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# Soil effects on plant distributions and potential migration in Eastern North America

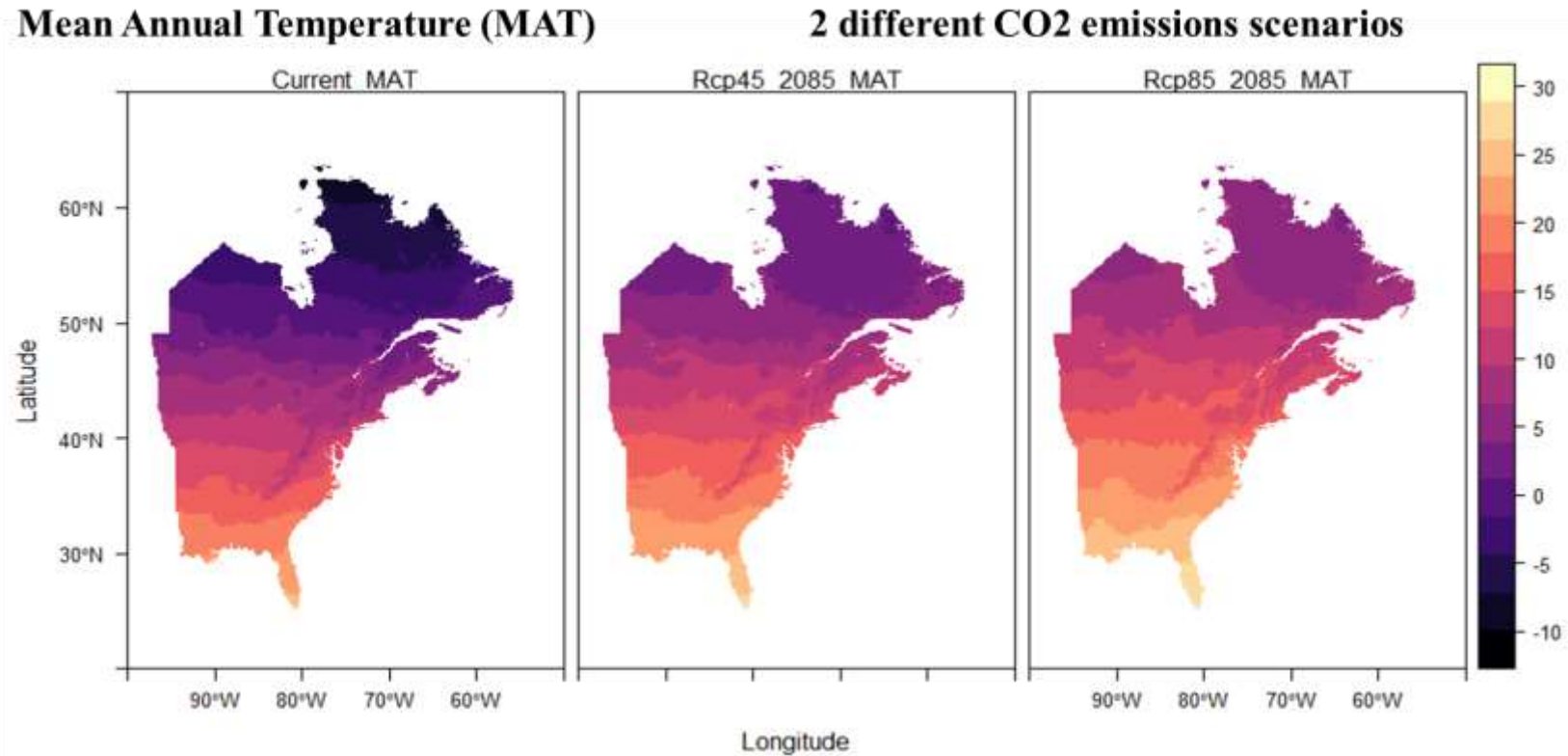
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- Ming Ni
- Mark Vellend



# Background - climate warming

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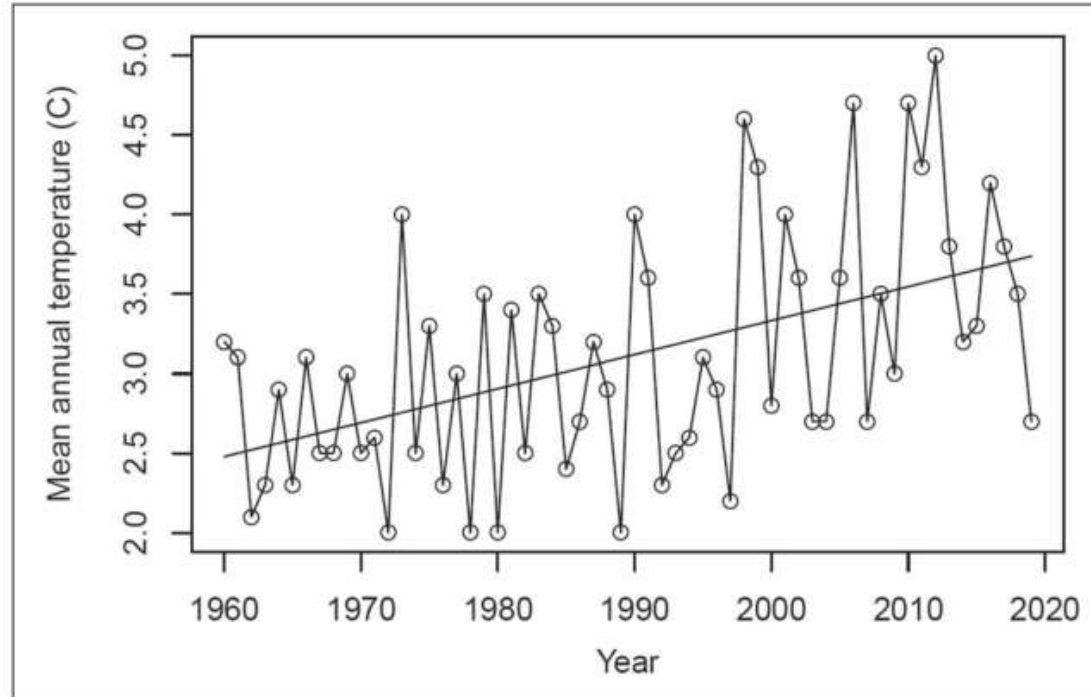


Data from *AdaptWest Project* (2015)

In Eastern North America, temperature is projected to increase between **4 and 8 °C** by the end of 21<sup>st</sup> century.

