# Overview of my master thesis



Lab meeting at Duke University

Alice Ledent, second year of the master's degree in biology, University of Liège (ULG)

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#### Title

 Unravelling the Quaternary biogeography history of European bryophytes through Approximate Bayesian Statistics

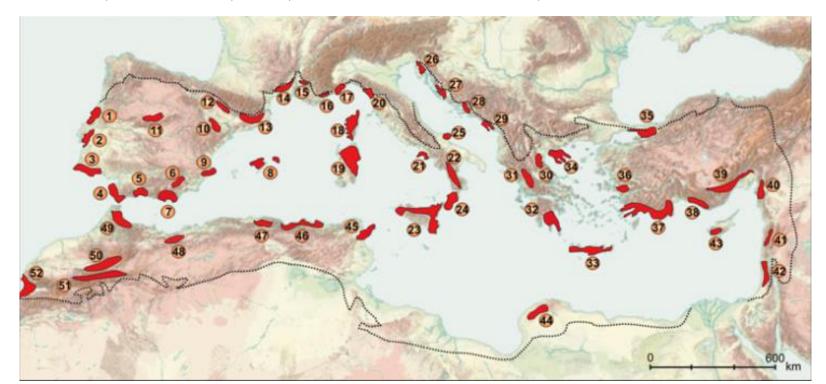
- □ What's the impact of global warming on species repartition?
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  - □ Last Glacial Maximum (LGM, 21.000 YBP) = the more virulent
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- Europe : stronger consequences than in North America or in the Southern hemisphere
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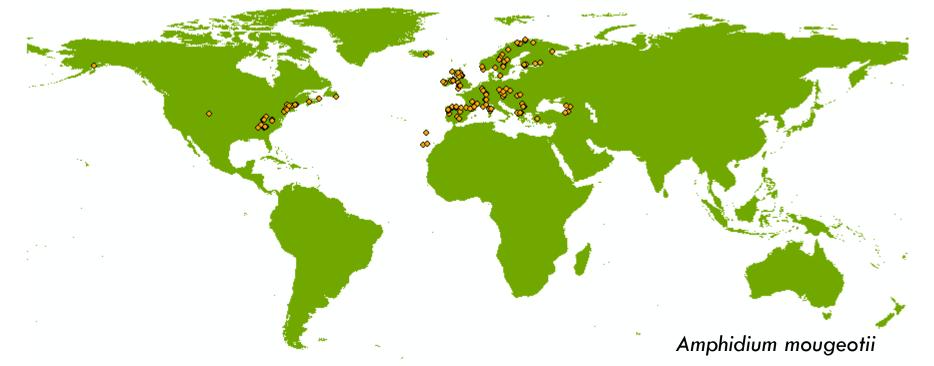
- □ Where to survive in Europe?
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    - $\blacksquare$   $\rightarrow$  first meta-study in the domain (18 species)
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- Especially,
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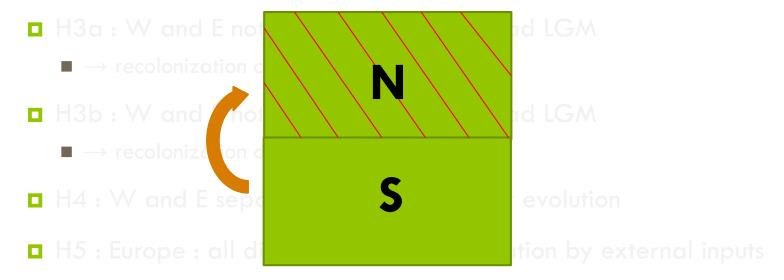
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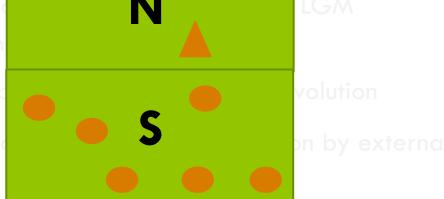
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- H1: N and S not separated but N dead during the LGM
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- H2 : N and S separated → independent evolution
- H3a: W and E not separated but W dead LGM
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- H3b : W and E not separated but W dead LGM
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- $\blacksquare$  H5: Europe: all disappear  $\rightarrow$  recolonization by external inputs
- + for each scenario, test of the external inputs

