



MINISTÉRIO DA CIÊNCIA E TECNOLOGIA  
**INSTITUTO NACIONAL DE PESQUISAS ESPACIAIS**

# Environmental modeling

## GIScience for Dynamic Environmental Sensors

Silvana Amaral

Bilateral Research Workshop

National Institute for Space Research (INPE) and the Institute for  
Geoinformatics (ifgi), University of Münster

March 12, 2009



# Environmental modeling

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- “Environmental”
- Modeling
- Questions



## ■ GEOMA Network

("Rede Cooperativa de Modelagem Ambiental")

- Cooperative Network for Environmental Modeling
- Ministry of Science and Technology
- INPE/OBT, INPE/CPTEC, LNCC, INPA, IMPA, MPEG

## ■ Long-term objectives - Phase I

- Develop computational - mathematical models to predict the spatial dynamics of ecological and socio-economic systems at different geographic scales, within the framework of sustainability
- Support policy decision making at local, regional and national levels, by providing decision makers with qualified analytical tools.
- LUCC, Data Base, Human Dimension, Wetlands, Climate, Physical processes, Biodiversity.



Laboratório  
Nacional de  
Computação  
Científica



INSTITUTO NACIONAL DE  
PESQUISAS DA AMAZÔNIA



Ministério da  
Ciência e Tecnologia



March 2009



# GEOMA Biodiversity

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- Biodiversity & Conservation planning
  - Systematic Planning for Conservation
  - Species Distribution Models
  - Economic interest species Population Dynamic



ATUALIZAÇÃO DAS ÁREAS PRIORITÁRIAS PARA CONSERVAÇÃO, UTILIZAÇÃO SUSTENTÁVEL  
E REPARTIÇÃO DE BENEFÍCIOS DA BIODIVERSIDADE NO BIOMA AMAZÔNIA



# Biodiversity

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Biological diversity or Biodiversity

Totality of genes, species, and ecosystems of a region Or Variation of life at all levels of biological organization

- Variability of Genetic Resources
- Economic interest
- Human demands and presence
- Climatic changes

- How to measure ?
- Strategies for conservation?