# Background - climate warming

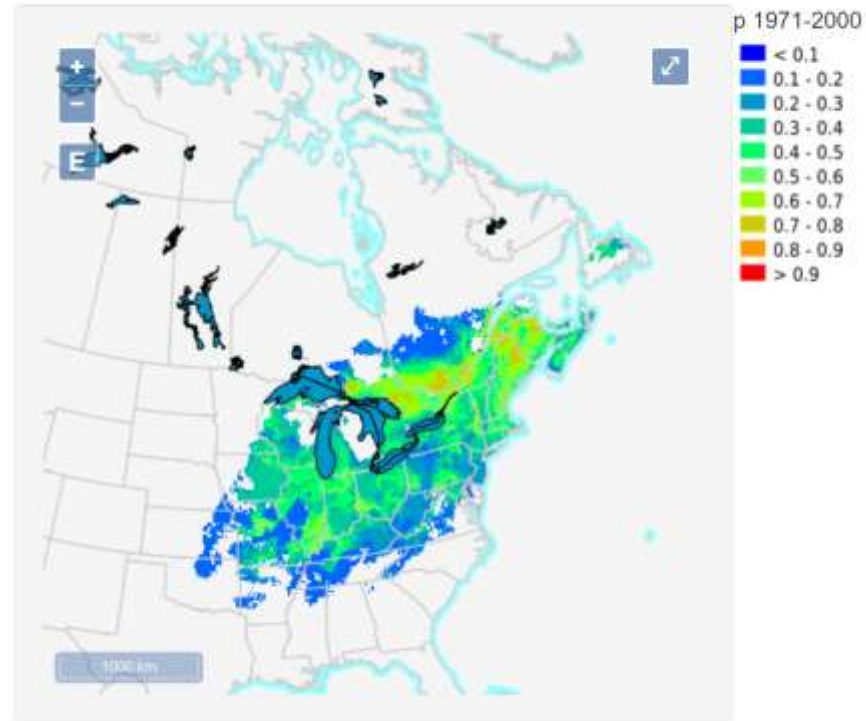
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Change in mean annual temperature in  
**Parc national du Mont Mégantic, Québec**

# Projecting distributions

Current suitable habitat  
*Erythronium americanum*



Future suitable habitat under climate change  
*Erythronium americanum*



Use **Species Distribution Models (SDMs)** to project current and future suitable habitats: **Climate-only Models** are mostly used!

# Projecting distributions

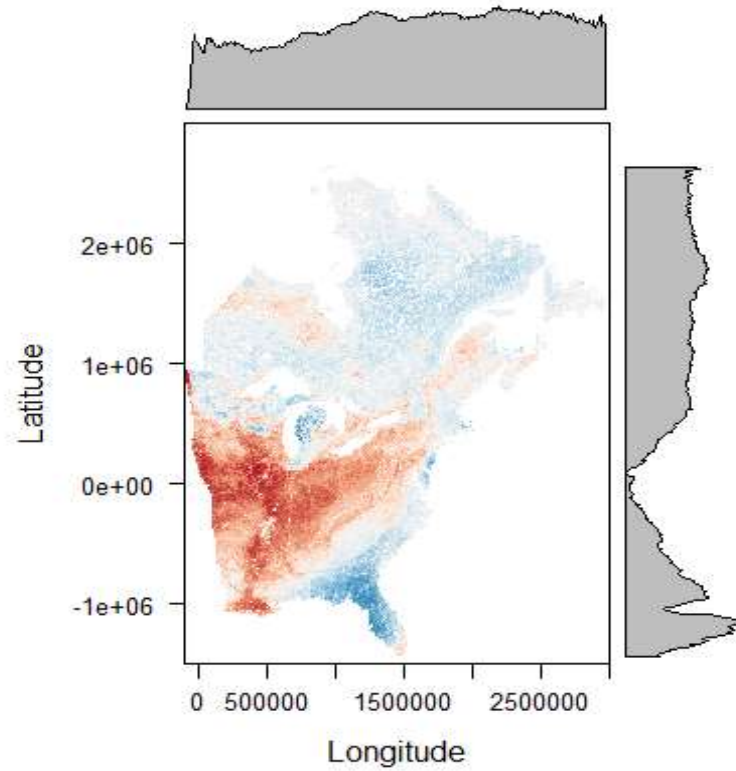
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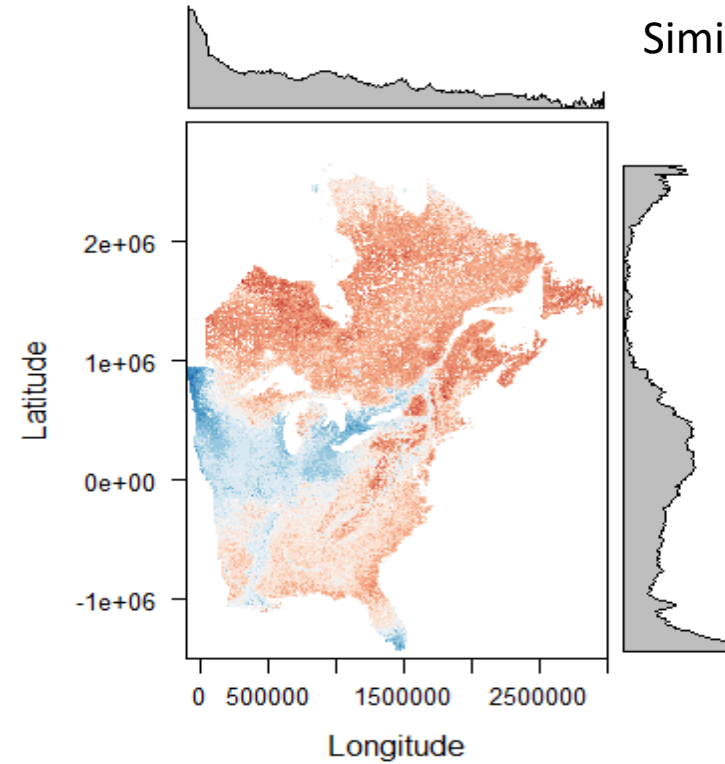
But can Trout Lily inhabit in Conifer forest and Tundra?