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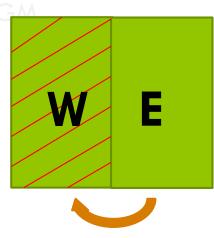
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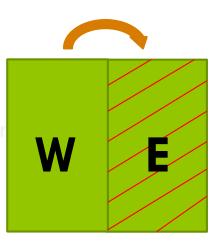
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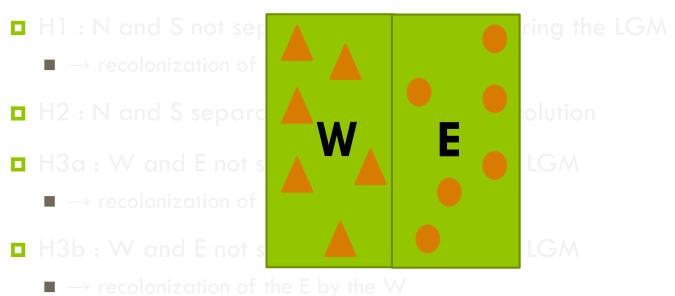
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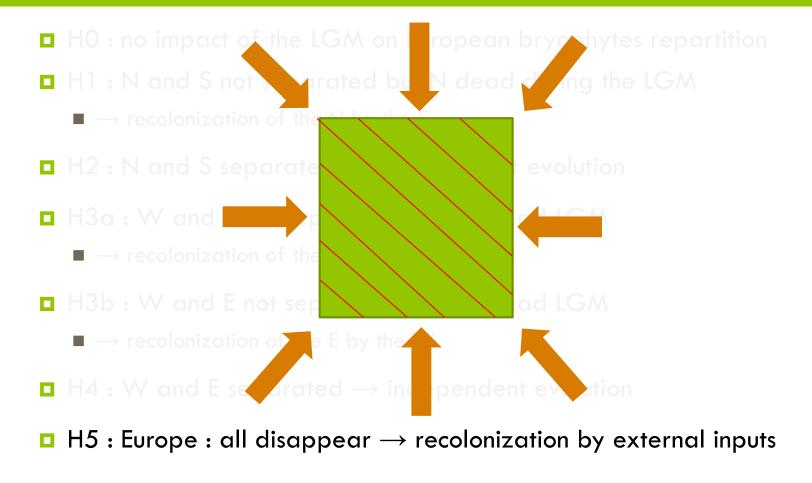
## Hypothèses biogéographiques

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#### Methods

- Biogeographical studies = descriptive statistics
  - To describe a biogeographical scenario on the basis of observed genetic data
    - not necessarily a link between genetic data and biogeographical scenario
    - confrontation of scenarios is not possible
    - for examples: (Bhagwat & Willis 2008), (Désamoré 2013), (Hewitt 1999), (Petit et al. 2003) et (Petit et al. 2005).
- Méthode utilisée pour le mémoire : ABC
  - Modéliser des scénarios biogéographiques → simuler des jeux de données correspondant
    - comparaison avec les données observées
    - lien direct entre le scénario biogéographique et les données génétiques
    - Confrontation de scénarios possibles
    - Pour ( review » : (Csilléry et al. 2010)

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- □ Method used in this study : ABC
  - $lue{}$  To model biogeographical scenarios o to create trees o to simulate correspondent genetic data
    - $\blacksquare$   $\rightarrow$  comparison with observed genetic data
    - direct link between the biogeographical scenario and the genetic data
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- □ 1) Create tree topology
  - For each scenario and each species, determine prior distribution of demographic parameters
    - absolute nucleotide substitution rates
    - migration rates between populations
    - effective population size (given by SDMs)
  - □ 10<sup>6</sup> random draws of all the parameters => 10<sup>6</sup> trees for each scenario and each species
- 2) Create sequence matrices
  - Define the likelihood => sequence mapping on the trees
  - $\blacksquare$  1 matrix for each trees => 10<sup>6</sup> matrices per scenario et species