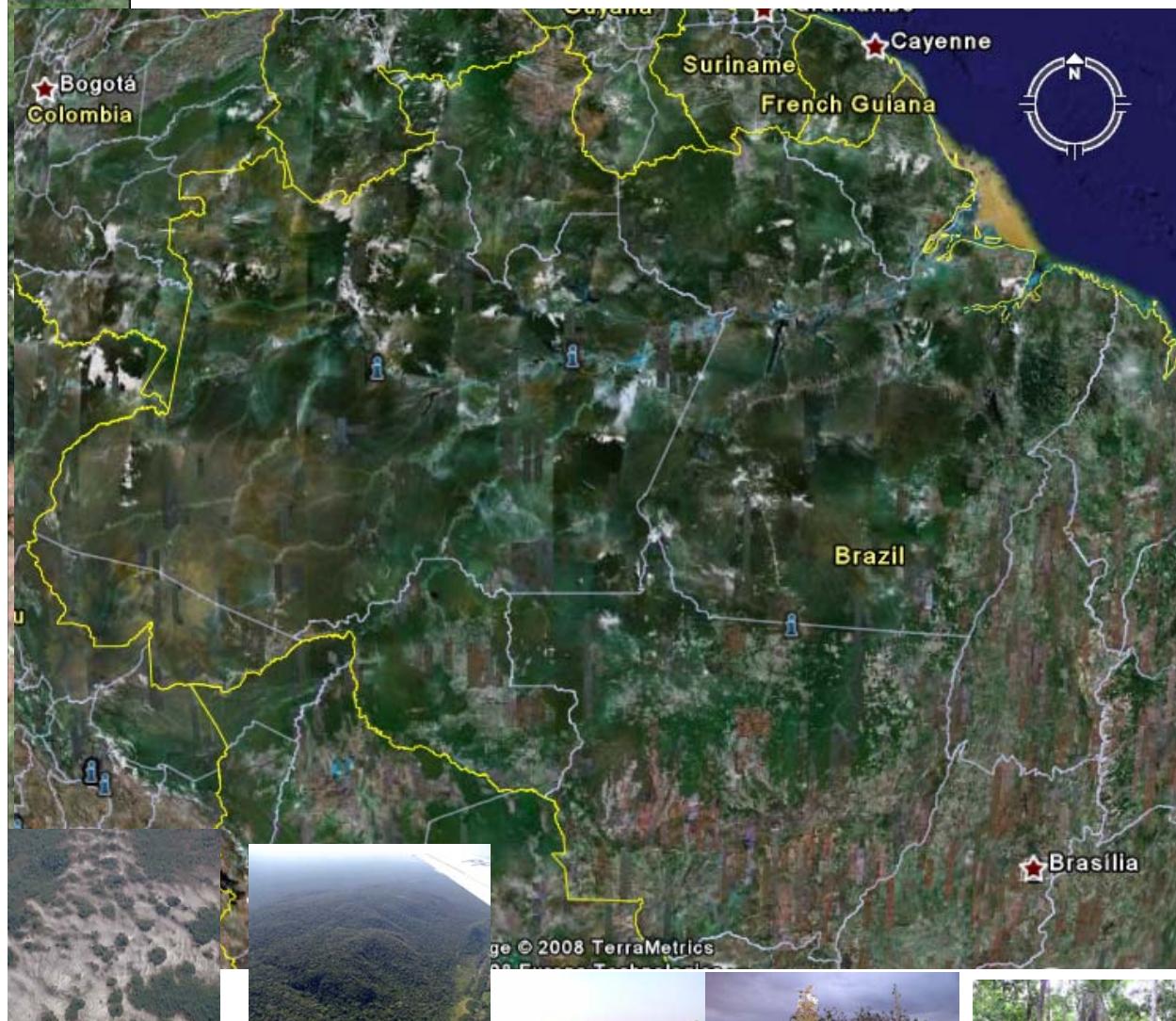


# AMAZONIA

5 million km<sup>2</sup>

# AMAZONIA

4 million km<sup>2</sup> of forest



Photos by Cohn-Haft, 2006

# Field Work



ors - INPE & IfGI Workshop

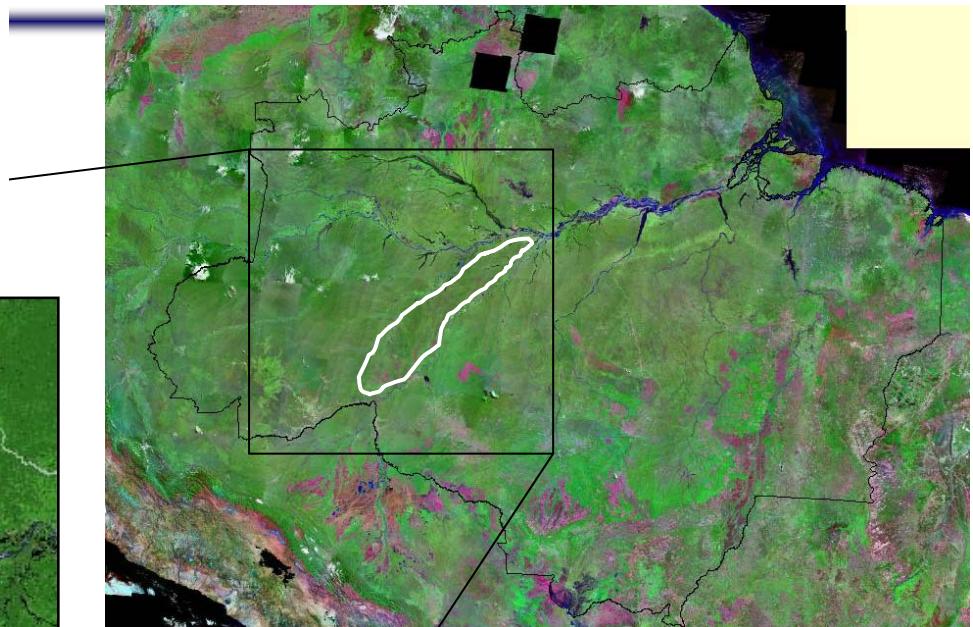
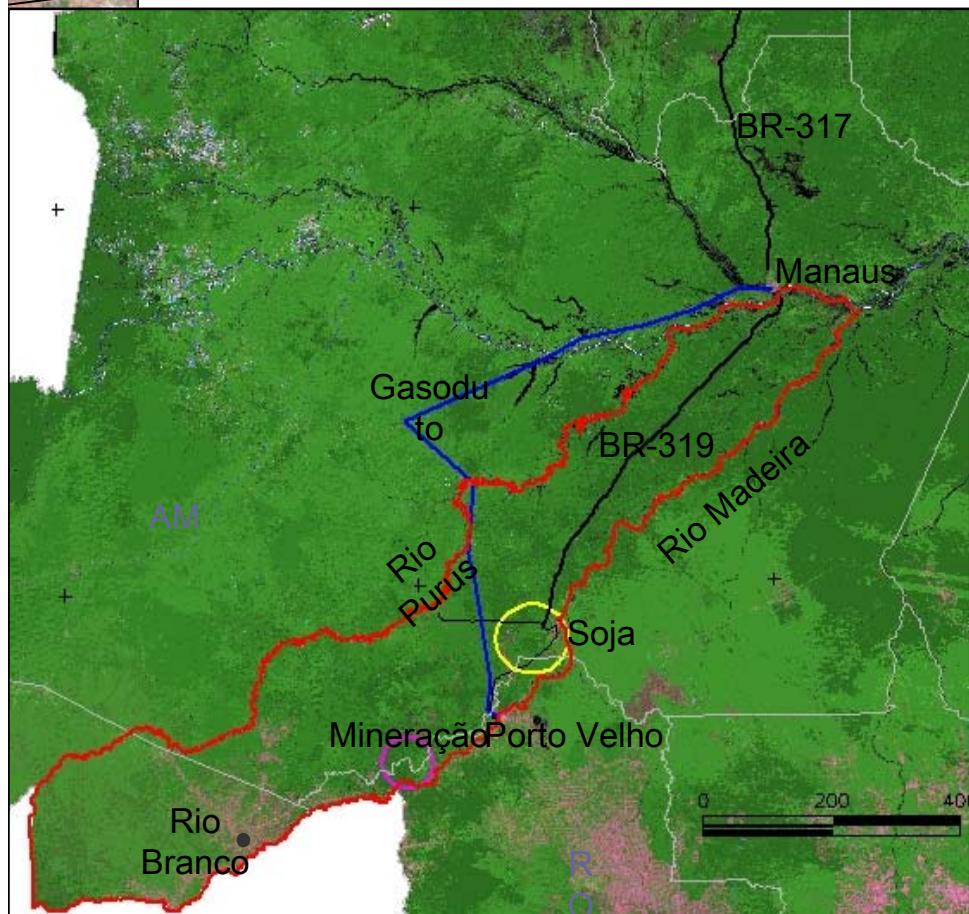
G

March 2009



# GEOMA Biodiversity – Field Data

- Field Work
  - Madeira - Purus rivers
  - BR-319 road
  - Human pressure



Photos by Cohn-Haft, 2006  
March 2009



# GEOMA Biodiversity – Field Data

- **Field Work:** (23 researchers) birds, fishes, insects (bee, butterfly), arthropods (spiders), mammals, lizards, vegetation (palm trees), landscape.