# Latitudinal changes in soil properties



Saturated water content (%)



Soil pH



Similar pattern in Mountain

# Questions

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1. How do soil properties influence plant current distributions at climate gradients (latitudes/elevation) ?
2. How do soil properties influence the future ranges of plant suitable habitats under climate change?

# Latitudinal gradient – Species distribution models

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## Species data:

- **1870 species** from Botanical Information and Ecology Network (BIEN)
- Growth form
- Habitat type



## Environmental data (250m×250m):

### Climate (interpolated from ClimateNA):

- Mean annual temperature
- Mean annual relative humidity
- Summer heat moisture index

### Soil (from Soilgrid):

- Soil pH
- Coarse fragment content
- Absolute soil depth
- Soil depth to R horizon
- Cumulative Histosol content
- Saturated water content
- Sodic grade
- Soil order





# Latitudinal gradient – Species distribution models

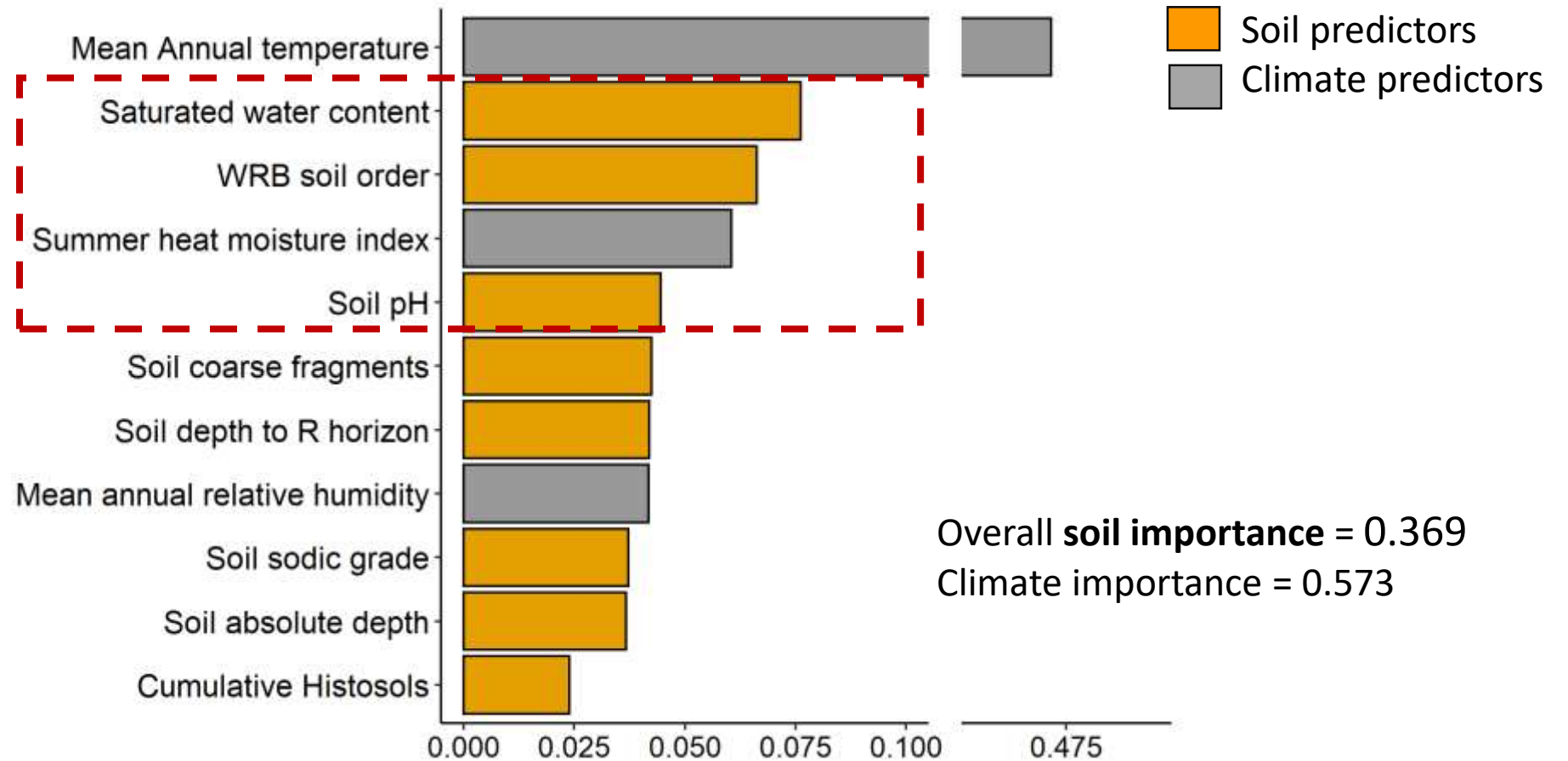
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**1. Climate-only model:  $\text{SDM}_{\text{climate}}$**  Probability (presence)  $\sim$  Three Climate Variables

