

Searching for hotspots within a hotspot :

Stacked species distribution models provide new opportunities to map species richness in New Caledonia

Robin Pouteau, É. Bayle, É. Blanchard, P. Birnbaum, J.-J. Cassan, V. Hequet, T. Ibanez, H. Vandrot

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MONTPELLIER (FRANCE)



Introduction

THE NEED FOR FINE-SCALE BIODIVERSITY MAPS

Biodiversity hotspots for conservation priorities

Norman Myers^a, Russell A. Mittermeier[†], Cristina G. Mittermeier[†], Gustavo A. B. da Fonseca[‡] & Jennifer Kent[§]



Hotspots within hotspots: Endemic plant richness, environmental drivers, and implications for conservation



Eva M. Cañadas^{a,b,*}, Giuseppe Fenu^a, Julio Peñas^b, Juan Lorite^b, Efsio Mattana^{a,c}, Gianluigi Bacchetta^a

Conservation Biology

Contributed Paper

Plant Diversity Hotspots in the Atlantic Coastal Forests of Brazil

CHARLOTTE MURRAY-SMITH,^{*,†} NEIL A. BRUMMITT,^{*} ARY T. OLIVEIRA-FILHO,[†] STEVEN BACHMAN,^{*} JUSTIN MOAT,^{*} EIMEAR M. NIC LUGHADHA,^{*} AND EVE J. LUCAS^{*,§}

Biodiversity hotspots: reservoirs of biodiversity under threat from humans

Conservation of an entire biome is impossible, and strategies must focus on small areas that represent a maximum of the biome's diversity and endemism

Smaller local hotspots must be

Introduction

HOW TO MAP BIODIVERSITY?

- **Macroecological mode**

Himalayas

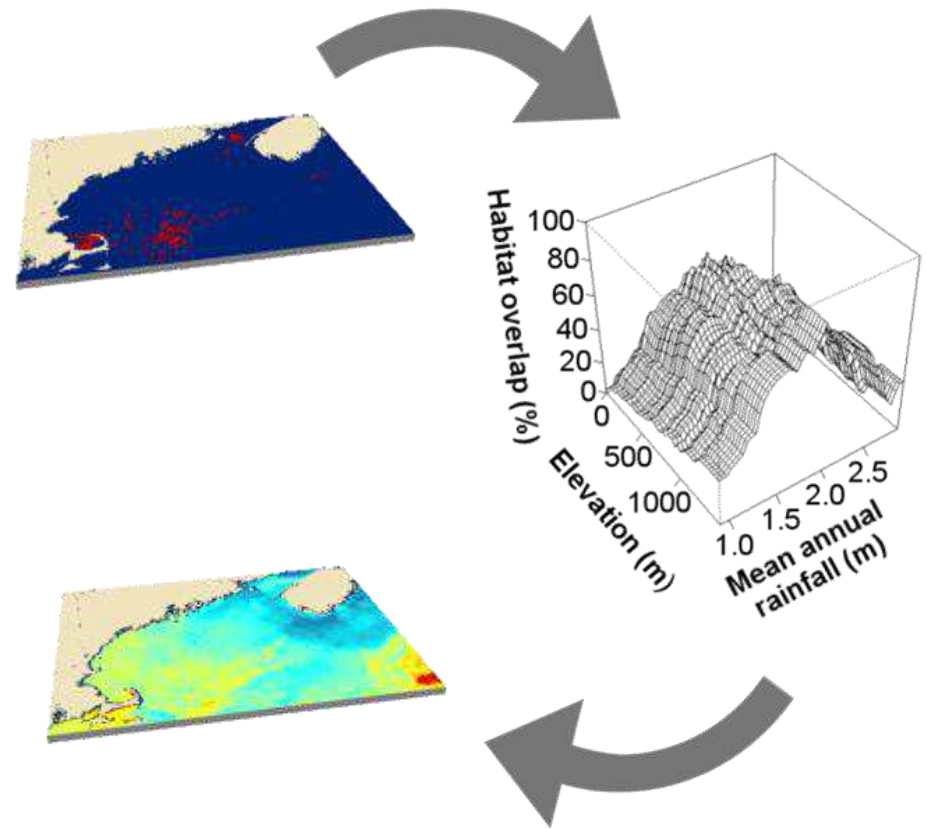
Bhattarai & Vetaas (2003)

Mesoamerica

Sanchez-Gonzalez & Lopez-Mat

New Zealand

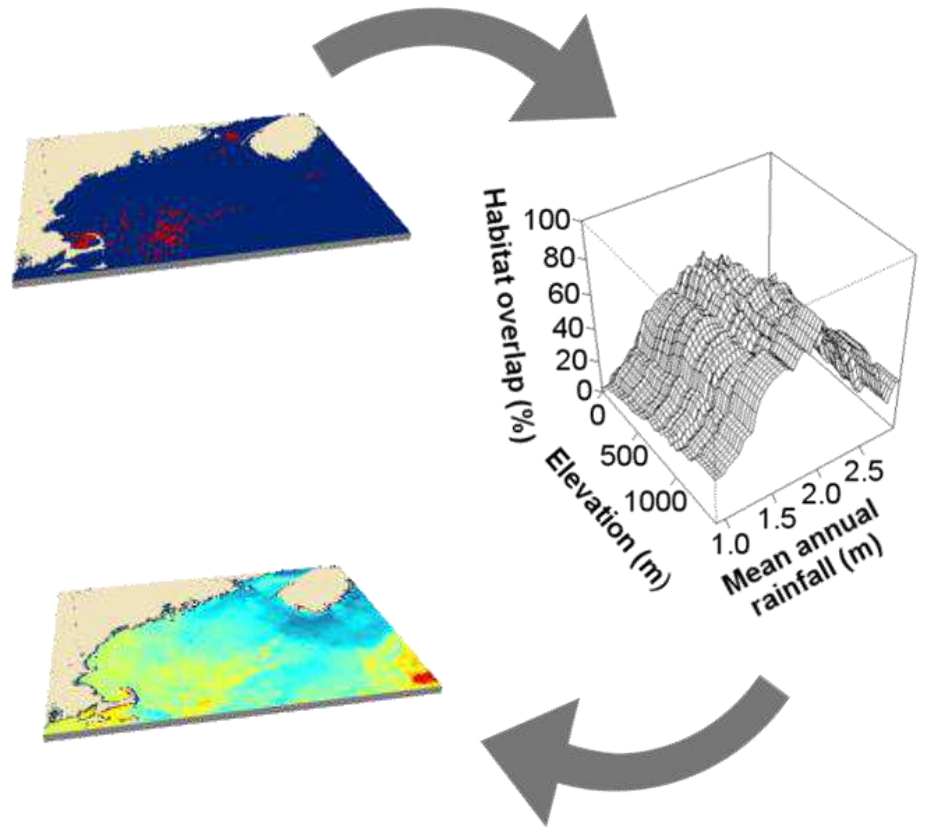
Tomasetto *et al.* (2013)



Introduction

HOW TO MAP BIODIVERSITY?

