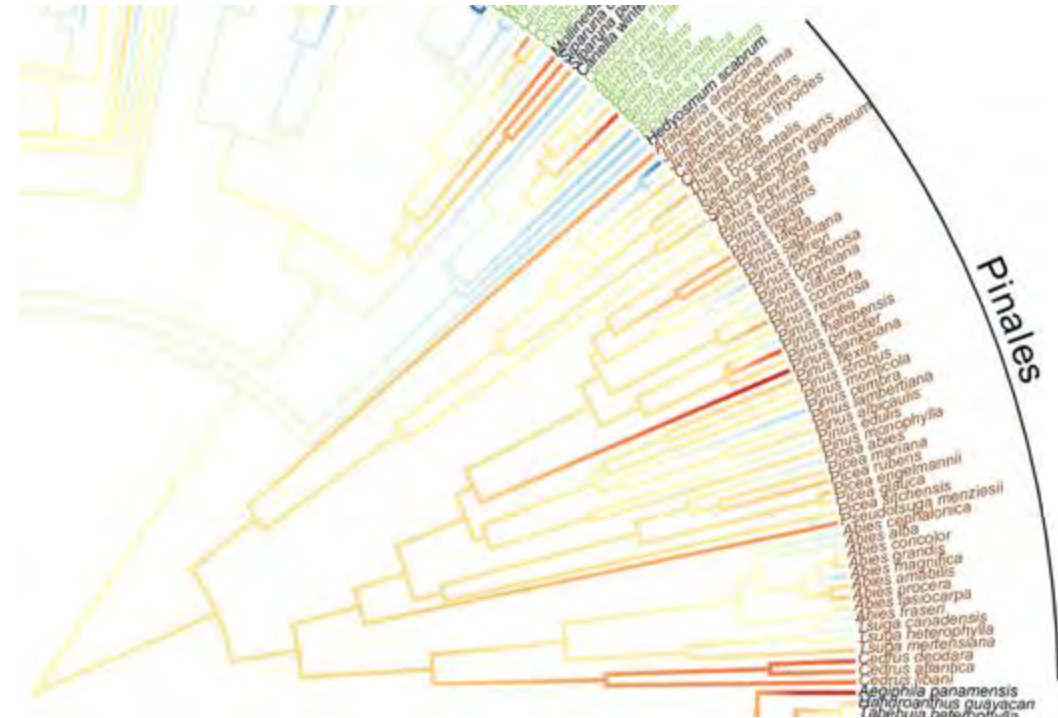
- Species seed production varies ~6 orders of magnitude