**2. Climate+soil model:  $\text{SDM}_{\text{sc}}$**  Probability (presence)  $\sim$  Three Climate Variables + Eight soil variables

**Projection: Current climate; Future climate (end of 21th century) – RCP 4.5, 8.5**

# Results and discussion – soil effects

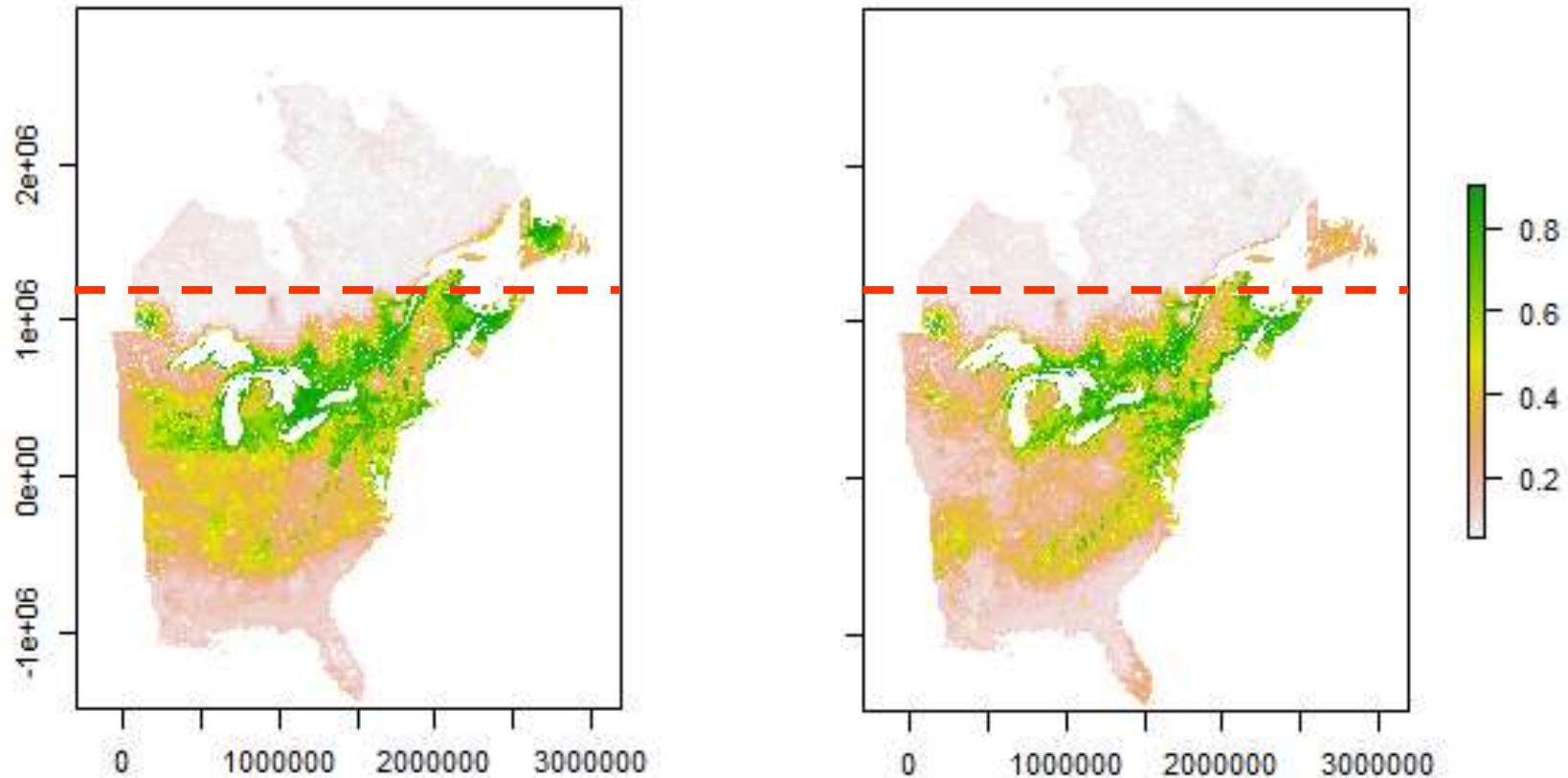


**Variable relative importance in Climate + Soil model**

# Model projection - *Erythronium americanum*



## Current climate



Climate-only model

Climate + Soil model

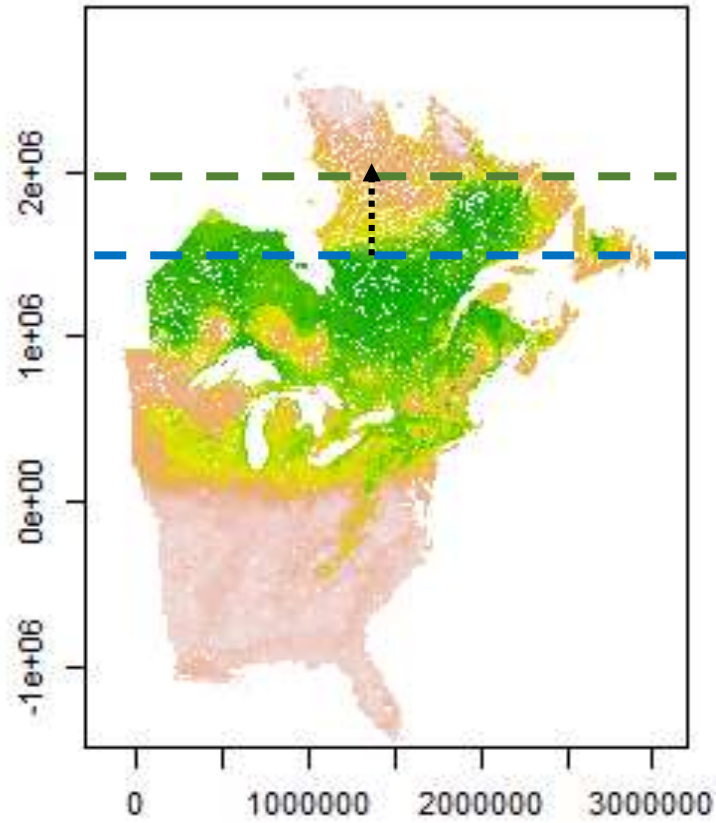


Projected northern range limit

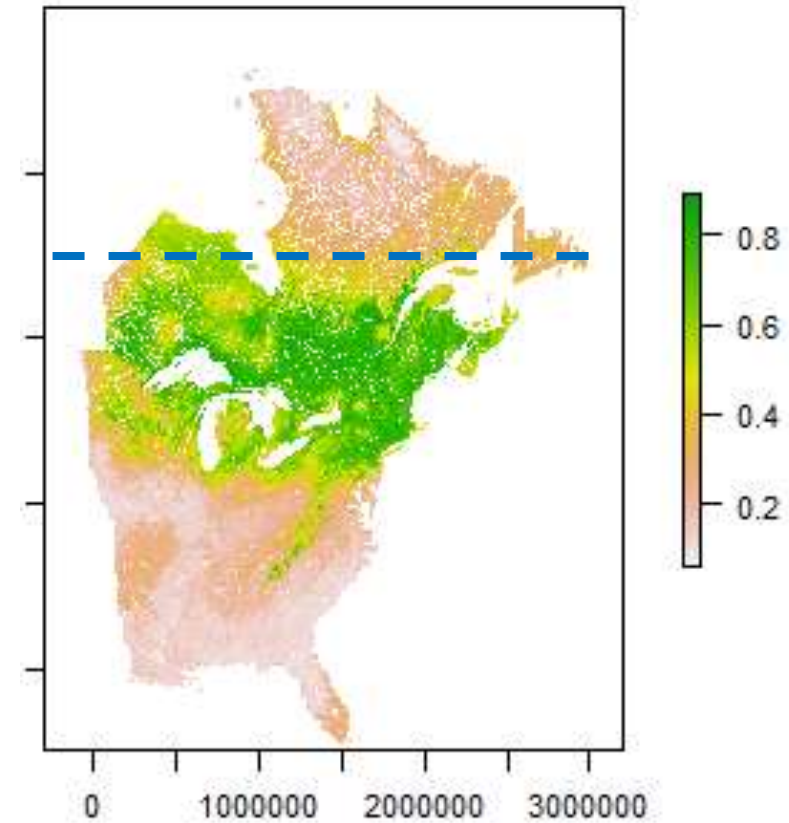
# Model projection - *Erythronium americanum*