- Macroecological mode
→ **Time- and cost-demar**



Introduction

HOW TO MAP BIODIVERSITY?

- Macroecological models?
→ **Time- and cost-demanding**

- Point-to-grid maps?

Guinean Forests of West Africa

Droissart *et al.* (2006)

New Caledonia

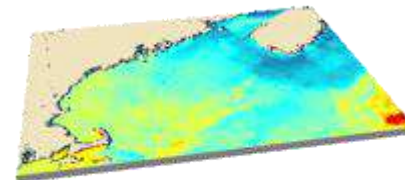
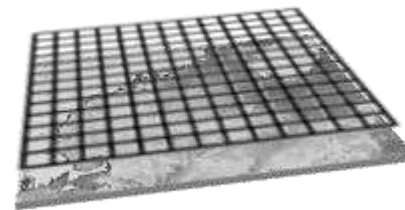
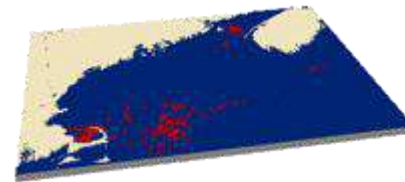
Wulff *et al.* (2012)

Indo-Burma

Tovaranonte *et al.* (2014)

Mediterranean Basin

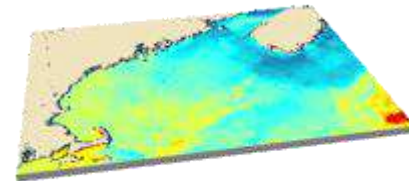
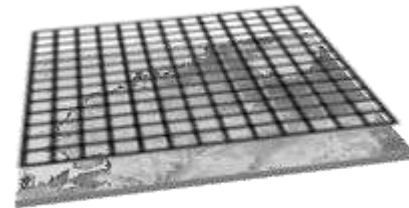
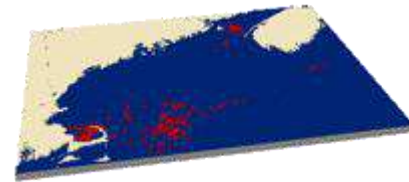
Cañadas *et al.* (2014)



Introduction

HOW TO MAP BIODIVERSITY?

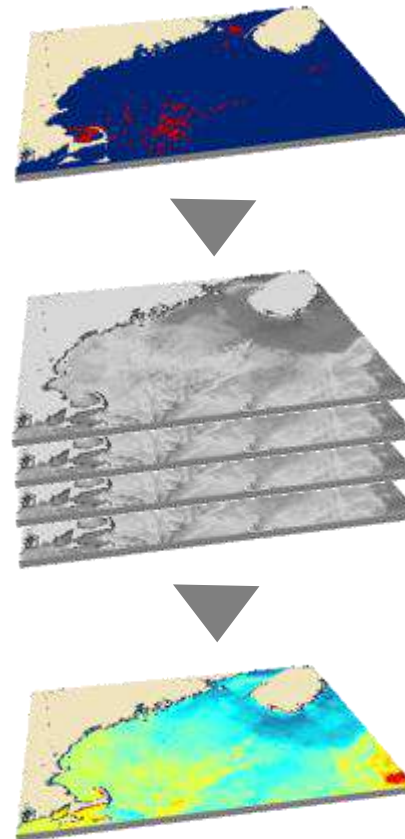
- **Macroecological models?**
→ **Time- and cost-demanding**
- **Point-to-grid maps?**
→ **Not accurate at fine scale**
Graham & Hijmans (2006)



Introduction

HOW TO MAP BIODIVERSITY?

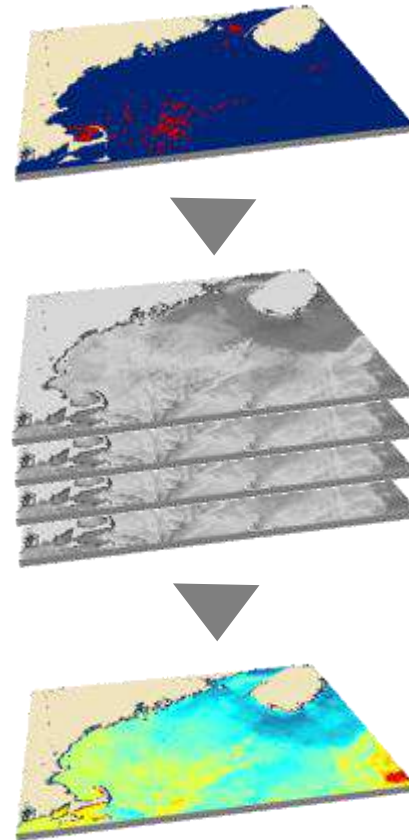
- Macroecological models?
→ **Time- and cost-demanding**
- Point-to-grid maps?
→ **Not accurate at fine scale**
Graham & Hijmans (2006)
- Stacked species distribution models?
Sundaland (Raes *et al.* 2009)
Atlantic Forest (Murray-Smith *et al.* 2009)
Tumbes-Choco-Magdalena (Mateo *et al.* 2013)



Introduction

HOW TO MAP BIODIVERSITY?

- **Macroecological models?**
→ **Time- and cost-demanding**
- **Point-to-grid maps?**
→ **Not accurate at fine scale**
Graham & Hijmans (2006)
- **Stacked species distribution models?**
→ **Time- and cost-effective**
→ **Accurate at fine scale**



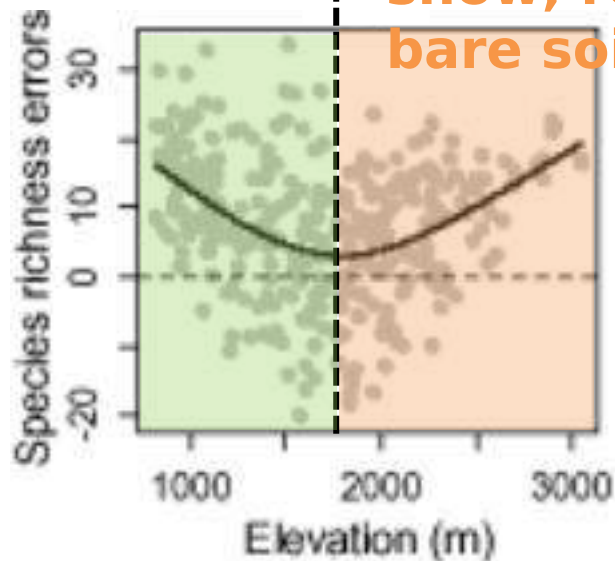
Introduction

S-SDM ACCURACY ASSESSMENT

3 studies have used comprehensive plot inventories to assess S-SDMs Guisan *et al.* (1999); Dubuis *et al.* (2012); Pottier *et al.* (2013)

Increasing
environmental
filtering

Unpredictable
extrem
environments:
snow, rocky and
bare soil?