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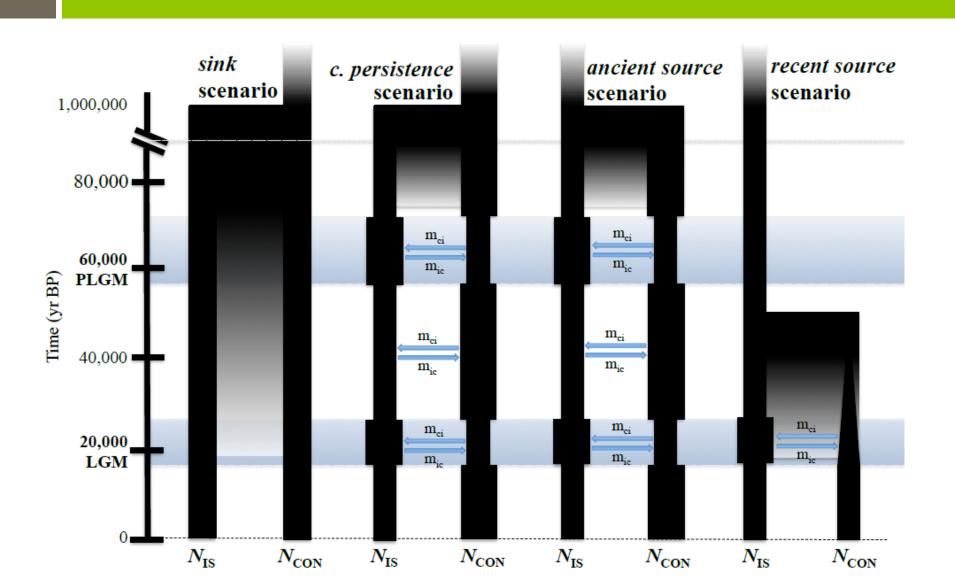
- 3) Compare with observed sequence matrix
  - Choose descriptive statistics to resume matrices
  - Compute Euclidian distance to
    - resume all the statistics of a matrix
    - determine distance between each simulated matrix and the observed one
- □ 4) choose the best scenario
  - Sort the distances by ascending order
  - Take the 1000 first distances
  - Obtain the posterior distribution of demographic parameters
    - mean, median,...
  - Calculate the percentage of each scenario in the 1000 best coalescence simulations



he best scenario is the one that has the highest %

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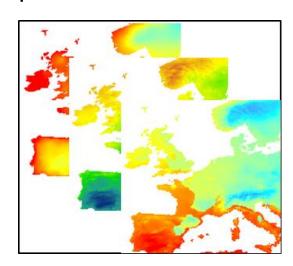
## Biogeographical hypothesis (example)

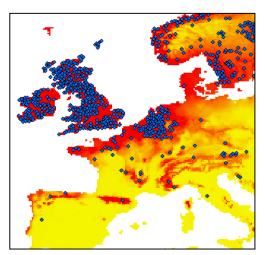


## Species Distribution Modeling

- Models → simplification
- $lue{\Box}$  SDMs ightarrow prediction of suitability for the development of species
- □ Statistical or mathematical association between dependent (data on distribution of species) and independent variables (environmental factors) → extrapolation to the whole study area







Dependent variable



Independent variable



Species distribution models

Calypogeia muelleriana

## Independent variables

- □ Type
  - Climatic variables: Worldclim 1.4, present, past and future
  - Soil, lithology and geology
  - Elevation and derived variables
  - Variables obtained through remote sensing
  - Human demography and land use



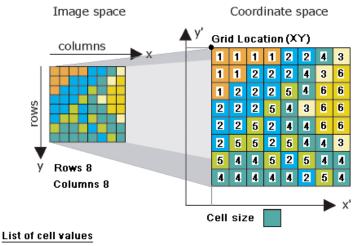
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[111122431122243612225466222543662252446625525443544525444444254]

# Dependent variables

- □ Occurrence points
- Point shapefile

Two principal types of model

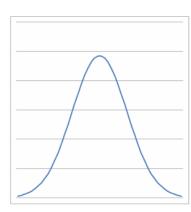
- □ Presence-only
  - Descriptive, describe a climatic envelop
  - Backgrounds don't change anything
- □ Presence-absence/pseudo-absence
  - Probabilistic, distribution of probability of presence
  - Pseudo-absence = when no absence data are available
    - → randomly distributed into the background
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#### Model