## Future climate RCP 8.5



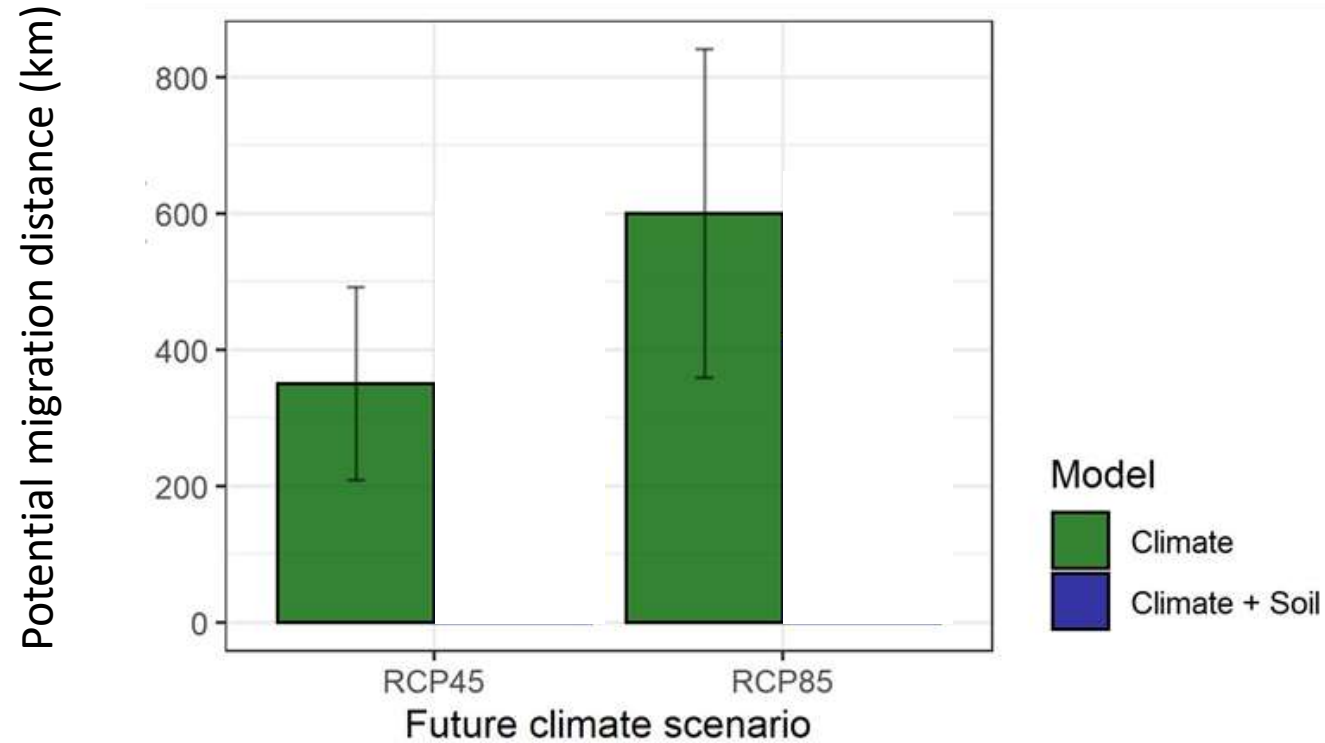
Climate-only model



Climate + Soil model

# Potential migration in northern range limit

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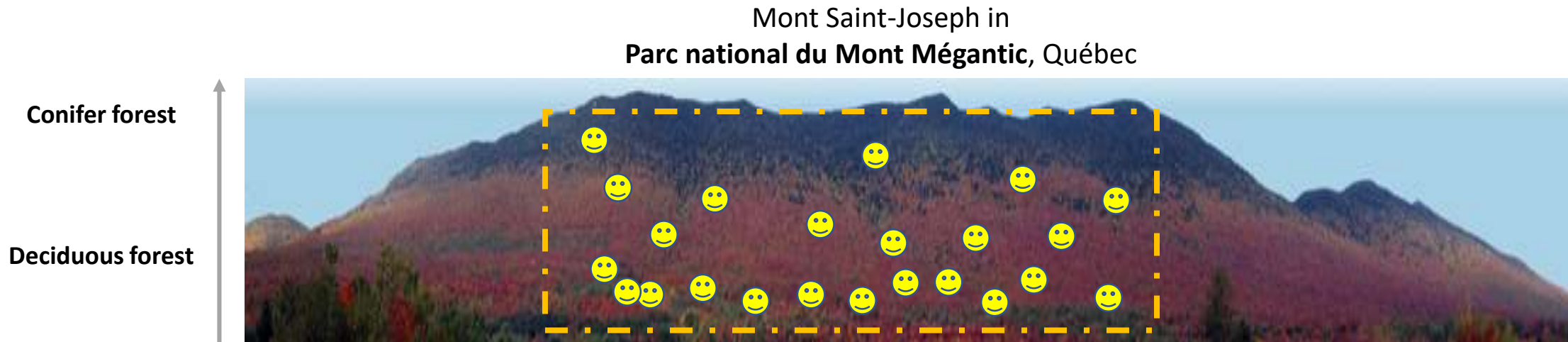
Potential migration distance:  
**future northern range limit – current northern range limit**

# Elevational gradient - background