Introduction

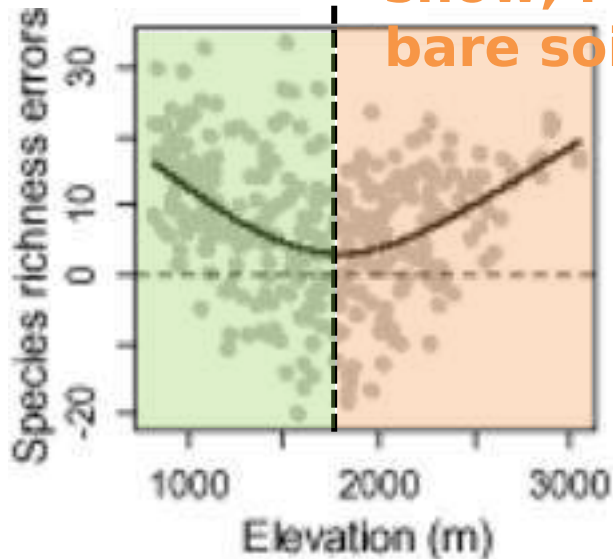
S-SDM ACCURACY ASSESSMENT

3 studies have used comprehensive plot inventories to assess S-SDMs Guisan *et al.* (1999); Dubuis *et al.* (2012); Pottier *et al.* (2013)

Increasing environmental filtering

Unpredictable extrem environments: snow, rocky and bare soil?

We need a study in a non-glacial and fully vegetated area such as in the



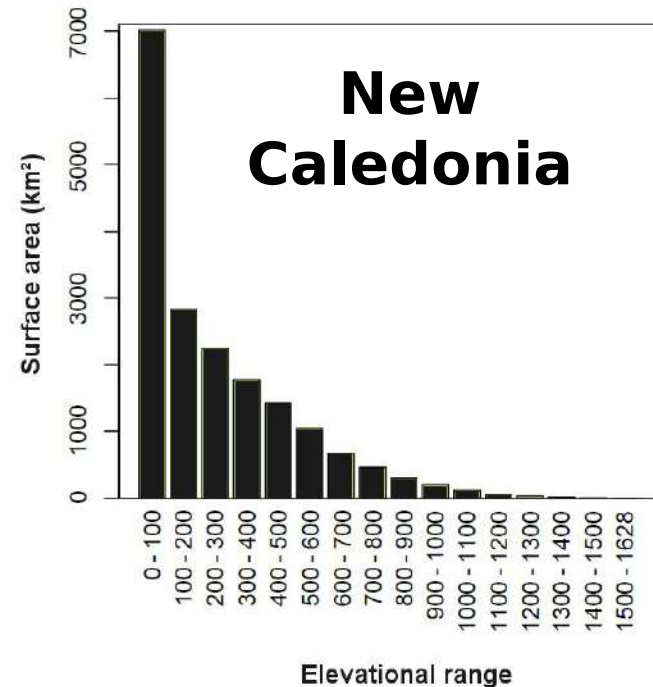
Alpine grassland and tundra



Tropical montane cloud forest

Introduction

THE INDIRECT AREA EFFECT ON S-SDM ACCURACY

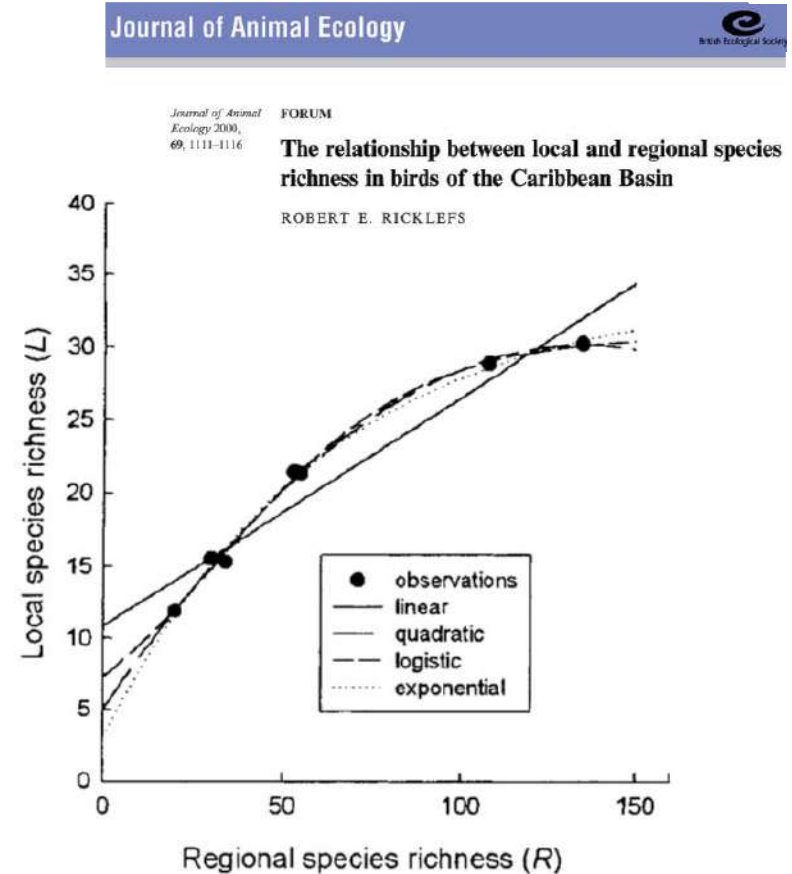


$S = c A^z$ Arrhenius (1921)
 S : # species; c : # species per square unit; A : regional area; z : constant