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# GEOMA Biodiversity – Field Data

- **Field Work:** (23 researchers) birds, fishes, insects (bee, butterfly), arthropods (spiders), mammals, lizards, vegetation (palm trees), landscape.

- Several students, thesis and papers
- Almost all \$\$ for the component
- 3 points sampled – Modeling??
- How to “extrapolate” point data (plots) for some region?
- Environmental variables could be collected at regular temporal and/or spatial base sensors (light, moisture, canopy cover, etc.) ?



# Field Work - Existed data - Plots (permanents)

http://www.icb.ufmg.br/big/peld/

Customize Links sil

Mission  
Research Themes  
Events  
E-Mail  
Partners:

**TROPICAL WET FOREST  
(Manaus, Amazonas)**

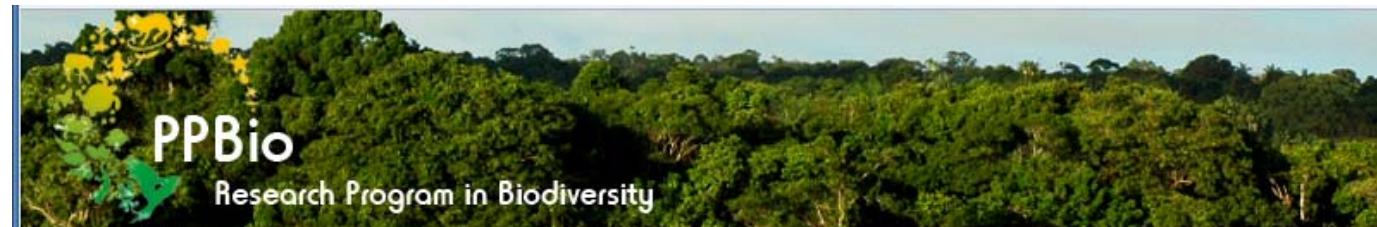
Location: 02° 30' to 03° 05S; 60° 00' to 60° 11' W

Community types (Total area = 35,000 ha)  
Tropical Wet Forest  
Forest Fragments  
Pastures  
Secondary Forests

Coordinator  
Flávio Jesus Luizão  
E-mail: [fluizao@inpa.gov.br](mailto:fluizao@inpa.gov.br)  
Phone: (0xx92) 643-1911 - 644-2930  
Fax : 643-1909

Help

\* To see site abstract pass the mouse through the numbers  
\* For more information Click on the number



português/language | ppbio english | inventories | collections | t. projects

você está aqui: página inicial > metadata and data

#### navegação

[Página Inicial](#)

About the Program

Biological Collections

Biological Inventories

Thematic Projects

International PPBio

Regional Hubs

Research Sites

Identification Guides

[Metadata and Data](#)

Publications

Get in Touch

#### acessar

Usuário

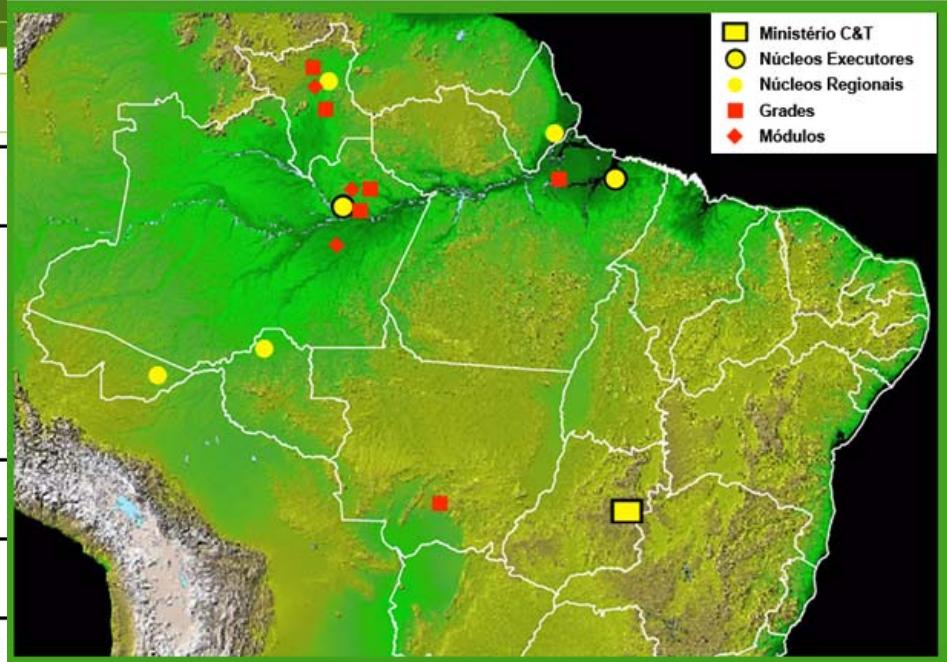
Senha

[acessar](#)

[Esqueceu sua senha?](#)

## Information - Metadata and Data

Hubs	Research Sites
<a href="#">Amazonas</a>	<a href="#">Modules BR-319</a> <a href="#">BDFFP Reserve</a> <a href="#">Uatumã Biological Reserve</a> <a href="#">Reserve Ducke</a>
<a href="#">Australasia</a>	<a href="#">Brisbane</a>
<a href="#">North Pantanal</a>	<a href="#">Pirizal</a>
<a href="#">South Pantanal</a>	Fazenda Experimental Nhumirim
<a href="#">Pará</a>	<a href="#">Caxiuanã National Forest</a>
<a href="#">Roraima</a>	<a href="#">Áqua Boa - EMBRAPA RR</a> <a href="#">Cauamé - UFRR</a> <a href="#">Maracá Ecological Station</a> <a href="#">Viriá National Park</a>