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Some drawbacks in the **latitudinal study**:

- Coarse resolution of soil data (resolution: 250m\*250m);
- Species data: Only-presence, no absence or abundance information;



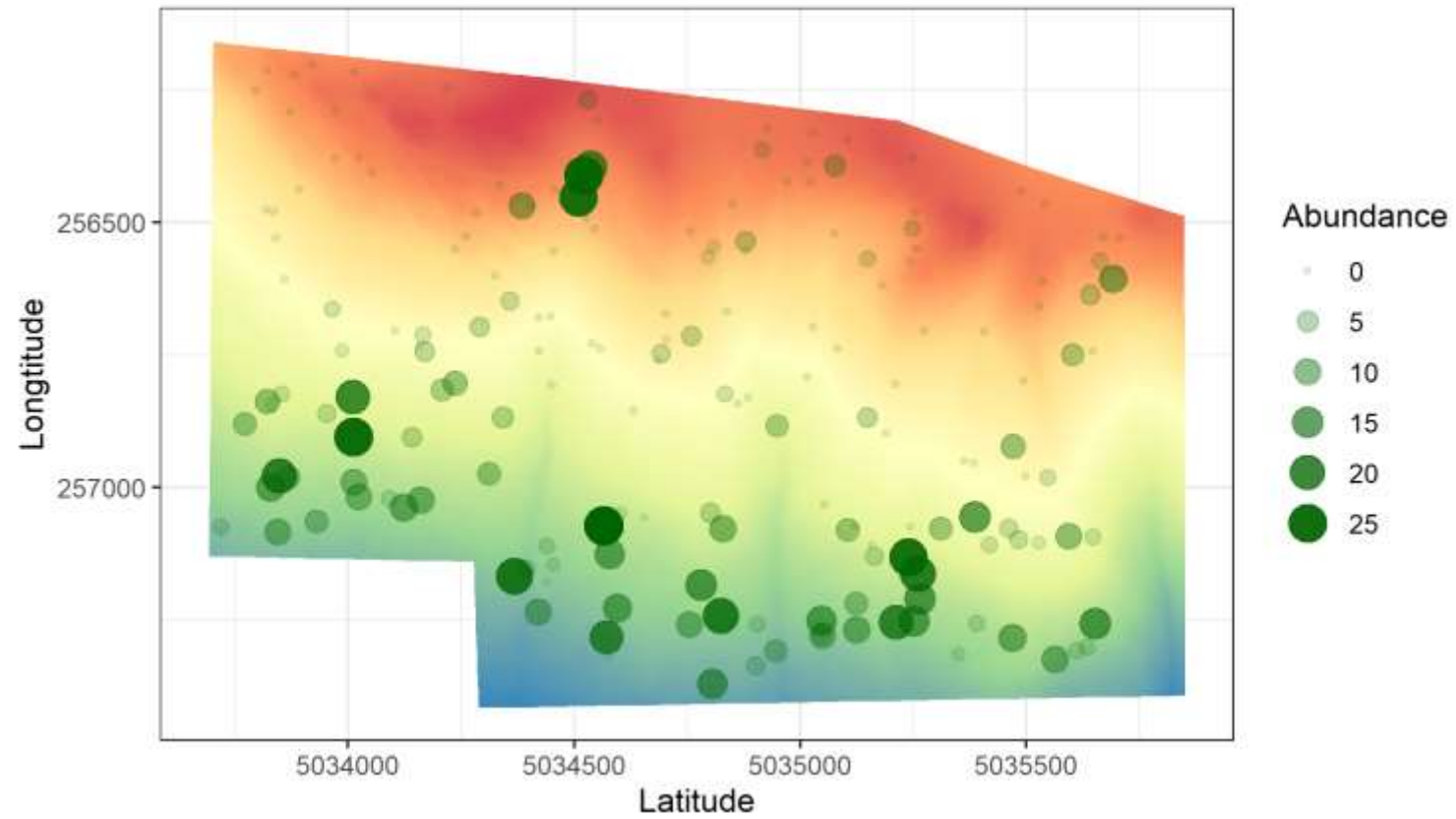
Elevational gradient: **an intensive sampling** (about 180 plots) of four early spring understory herbs, and **soil properties – pH, nutrient, depth, moisture** etc.