The conical shape of mountains decreases the regional species richness

Introduction

THE INDIRECT AREA EFFECT ON S-SDM ACCURACY

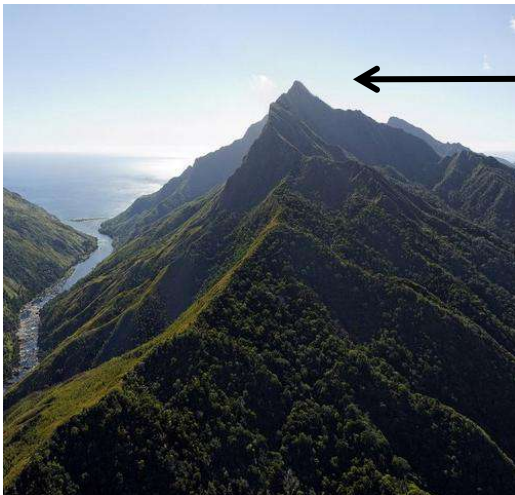


The regional species richness is correlated to the local species richness

Introduction

AIM

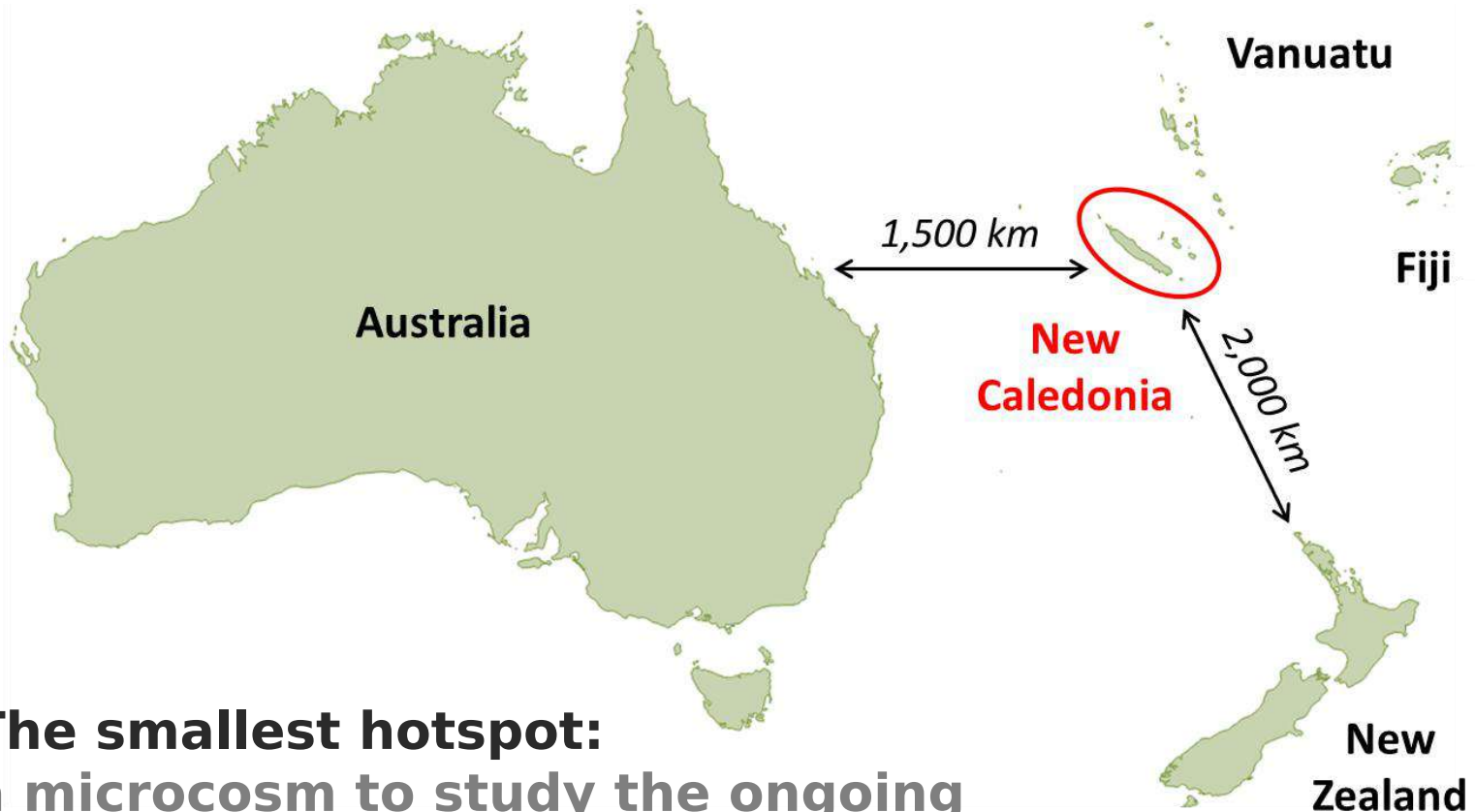
- **Are S-SDMs able to map local species richness in a biodiversity hotspot?**
- **How does S-SDM accuracy vary along an environmental gradient in tropical mountains?**
- **And why?**



- 1) Increasingly unpredictable environment?
- 2) Indirect area effect?

Materials and methods

NEW CALEDONIA



- **The smallest hotspot:**
a microcosm to study the ongoing biodiversity crisis
- **Megadiverse:**
> 3300 vascular plant species, 75% of
endemism

Materials and methods

NEW CALEDONIA



Materials and methods

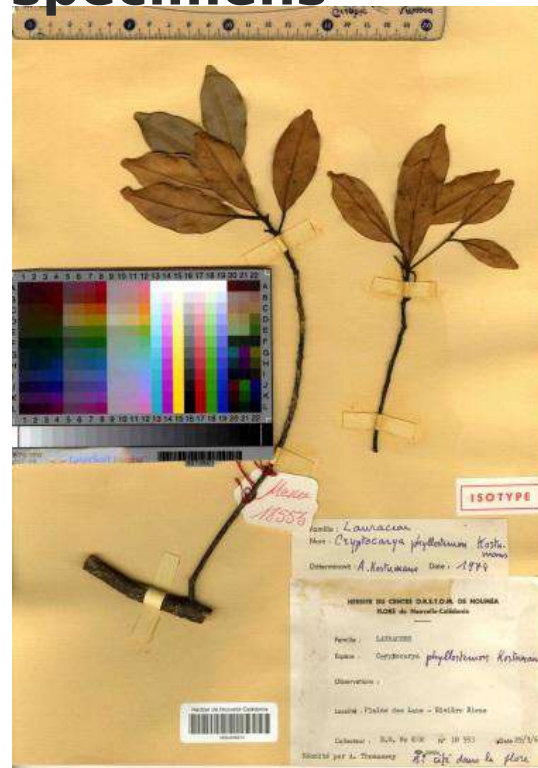
SPECIES, OCCURRENCE AND BIODIVERSITY DATA

562 tree, tree fern and palm species

At least one individual with a DBH > 10 cm within the NC-PIPPN plot



>10,000 herbarium specimens



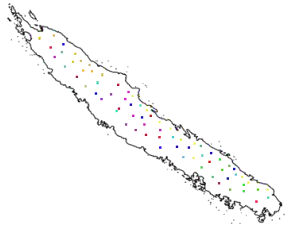
11 independent 1 ha evaluation plots



Materials and methods

S-SDM IMPLEMENTATION

562 tree species
> 10,000 presences



Eight 100 m-resolution non-auto-correlated environmental variables:

- 6 non-categorical

Elevation (m) - Slope steepness (°) -

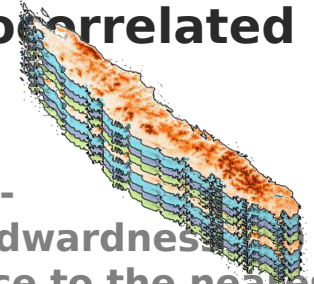
Potential insolation (kWh.m⁻²) - Windwardness