- □ Raster
  - Each pixel is associated with a value = index of suitability
- □ Can be projected
  - Into another area
  - In the past
  - In the future
- Binarisation (optional)
  - □ Threshold  $\rightarrow$  if  $\geq$  T 1; if < T 0
  - Area of suitability for the species
- □ MESS analyze (optional)
  - Define a envelop of analogous climate
  - Model can projected on analogous region only

1	1	0	0
1	1	0	0
1	0	0	1
0	0	1	1

# How to get effective population size?

- Define 100% of probability of presence (1) = min X; max Y individuals
  - □ The range usually taken is min 1 and max 50 individuals
- $\Box$  Sum all of the pixels  $\rightarrow$  Ne<sub>min</sub>
  - □ if binarised model => sum all the value 1
  - If not => standardize the values by divided each value by the maximum value
    + sum the pixels
- $\square$  Multiply the sum by  $Y \rightarrow Ne_{max}$
- □ This range is use in the ABC as a prior parameter
  - One range for each species and each period (if projections)
- $\Box$  It's possible to cut the model into different regions => NeA, NeB

# Example in our study

- Model cut into 6 parts
  - North-East of Europe
  - North-West of Europe
  - South-East of Europe
  - South-West of Europe
  - North America
  - Macaronesia



Range of Ne for each region

- To get Ne East => Ne N-E + Ne S-E
- □ To get Ne South => Ne S-E + Ne S-W
- □ ...

# **Applications**

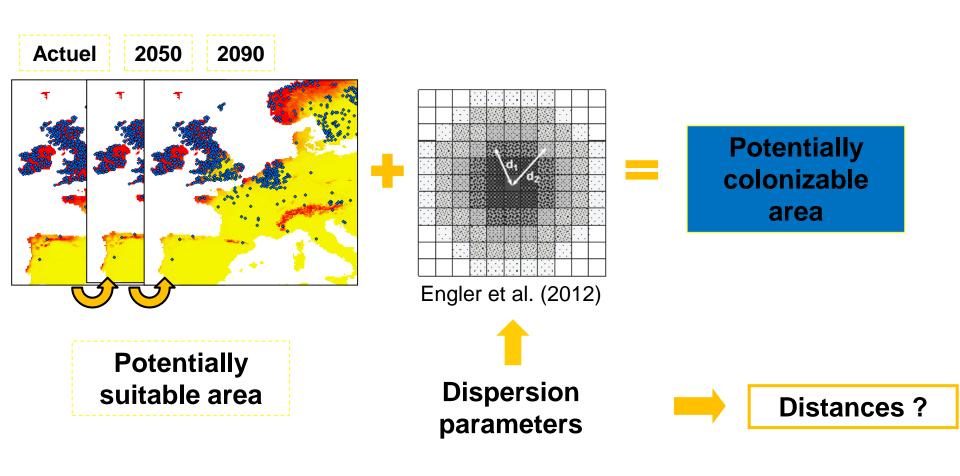
- Biogeography: Study the effects of global change and distribution of species in the past
- Biodiversity
  - Search for new populations of endangered organisms
  - Selecting areas for reintroduction
  - Biodiversity patterns and hot spots
  - Reserve design
  - Basis of the IUCN classification of endangered species