# Elevational distributions of spring ephemerals

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*Trillium erectum*



# Hurdle Model

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$$\left\{ \begin{array}{ll} Y_i \sim \mathbf{Binomial}(1, p_i) & Y_i = 0/1 \\ Y_i \sim \mathbf{TruncatedNB}(\mu_i, k) & Y_i > 0 \end{array} \right. \quad \begin{array}{l} \mathbf{Occurrence} \\ \mathbf{Abundance} \end{array}$$

$$\text{logit}(p_i) = \mathbf{X}_i \boldsymbol{\beta}$$

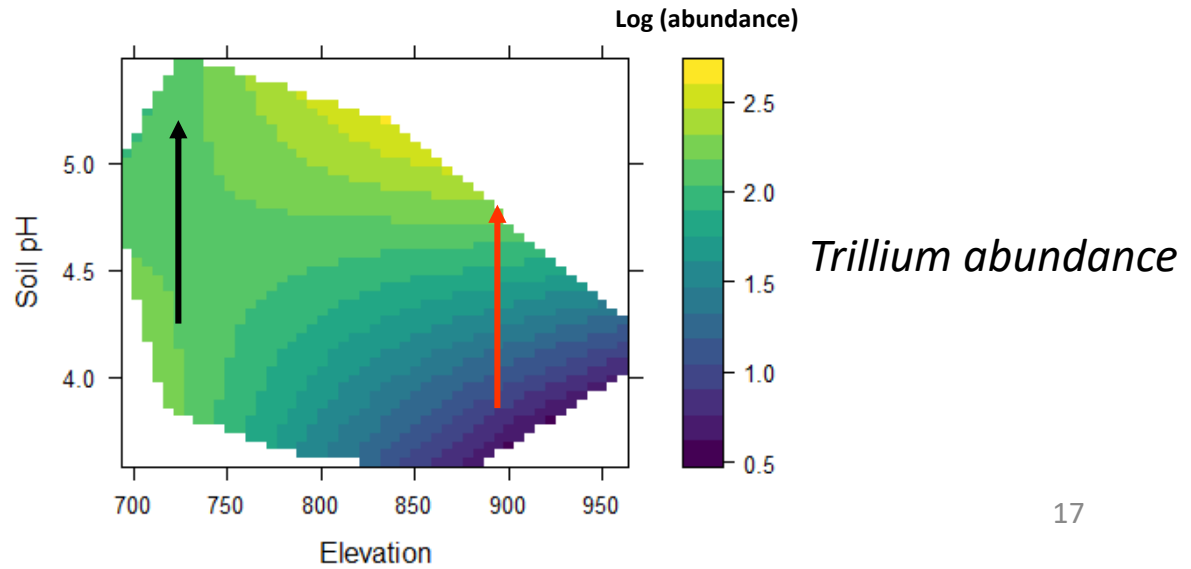
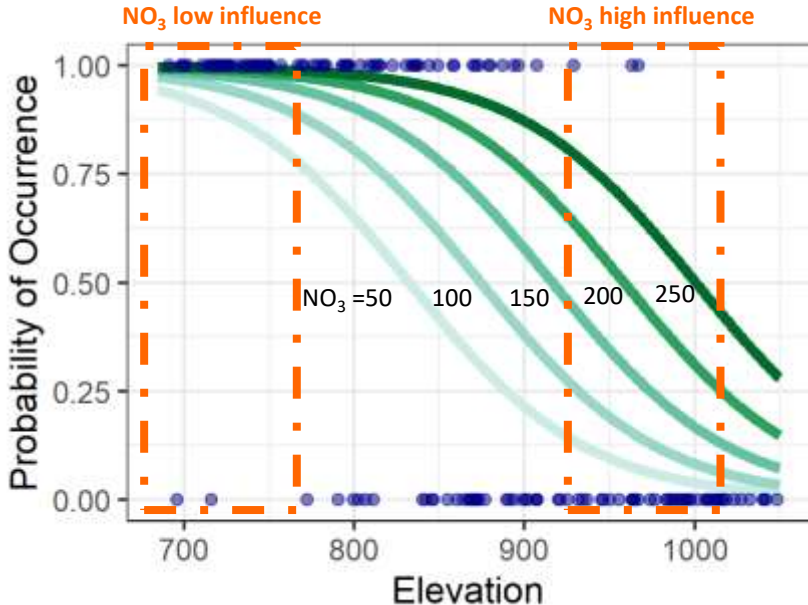
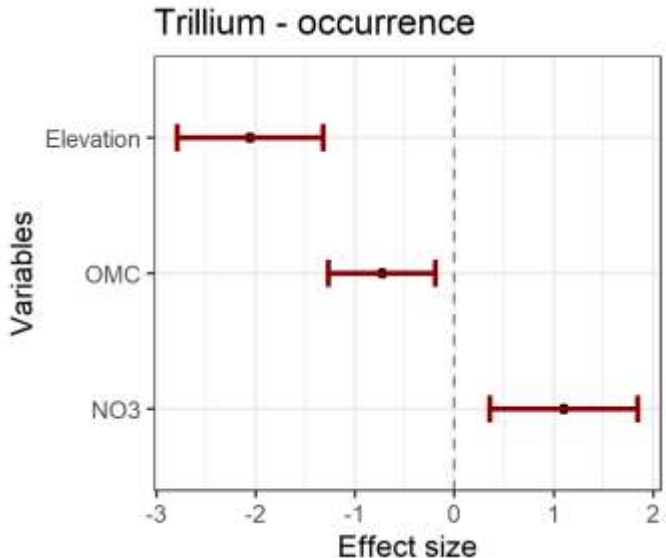
$$\log(\mu_i) = \mathbf{X}_i \boldsymbol{\beta}$$