Topographic wetness index - Distance to the nearest road

(km)

- 2 categorical

Substrate types - Phytogeographical sectors



562 individual
MAXENT
models

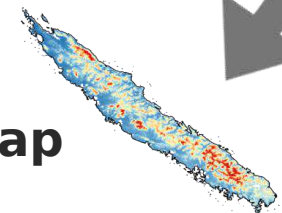
562 habitat
suitability
maps

Map summing i.e. no
threshold
(Calabrese *et al.* 2014)

S-SDM
accuracy
assessment

11
independent
evaluation
plots

Species
richness map

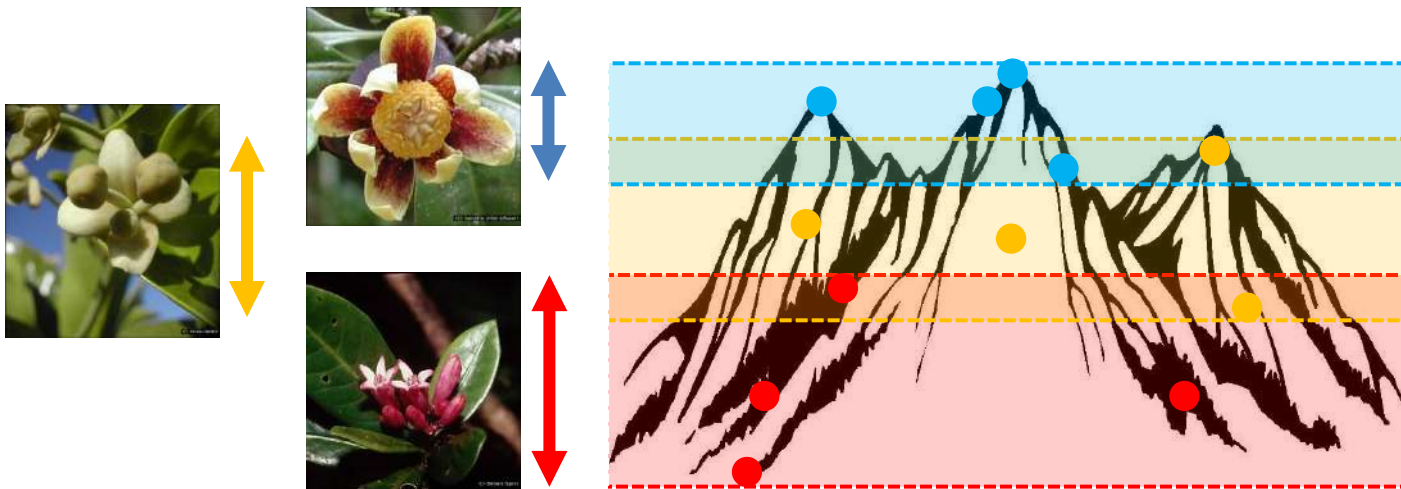


Materials and methods

ACCOUNTING FOR THE INDIRECT AREA EFFECT

- Elevation ranges determined by using the minimum and maximum elevations where a species occurs

Wang *et al.* (2007); McCain & Grytnes (2010);
Tang *et al.* (2014)



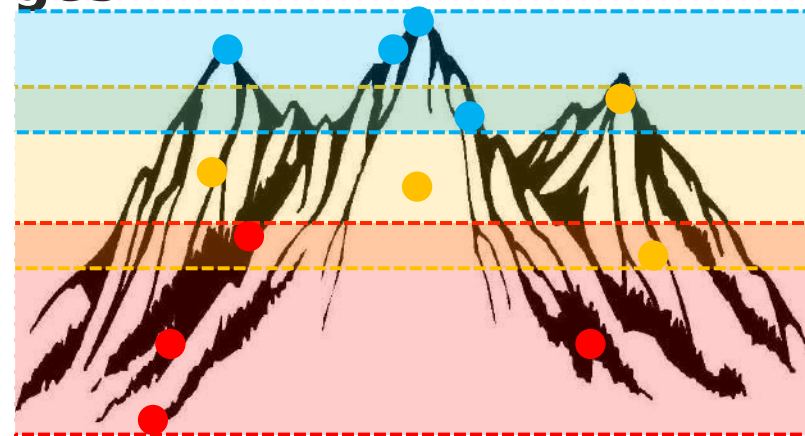
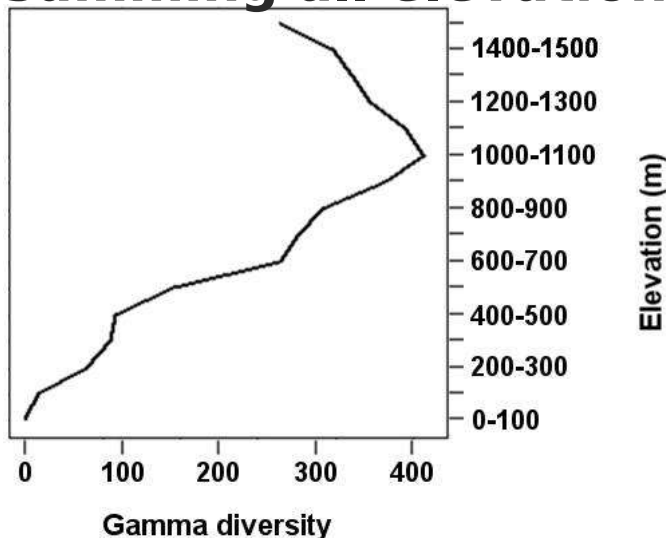
Materials and methods

ACCOUNTING FOR THE INDIRECT AREA EFFECT

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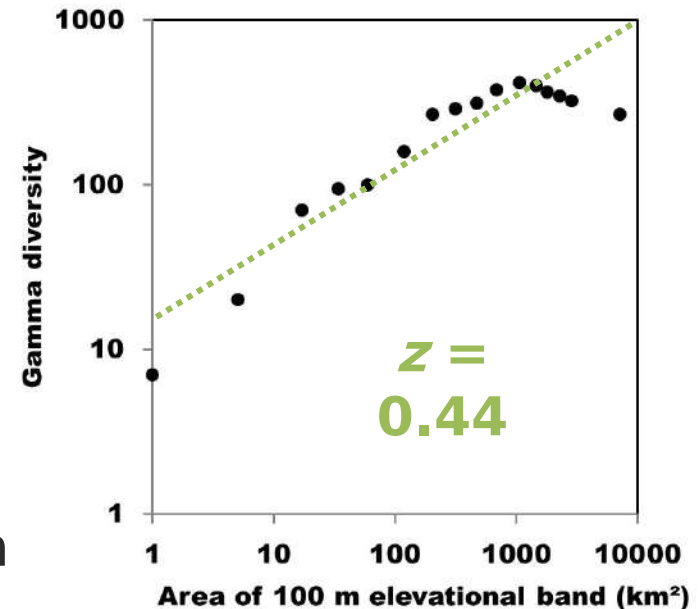
- Species richness estimated by summing all elevation ranges