[MCT](#) -- [NEX - Manaus \(INPA\)](#) -- [NEX - Belém \(MPEG\)](#) -- [NR - Acre](#) -- [NR - Amapá](#) -- [NR - Rondônia](#) -- [NR - Roraima](#) -- [Áqua Boa-UFRR](#) -- [BR-319](#) -- [Cauamé-EMBRAPA](#) -- [ESEC Maracá](#) -- [FLONA Caxiuanã](#) -- [Pantanal Norte](#) -- [Pantanal Sul](#) -- [PARNA Viruá](#) -- [PDBFF](#) -- [REBIO Uatumã](#) -- [Reserva Ducke](#)



| [Project](#) | [Partners](#) | [Field Sites](#) | [Training](#) | [Publications](#) | [Manuals](#) | [Contact](#) | [Links](#) |

## RAINFOR News

**March 2009**  
*Science paper  
"Drought  
Sensitivity of the  
Amazon  
Rainforest"  
Press release*

**November 2008**  
*Oeco "Amazônia  
invade a  
academia  
britânica"*

**September 2008**  
*NERC Features &  
special reports  
"Amazonia:  
pathways to  
policy-makers"*

**August 2008**  
*Los Amigos forest  
ecology training  
workshop*

# Amazon Forest Inventory Network

## Welcome to the RAINFOR Website

The Amazon Forest Inventory Network is an international network that has been established to understand the biomass and dynamics of Amazonian forests. Since 2000 we have established a systematic framework for long-term monitoring of this region, which holds more biodiversity, water, and vegetation carbon, than any other region of the planet. RAINFOR has worked step-by-step, including partners across the nations of Amazon, taking account of the potentially strong modulating role of environmental variables like soil nutrition, and the need to help develop a new generation of Amazon ecologists. RAINFOR is currently supported by the Andes and Amazon Initiative of the Gordon and Betty Moore Foundation.



[English](#) | [Español](#) | [Português](#)



# Biodiversity data – Collections

THE NEW YORK BOTANICAL GARDEN

International Plant Science Center  
The C. V. Starr Virtual Herbarium

Science Home ... Virtual Herbarium ... Virtual Herbarium

A C. V. Starr Virtual Herbarium Sampler

History of the Virtual Herbarium

A Summary of Databasing Projects

Collectors Represented in the Herbarium

A Guide for Use of The C. V. Starr Virtual Herbarium

Treatment of Endangered and Threatened Plant Species

Specimen Showcases



[Home](#) [Names](#) [Specimens](#) [References](#) [Images](#) [More▼](#)

[MOBOT Sign In | Login](#)

TROPICOS was originally created for internal research but has since been made available to the world's scientific community. All of the nomenclatural, bibliographic, and specimen data accumulated in MBG's electronic databases during the past 25 years are publicly available here. This system has over one million scientific names, 3.4 million specimen records, 111,000 bibliographic citations, and more than 70,000 images of living plants and specimens.

Please continue to use the feedback link ([Send feedback](#)) at the bottom of the pages to submit suggestions, bug reports, and feature requests. We are not able to personally respond to all of the messages, but we do our best.

[Search](#) [Search Exact](#)



Caption: Flowers  
Name: *Passiflora nitida* Kunth  
Specimen: Solomon, James Clinton - 3434

## Additional Information

We are interested in comments from users and suggestions for additional features and functions.

[links](#)  
[arch](#)  
[nicus digital library](#)  
[logical Research](#)  
[as](#)

For more information, please contact:

Barbara Thiers  
Herbarium Director  
[bthiers@nybg.org](mailto:bthiers@nybg.org)  
[About Barbara Thiers](#)

en. 01 Oct 2008 <<http://www.tropicos.org>>.  
evard - Saint Louis, Missouri 63110  
[Basic Tropicos](#)

[The New York Botanical Garden's new Digital Imaging Center](#)

[Policy regarding the Use of The C. V. Starr Virtual Herbarium Plant Images](#)

[Digital Plant Research Center](#)

## New Projects

[Catalog of Vascular Plant Species of Central and Northeastern Brazil](#)  
[The Flora Boreo-Andina Digital Herbarium and Library](#)

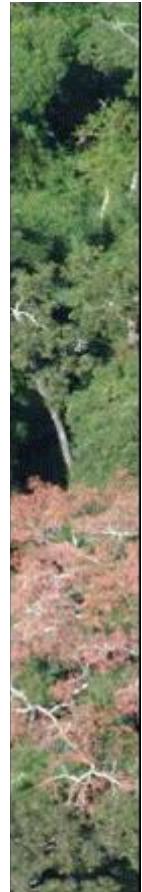
## Electronic Floras and Monographs

[The Lecythidaceae Pages](#)  
[Plants and Lichens of Saba](#)  
[Flowering Plants of the Osa Peninsula, Costa Rica](#)  
[French Guianan e-Flora Project](#)

## Online Specimen Catalogs

## Comprehensive Catalogs

[Search All Catalogs](#)



# Biovidersity data

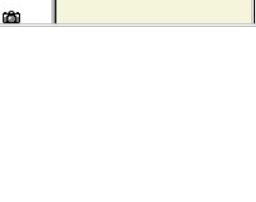
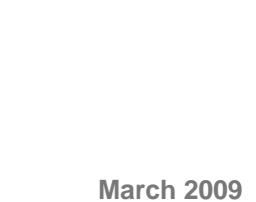
**PPBio** Programa de Pesquisa em Biodiversidade  
Brazilian Biodiversity Research Programme