$\mathbf{X}_i$  : **ele** + **ele** × **soil** + **soil** + light + slope



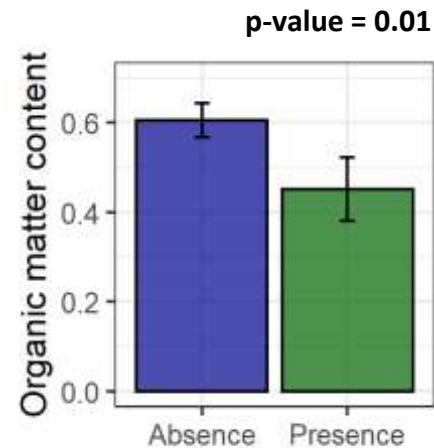
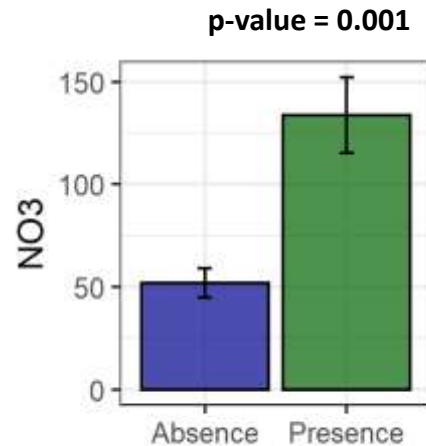
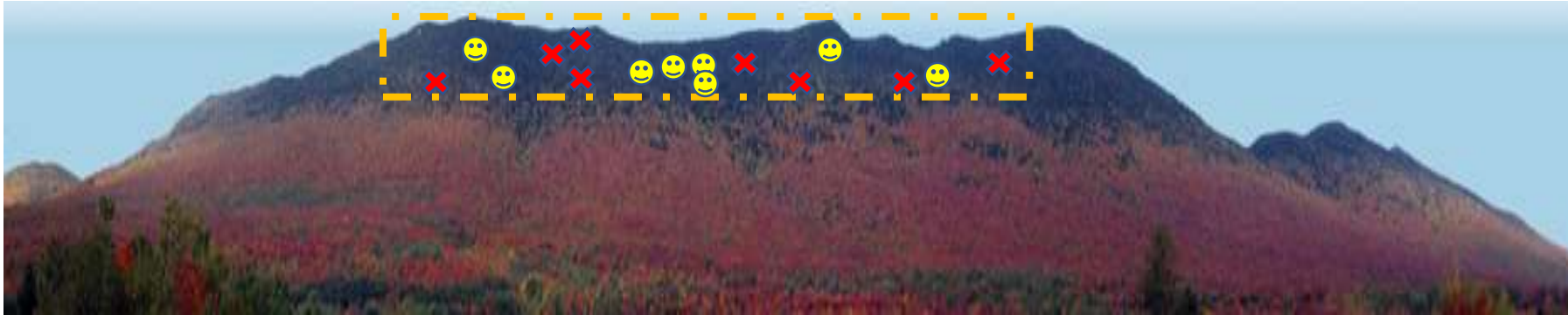
Model selection based on AIC

# Results – *Trillium erectum*



# Results – *Trillium erectum* non-random sampling

*Trillium* can occur in high elevations – what kind of habitats?



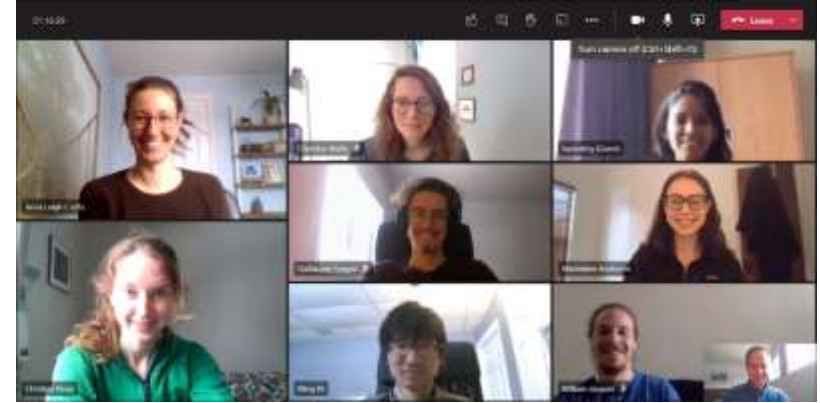
*Agree with the occurrence model!*

## Summary and thanks!

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Soil properties explain substantial variation in species current distributions along climatic gradients; **Soil could have major impact on species range limits;**

Higher-latitude/elevation soils can be unsuitable for many species potentially migrating from lower latitudes/elevation



We thank Amael Le Squin, Huizhong Lu for the help in computation; thank Brain Maitner, Brain Enquist and other members in BIEN working group for the help in obtaining species occurrences data; Tongli Wang for the help of using ClimateNA program; Guillaume Blanchet, Dominique Gravel, Steven Kembel and all members in Vellend Lab for comments and suggestions on this work. Thanks assistance of many people in the fieldwork and soil experiment.



# Results – Model performance