Materials and methods

ACCOUNTING FOR THE INDIRECT AREA EFFECT

- Elevation ranges determined by using the minimum and maximum elevations where a species occurs
Wang *et al.* (2007); McCain & Grytnes (2010); Tang *et al.* (2014)
- Species richness estimated by summing all elevation ranges
- z parameter determined as the slope of the species-area curve on a log-log scale (McCain 2007)



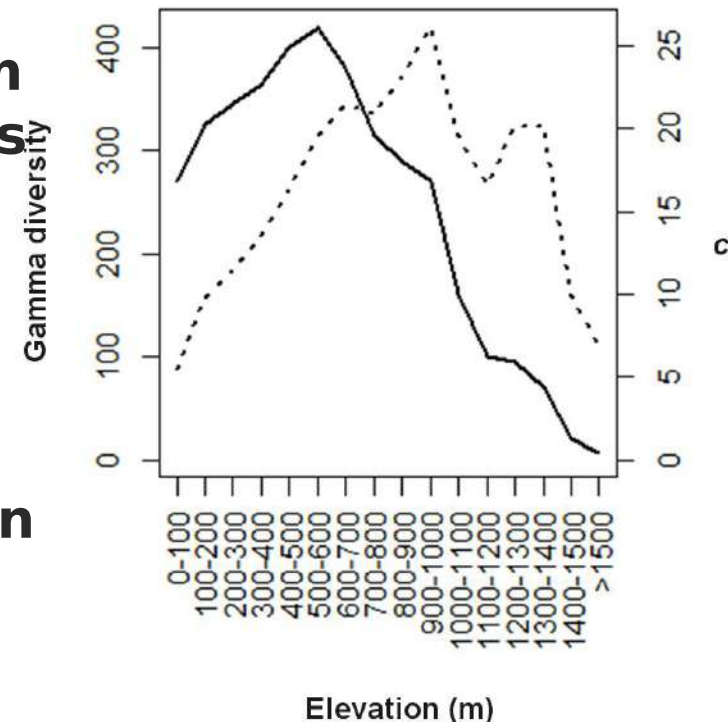
$$S = c A^z \text{ Arrhenius (1921)}$$

S : # species; c : # species per square unit; A : regional area; z : constant

Materials and methods

ACCOUNTING FOR THE INDIRECT AREA EFFECT

- Elevation ranges determined by using the minimum and maximum elevations where a species occurs
Wang et al. (2007); McCain & Grytnes (2010); Tang et al. (2014)
- Species richness estimated by summing all elevation ranges
- z parameter determined as the slope of the species-area curve on a log-log scale (McCain 2007)
- The area-dependent species richness S determined by multiplying S-SDM estimates by A^z