**INPA** INSTITUTO NACIONAL DE PESQUISAS DA AMAZÔNIA

**O Herbario INPA**

Home Buscar Recursos Online Groups Login Idioma Portuguese

**Resultados de Pesquisa de Coleções**

Tag	Ordenar	Calcular	Baixar	Saved Records: [0 items]	Save Tagged	View Saved	parkia	Busca de novo	mais...				
<input type="checkbox"/>	Sasaki, D	1708	Leguminosae	Parkia pendula	Brasil	Mato Grosso	Novo Mundo	01/08/2007	- 9,440000 - 55,771687	222987	Sasaki, D.	2007	
<input type="checkbox"/>	Arévalo, MF	576	Leguminosae-mim	Parkia	Brasil	Amazonas	Manaus	12/08/1994	0,000000 0,000000	183216		0	
<input type="checkbox"/>	Barbosa, M	LPP0312	Leguminosae-mim	Parkia	Brasil	Pará	Santarém	15/10/1975	0,000000 0,000000	60773		0	
<input type="checkbox"/>	Dick, C	182	Leguminosae-mim	Parkia	Brasil	Amazonas	Manaus	27/08/1992	- 2,416687 - 59,850000	175248		0	
<input type="checkbox"/>	Ferreira, AJC	3209.2018	Leguminosae-mim	Parkia	Brasil	Amazonas	Manaus	??/?/?/??	0,000000 0,000000	172158		0	
<input type="checkbox"/>	Ferreira, CAC	6734	Leguminosae-mim	Parkia	Brasil	Acre	Brasiléia	27/05/1991	- 10,850000 - 65,800000	173850		0	
<input type="checkbox"/>	Faria, E	6200	Leguminosae	Pediasia	Brasil	Mato Grosso	Alto Paranaíba	29/09/1995		137925		0	

**Museu Paraense Emílio Goeldi**

**Herbarium MG**

**Busca de Tipos & Coleção Geral**

1 ocorrência(s) encontrada(s) para Gênero = 'Tabebuia'

 Tabebuia pilosa A. Gentry - [41673]  
Família: Bignoniaceae  
Isotypos

March 2009



# Species distribution data

## ■ Herbarium



- Classification system
- Family, gender, specie
- Lockers

### Excicata

- Herborization
- Species distribution – time and space
- Flora from preserved and altered areas
- Taxonomy and phylogeny studies
- Precise identification
- Associated Collections