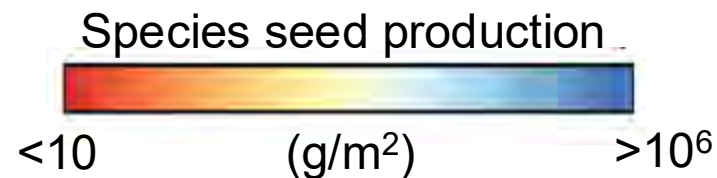
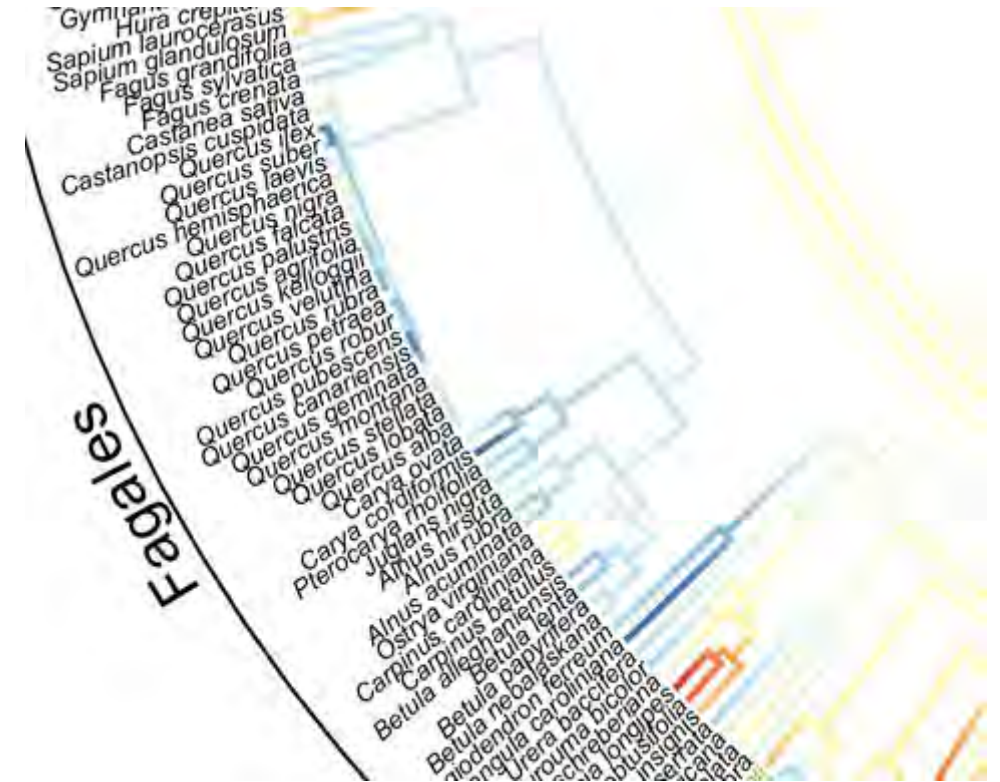
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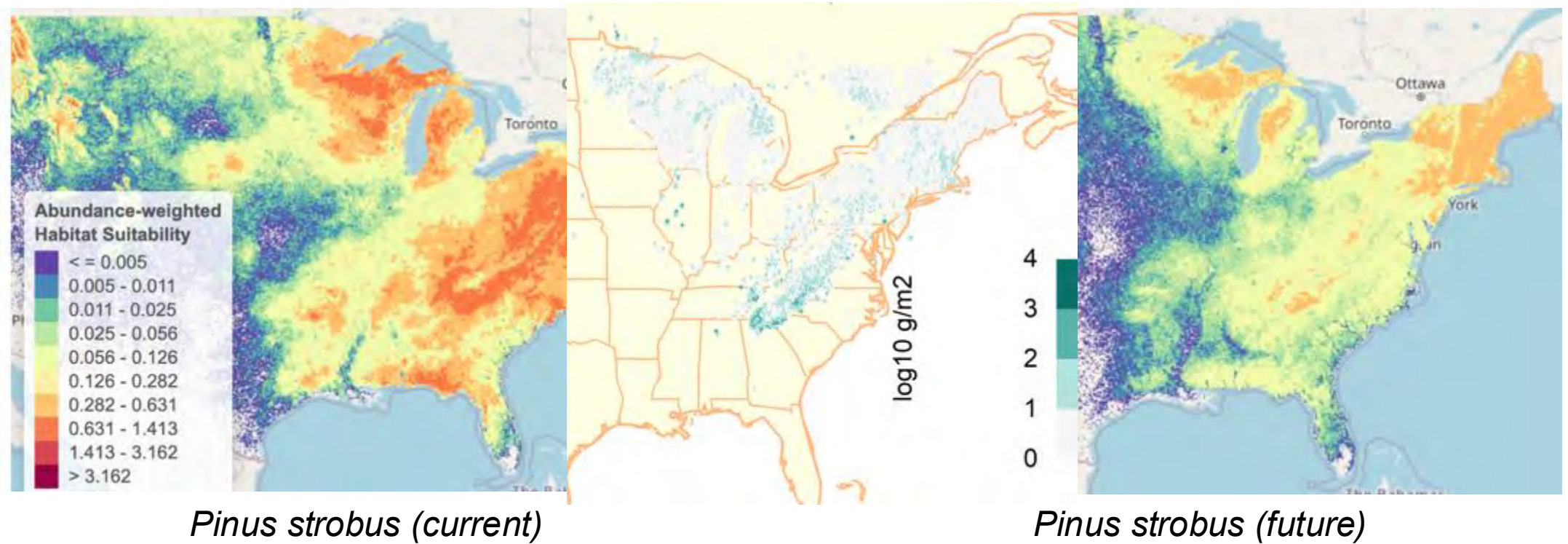
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## Prioritize active seeding or planting for conifer-dominated stands