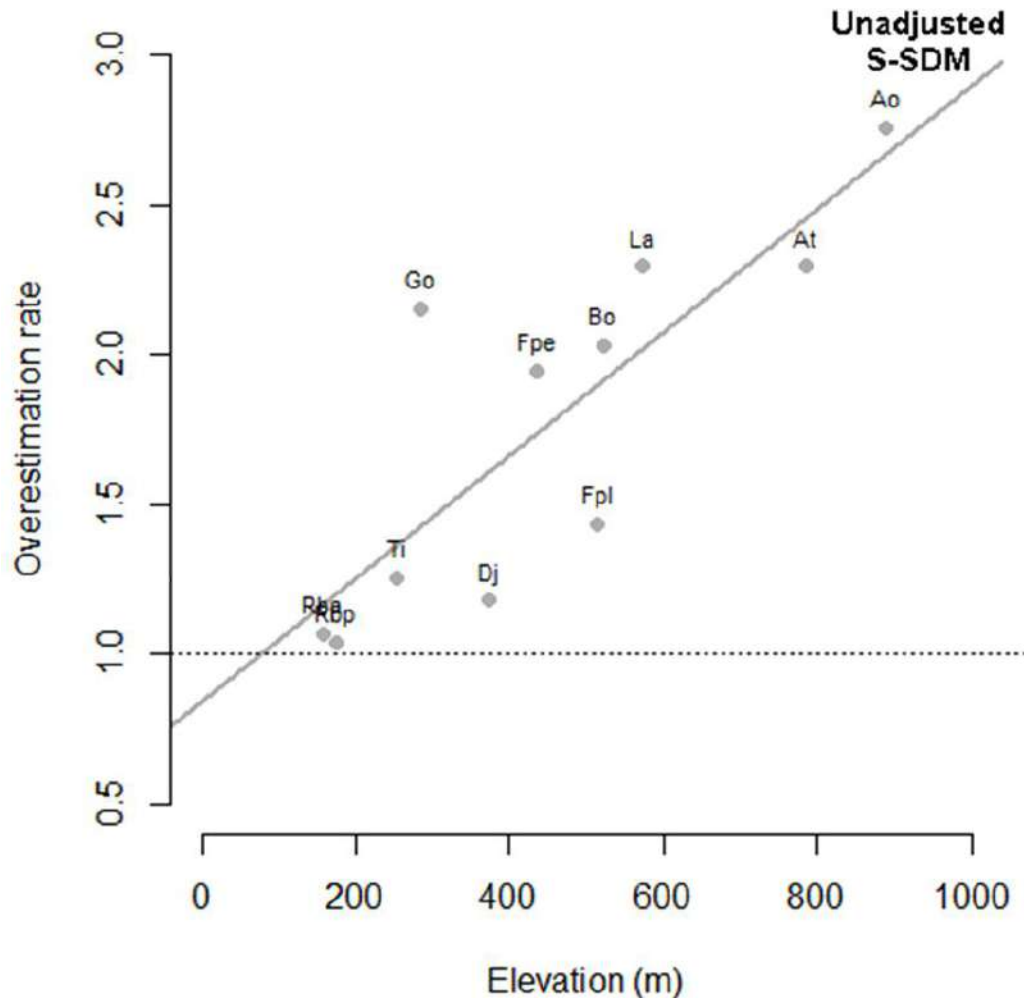


$$S = c A^z \text{ Arrhenius (1921)}$$

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Results and discussion

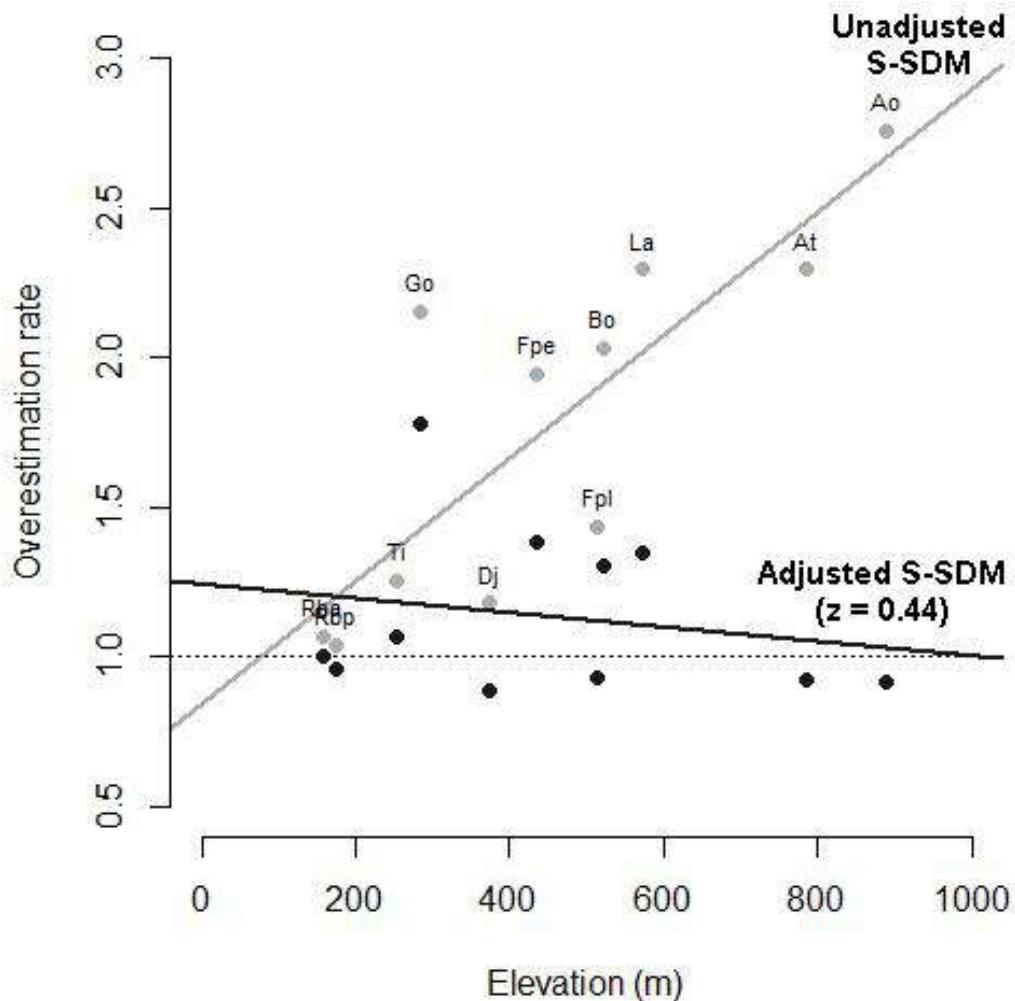
S-SDM ACCURACY DECREASES WITH ELEVATION



- No correlation between S-SDM overestimation and variables other than elevation ($r^2 < 0.15$)
- Significant correlation between S-SDM overestimation and elevation ($r^2 = 0.71^*$)

Results and discussion

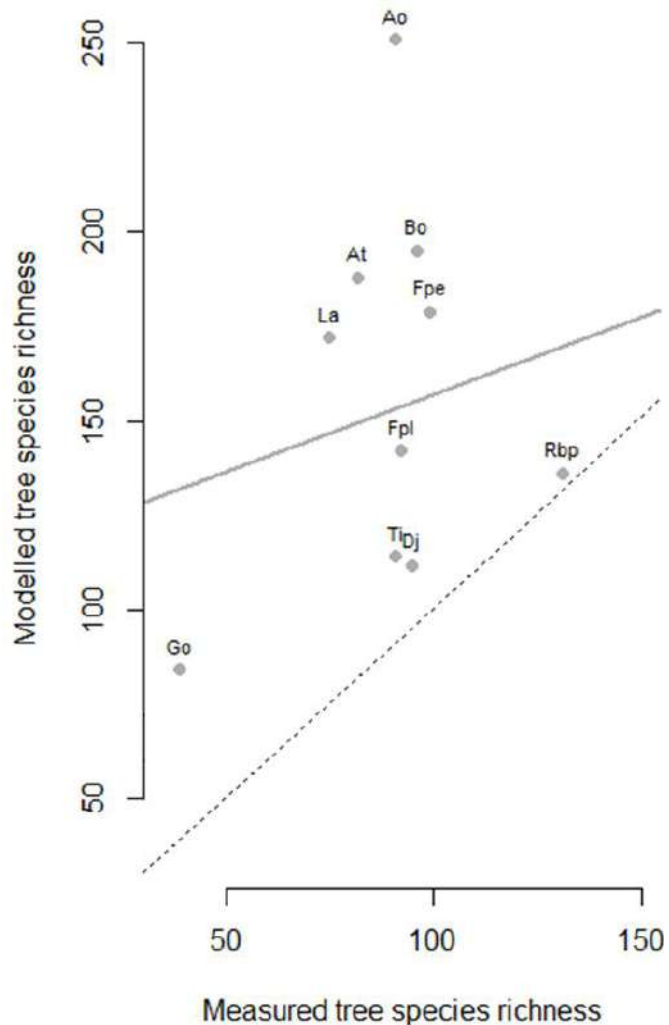
S-SDM ACCURACY DECREASES WITH ELEVATION



- No correlation between S-SDM overestimation and variables other than elevation ($r^2 < 0.15$)
- Significant correlation between S-SDM overestimation and elevation ($r^2 = 0.71^*$)
- Accounting for the indirect area effect allows de-correlating overestimation