# Species distribution data

- Labels – information – geo-referenced
- Type

GIScience for Dynamic Environmental Se

● Cidades  
● Cidades/comarcas  
● Comarcas  
● Aldeias

Ponteiro 15°52'06.06"S 52°12'03.17"W elev 321 m

Fluxo 100%

Image © 2007 DigitalGlobe  
© 2007 MapLink/TeleAtlas

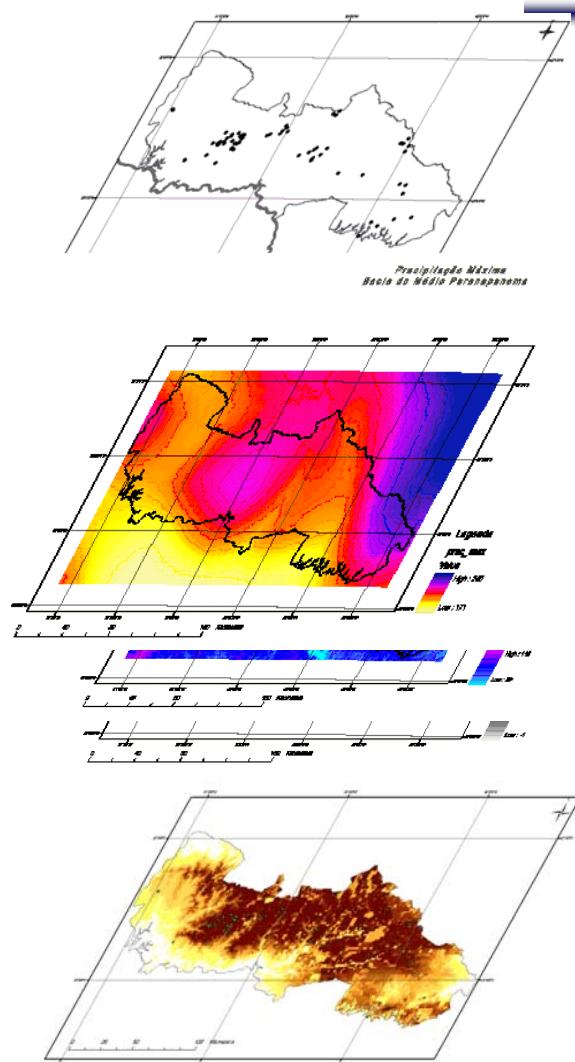
Google™

Altitude do ponto de visão 1.35 km

PT 11:06



# The Ecological Niche modeling process



Algorithm

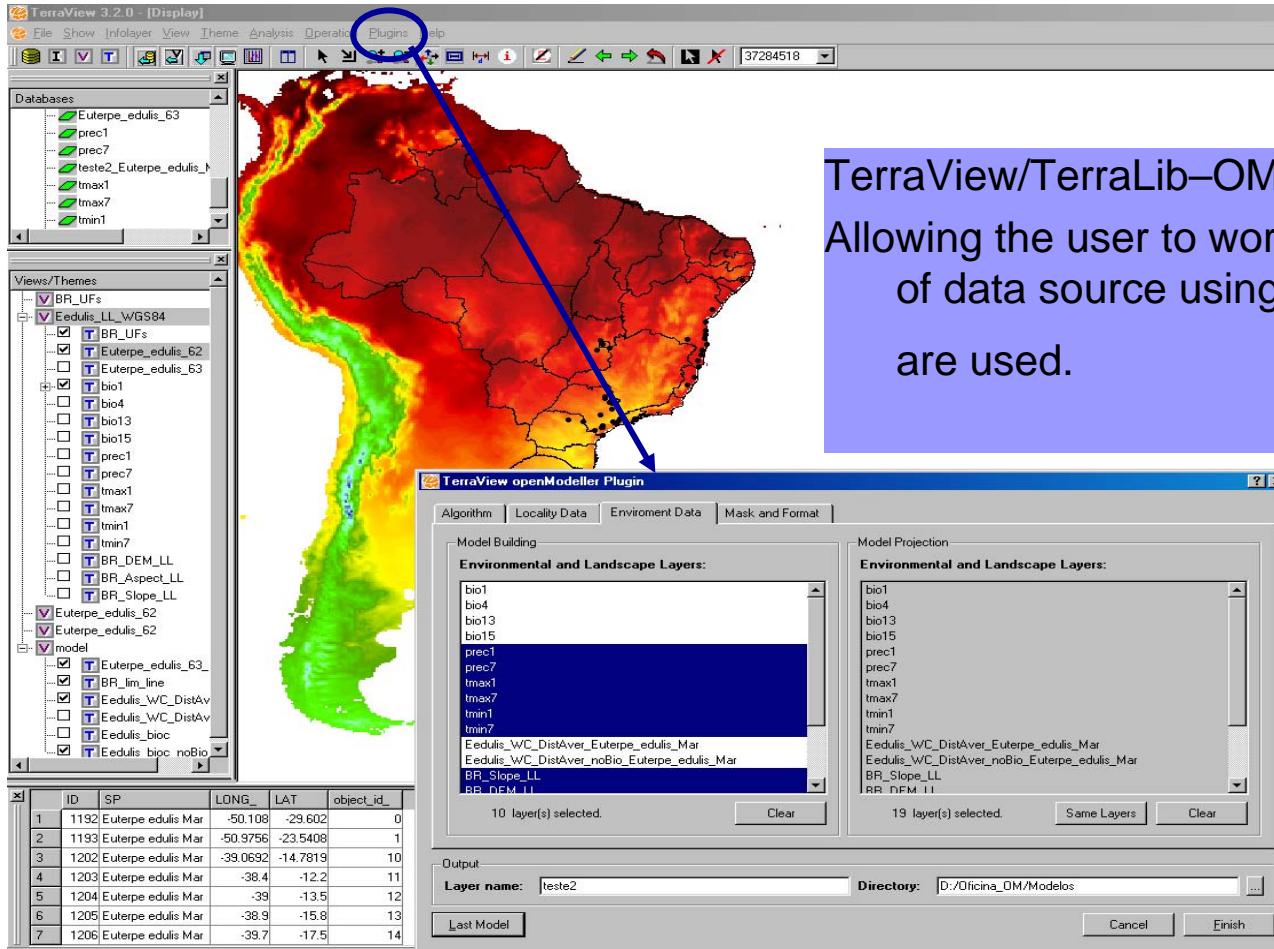
specimen collection data  
locality data

environmental variables  
temperature  
precipitation  
topography

species distribution model  
**Distributional Prediction**



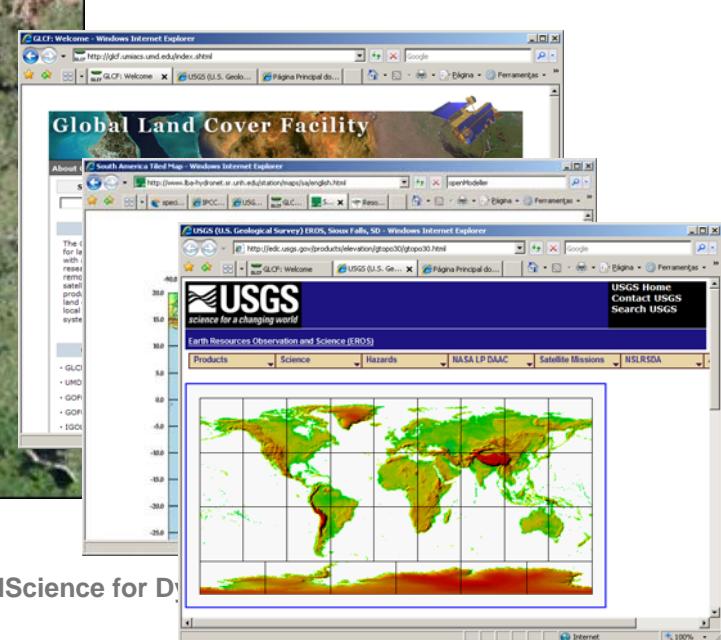
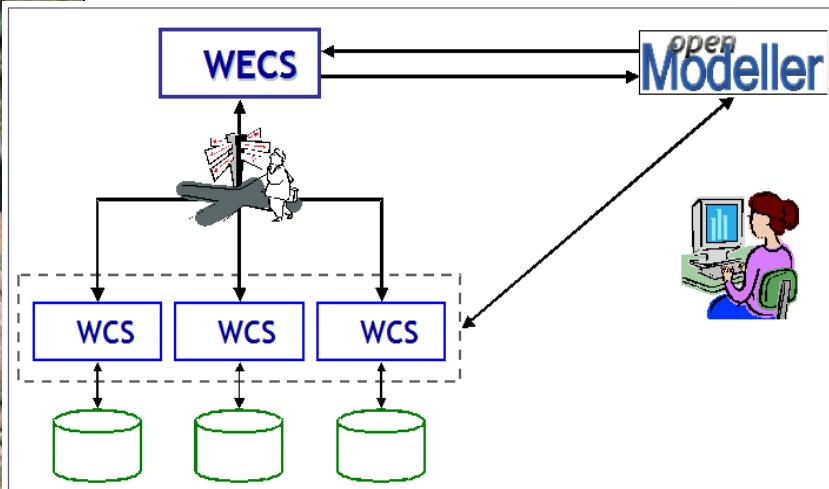
# GIS integration – loose coupling



TerraView/TerraLib-OM Plugin:  
Allowing the user to work with the concept  
of data source using the tools that they  
are used.