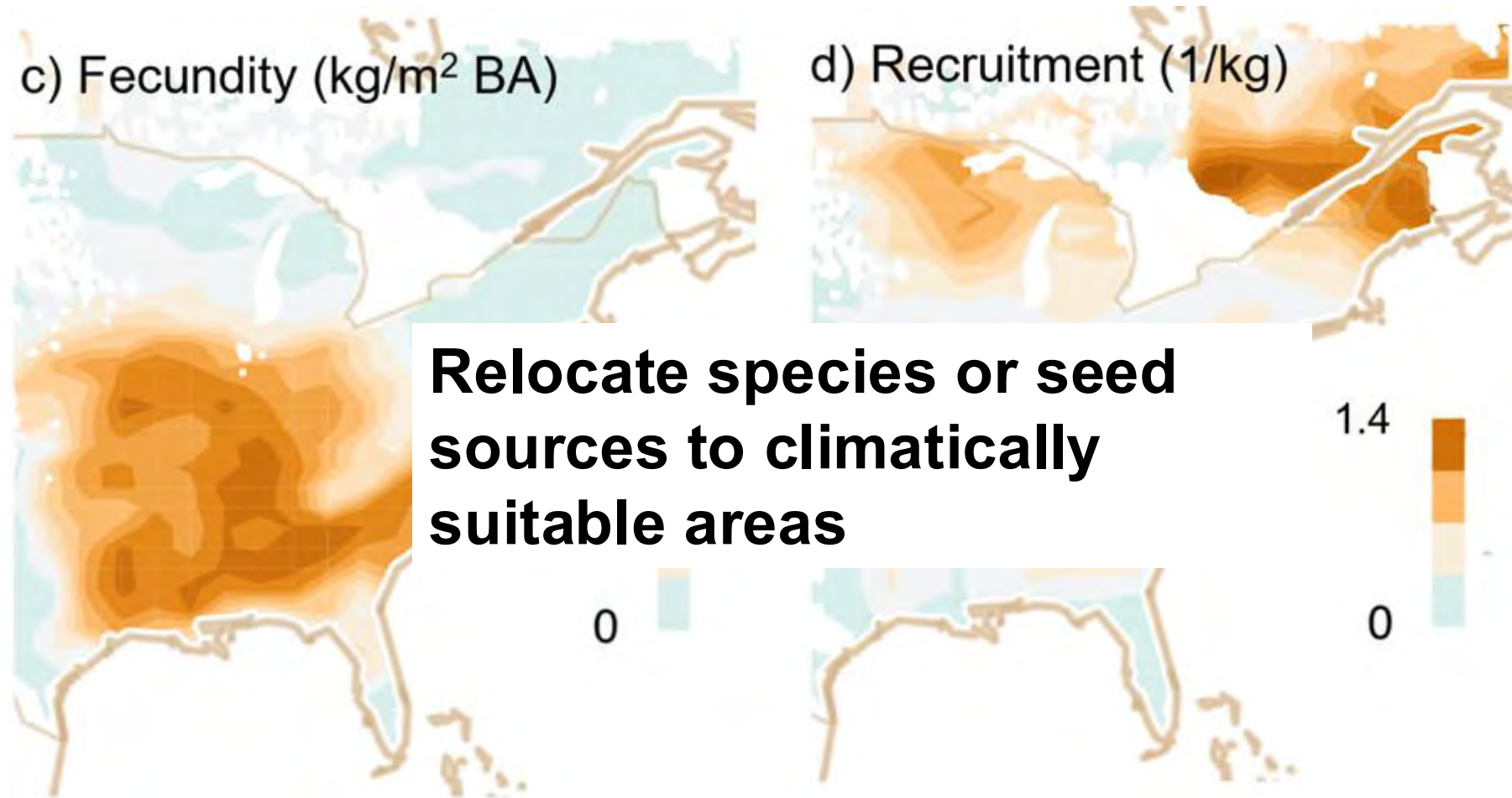


# Assisted migration: fill the data gaps of fecundity data



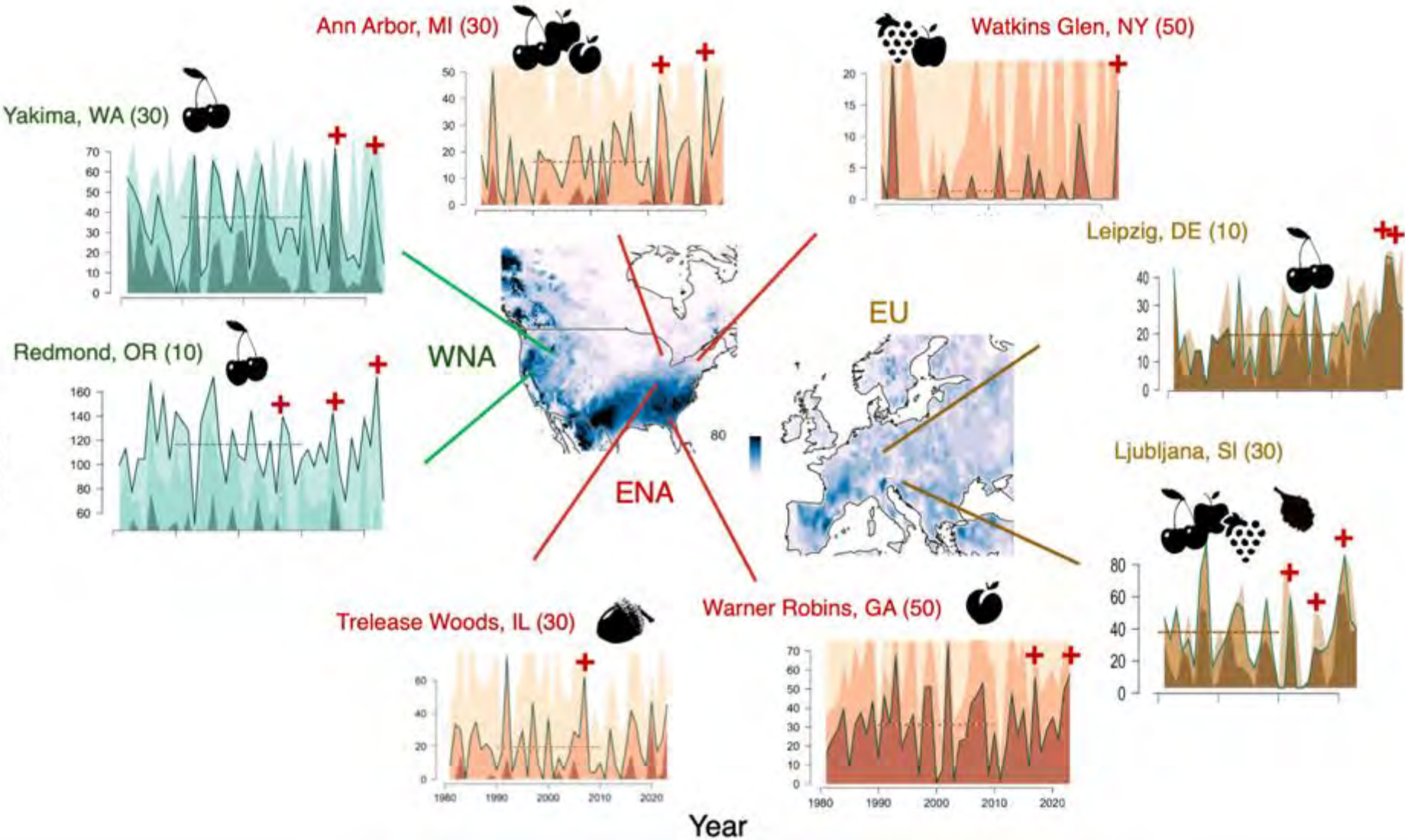


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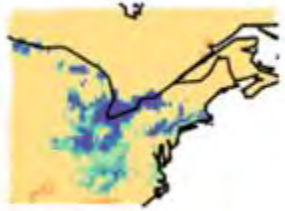
# Mitigate and predict extremes: frost and drought events

Late frost  
degree days





Late frost degree days



2012

2016

2017

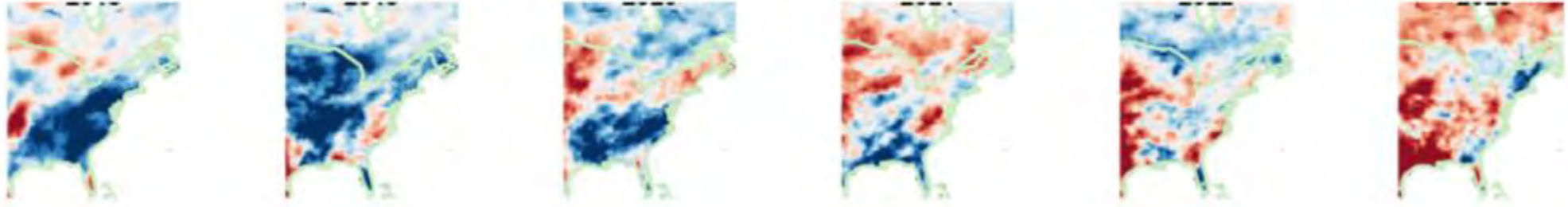
2020

2023

**Anticipate and prioritize  
which areas are at greatest  
risk of reproductive failure**

# Mitigate and predict extremes: frost and drought events

**Moisture Deficit**



**Red Maple**



2018

2019

2020

2021

2022

2023

## Summary of adaptive management

- Seeding and planting project: which species are most productive? Winner or loser species?
- Failure to migrate? incorporate the fecundity data to inform assisted migration
- Understanding the extremes: tracking fecundity over years