Results and discussion

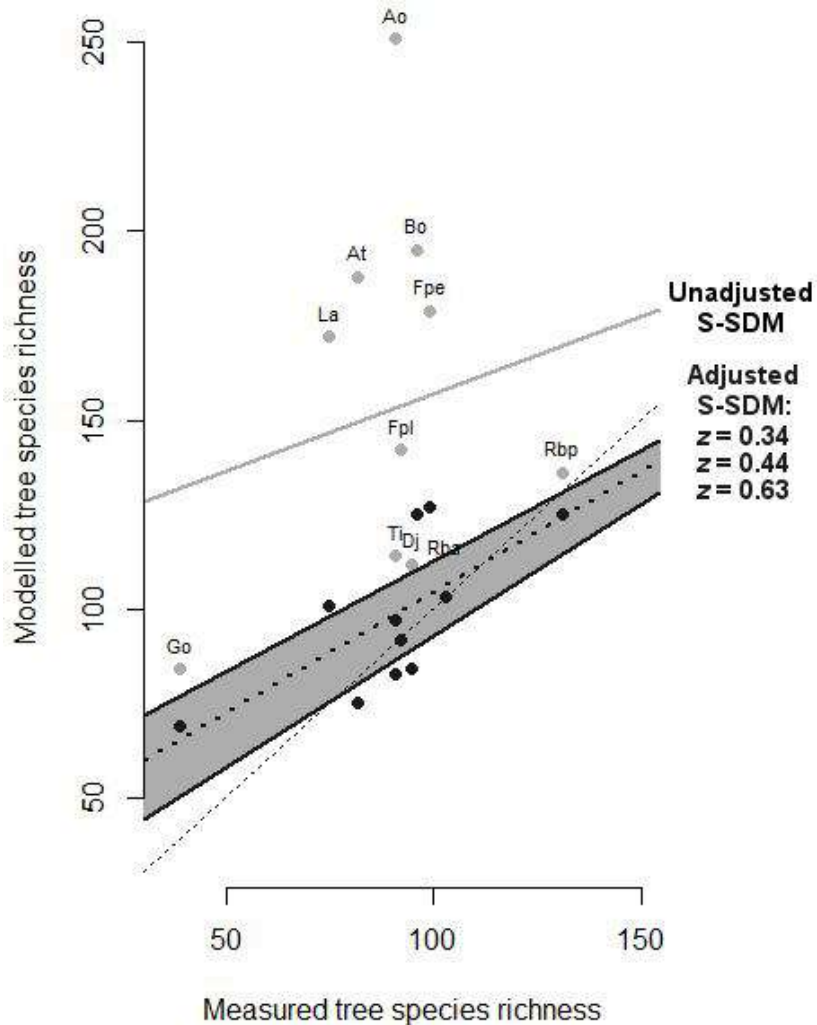
S-SDMs ARE ABLE TO MAP ALPHA DIVERSITY



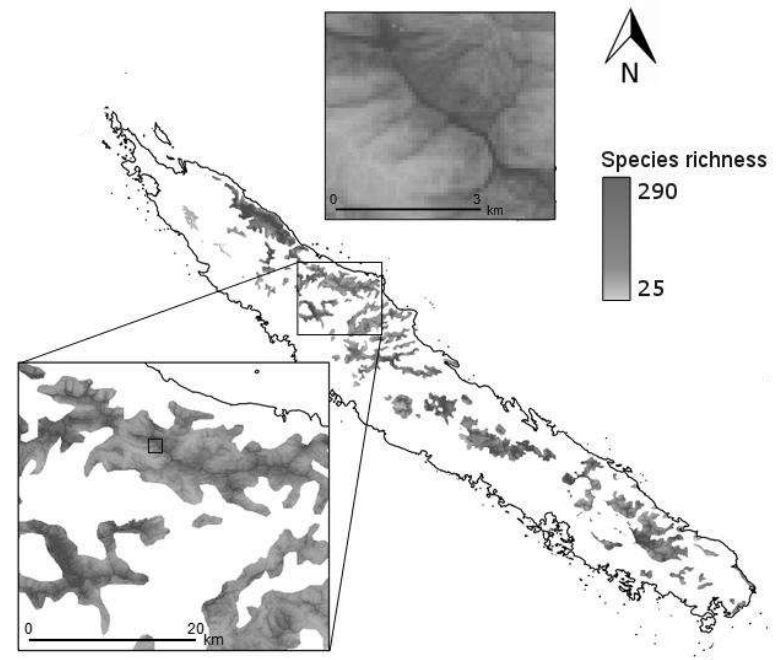
- No correlation between unadjusted S-SDM estimates and empirical species richness ($r^2 = 0.03$)

Results and discussion

S-SDMs ARE ABLE TO MAP ALPHA DIVERSITY



- No correlation between unadjusted S-SDM estimates and empirical species richness ($r^2 = 0.03$)
- Significant correlation with adjusted S-SDM



Results and discussion

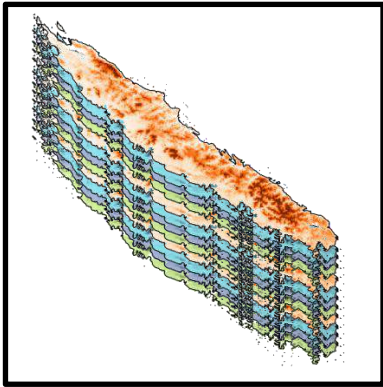
OTHER CAUSES THAT MIGHT INFLUENCE S-SDM ACCURACY

- **Difference between relative suitability and true occupancy probability that only presence-absence SDMs are able to provide (Guillera-Arroita *et al.* 2014)**
- **Micro-topography neglected by our 100 m-resolution GIS variables**
- **The variety of forest dynamic stages observed in evaluation plots**
- **Dispersal limitation and narrow-range endemism that can induce commission errors**
- **Species that are present in independent inventories but with a DBH < 10 cm**

Conclusion

TAKE HOME MESSAGE

S-SDM



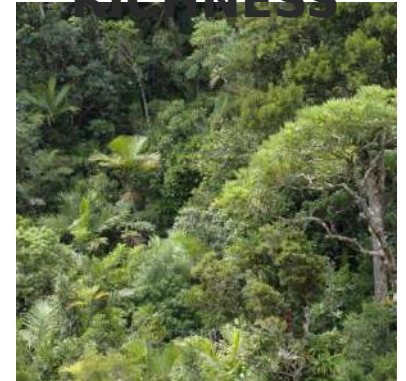
ABIOTIC ENVIRONMENT



Spatial
bias



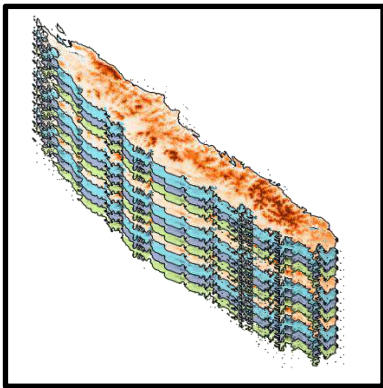
LOCAL SPECIES RICHNESS



Conclusion

TAKE HOME MESSAGE

S-SDM



$$S = C A^z$$

Arrhenius
(1921)

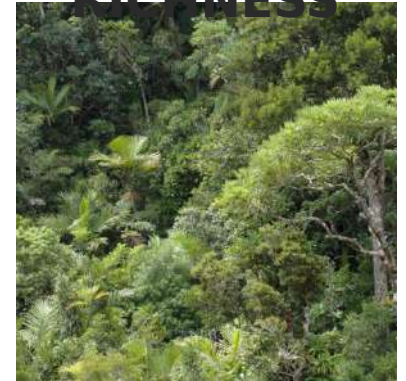
AREA
ADJUSTMENT
METHOD

ABIOTIC ENVIRONME NT



INDIRECT
AREA
EFFECT

LOCAL SPECIES RICHNESS



Oleti - Merci - Thank you for your attention



robin.pouteau@ird.fr

Pouteau, R. *et al.* Ability of a stacked species distribution model to map species richness in a biodiversity hotspot decreases with elevation: the need to account for the indirect area effect. Diversity and Distributions. Accepted with modifications.