# Environmental Data



GIScience for D...

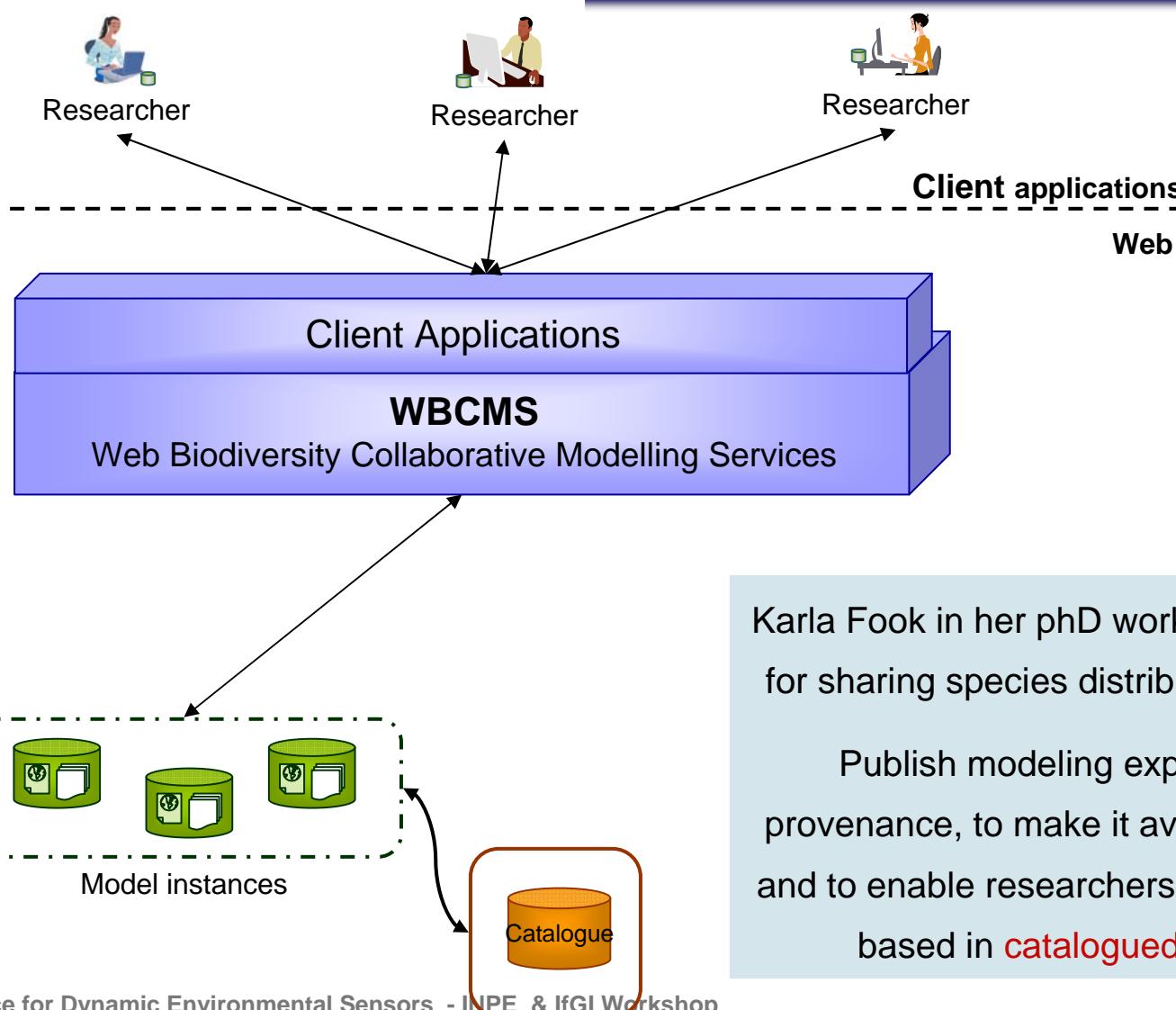
Alexandre Jardim is a Master student, working on creating a *Web Environmental Catalogue Service*:

- an ontology for environmental data for the domain of SDM
- a WS that identifies data sources exporting data as WCS; makes a mapping between its metadata and the SDM ontology
- a client interface to the WECS and openModeller
- evaluate the WCS specification for the SDM domain

