DYAFOR meeting – March, 1st 2022

Assessing tree species vulnerability to climate change in French Guiana using joint species distribution models



Ghislain VIEILLEDENT<sup>1,2</sup> Jeanne CLEMENT<sup>1,2</sup> METRADICA<sup>2</sup>

[1] Cirad UMR AMAP, [2] METRADICA Labex CEBA







### Introduction

- JSDMs
- METRADICA's objectives
- Material and methods 2
  - Datasets
  - Study scales



#### Perspectives

- Model comparison
- Applications



### Plan



- JSDMs
- METRADICA's objectives
- Material and methods
  - Datasets
  - Study scales

- 3 Perspective
  - Model comparison
  - Applications



# Joint Species Distribution Models (JSDMs)

### Species Distribution Model (SDM), for one single species.

- $y_i \sim Bernoulli(\theta_i), y_i \in \{0, 1\}$
- *i* : site
- $p(\theta_i) = X_i \beta$
- X : environmental variables
- $\beta$  : species effects

### JSDM = SDM for community of species.

• 
$$p(\theta_{ij}) = \alpha_i + X_i \beta_j + \Sigma_{ij}$$

- *i* : site, *j* : species
- Site effect  $\alpha_i$  : mean site suitability
- Variance-covariance matrix Σ<sub>ij</sub> : species co-occurrences

# Joint Species Distribution Models

JSDMs provide a convenient statistical framework to test **trait-environment** interactions.

 $\beta_j$  can be expressed as a function of functional traits

• 
$$p(\theta_{ij}) = \alpha_i + X_i \beta_j + \Sigma_{ij}$$

• 
$$p(\beta_j) = N(T_j\gamma, V_\beta)$$

JSDMs can help narrow the gap between **correlative** and **mechanistic** species distribution models.

jSDM R package (first chapter of Jeanne's PhD thesis), https://ecology.ghislainv.fr/jSDM/

# Objectives of METRADICA (Task 3)

Using JSDMs :

- Test **trait-environmment** interactions for determining tree species distribution in French Guiana.
- Assess species vulnerability to climate change (through contraction of species range).
- Interpret species vulnerability to climate change in terms of functional traits.
- $\bullet$  Derive maps of  $\alpha$  and  $\beta$  diversity for French Guiana.
- Identify refuge area for biodiversity under climate change (stable tree communities).

2





- JSDMs
- METRADICA's objectives
- Material and methods
  - Datasets
  - Study scales

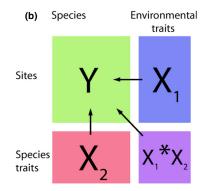
- 3 Persp
  - Model comparison
  - Applications



### Datasets

Three types of data-sets :

- Species occurrences on sites
- Species trait database
- Environmental database



## Occurrences

- Forest plot inventories coming from several networks combined together
- Networks : Guyafor, Gentry, Habitat, Guyadiv
- Presence-absence data and abundances
- 285 forest plots
- About 1700 tree species, most of which are rare



### Traits

- Large "soft" trait (WD, LSA, tree max height, etc.) databases from previous CEBA projects.
- Five additional mechanistic traits from Metradica project :
  - leaf water potential at which cells lose turgor (Ptlp), minimum leaf conductance (gmin), leaf saturated water content (LSWC), vein density (VLA), stomatal density (SD).
  - 24 species, 672 trees, three sites with both hills and valleys spread on a precipitation gradient.

## Environment

- Topographic data (SRTM and LiDAR)
- Soil data
- Distance to human infrastructures (roads, villages)
- Climatic data (Chelsa) in the present and the future
- https://guyaclim.cirad.fr

# Scales : biogeography and micro-environment

#### Local scale : microtopography $\times$ traits

- Scale =  $\sim 10$ km, resolution =  $\sim 5$ m
- Explicative model : E  $\times$  T
- Using MNT at 5m : hills ( "terra firme") and valleys

### Country scale (French Guiana)

- Scale = FG, resolution =  $\sim 1 \text{km}$
- Explicative and predictive model
- Two models
  - Without traits
    - Predictive model
    - Present : distribution and co-occurrences of species
    - Future : range contraction in the future : (i) species vulnerability to climate change, (ii) change in species composition
  - With traits
    - Explicative model : E  $\times$  T
    - Explaining species location (biogeography)



- JSDMs
- METRADICA's objectives
- Material and methods
  - Datasets
  - Study scales



- Perspectives
- Model comparison
- Applications



# Model comparison with forest dynamics models

### TROLL model

- Tropical forest dynamics model
- Growth, mortality, recruitment through carbon allocation
- Species parameters are derived from traits
- Calibrated on some forests of French Guiana

#### Model comparison

- Species excluded from the community with TROLL under climate change.
- Do the same species experience a severe range contraction with JSDMs ?

# Applications

- Anticipating climate change effects on tropical forest in French Guiana
  - Massive tree mortality events and forest conversion to savannas?
  - Change in species composition?
- Identification of refuge areas for conservation  $\Rightarrow$  systematic conservation planning.

... Thank you for attention ... https://ecology.ghislainv.fr/presentations