#### Limitations

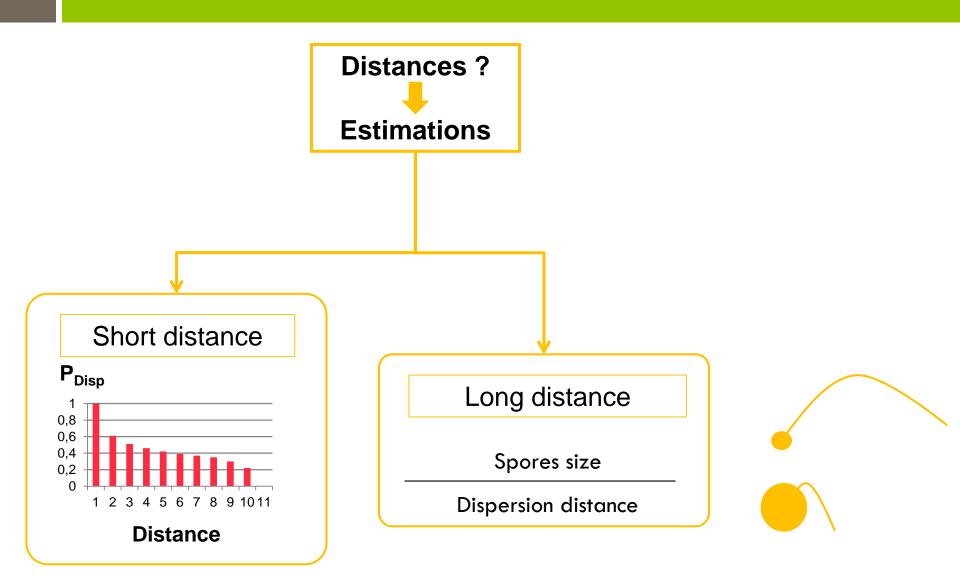
- Pseudoequilibrium hypothesis: we assume that the population is in balance or pseudoequilibrium with environmental conditions
- Biotic interactions
- Uncertainty of the input data and computations
- No space component: biogeographical barriers, limitations in the dispersal capacity of the species, and so on.

Bryophytes are good model because of their high dispersal capacities

# Dynamic models

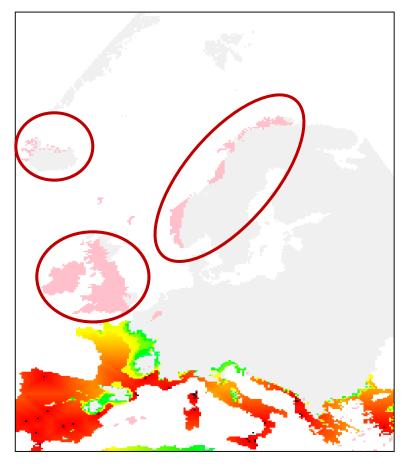


# Dynamic models



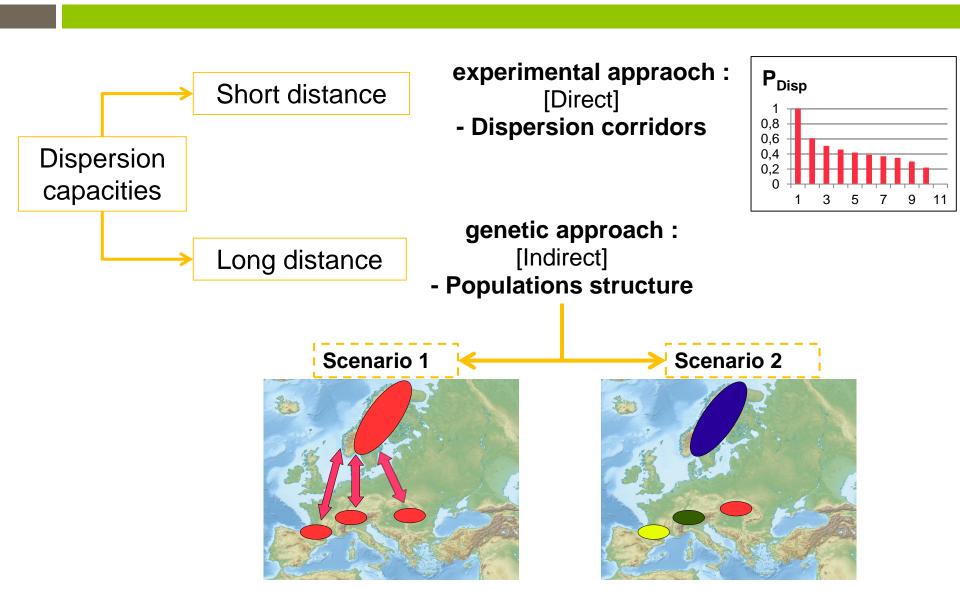
# Dynamic models

- Green-red gradient = gradient of suitability
- Pink = suitable but not colonizable area



Corsinia coriandrina

### Improved dynamic models





Thank you for your attention!

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