GI Workshop



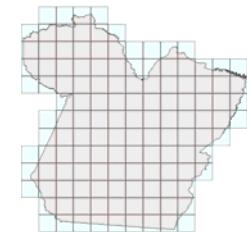
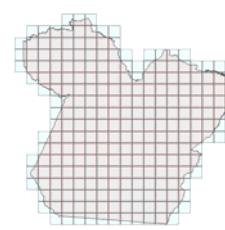
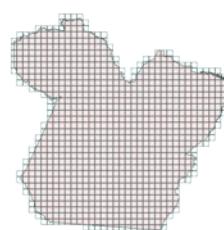
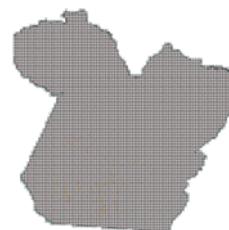
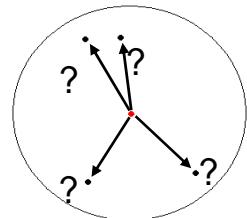
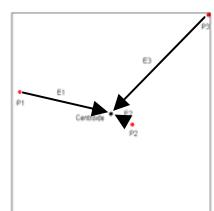
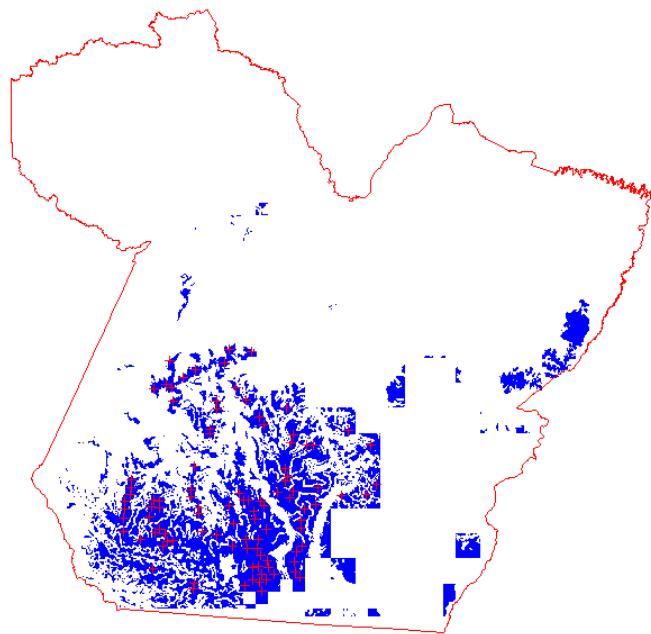
# Sharing modeling experience





# Model Sensibility to input data positioning errors

- Fundamental Niche simulation: Non-restrict distribution, continuous, and typical from Amazon
  - 100 “GPS” points
- Positioning error simulation
  - Cell centroid
  - Polar coordinates
  - Errors up to 10 km; 0,25°; 0,5°; 1°



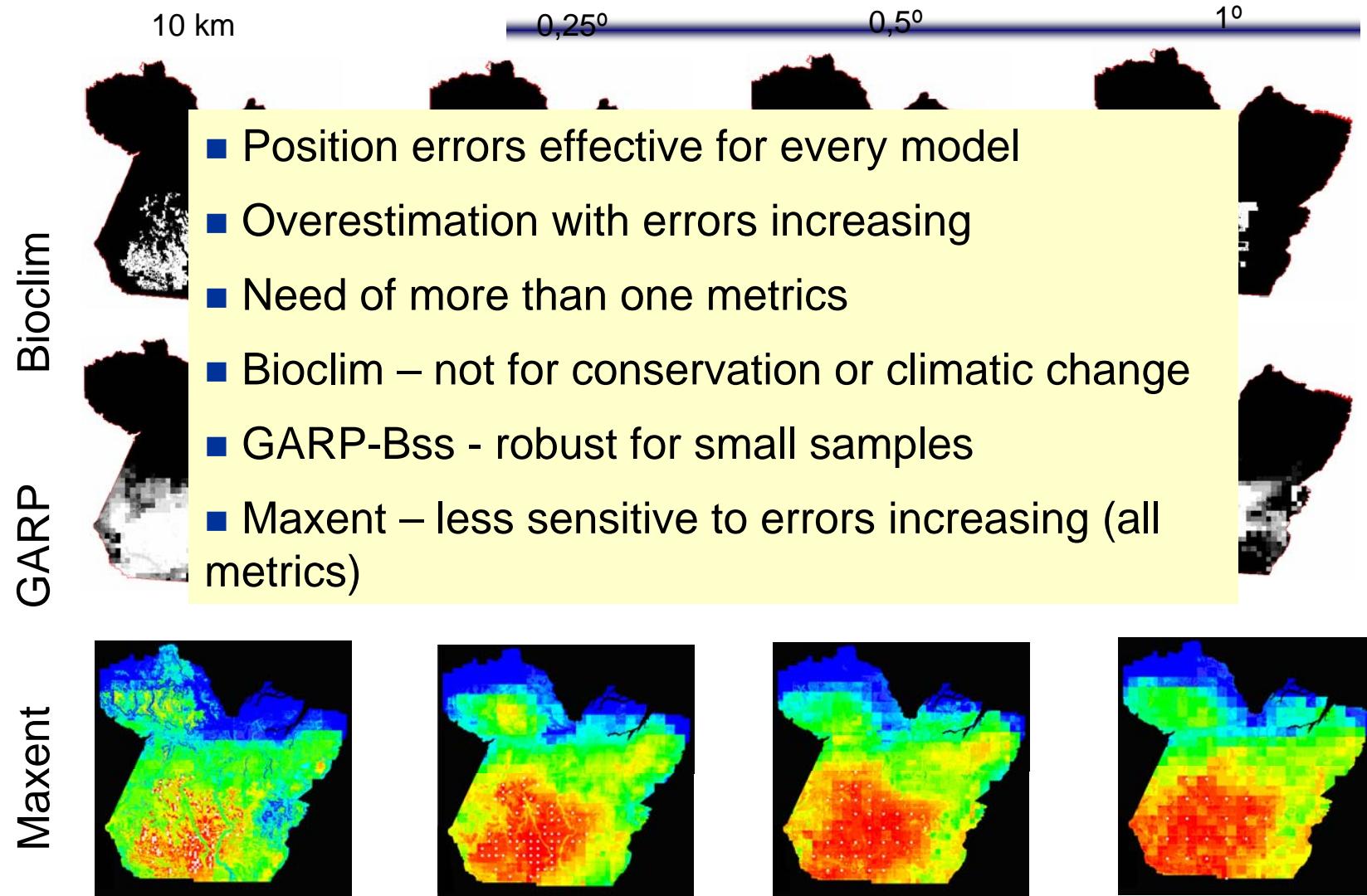
Fábio Iwashita – MsC

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March 2009

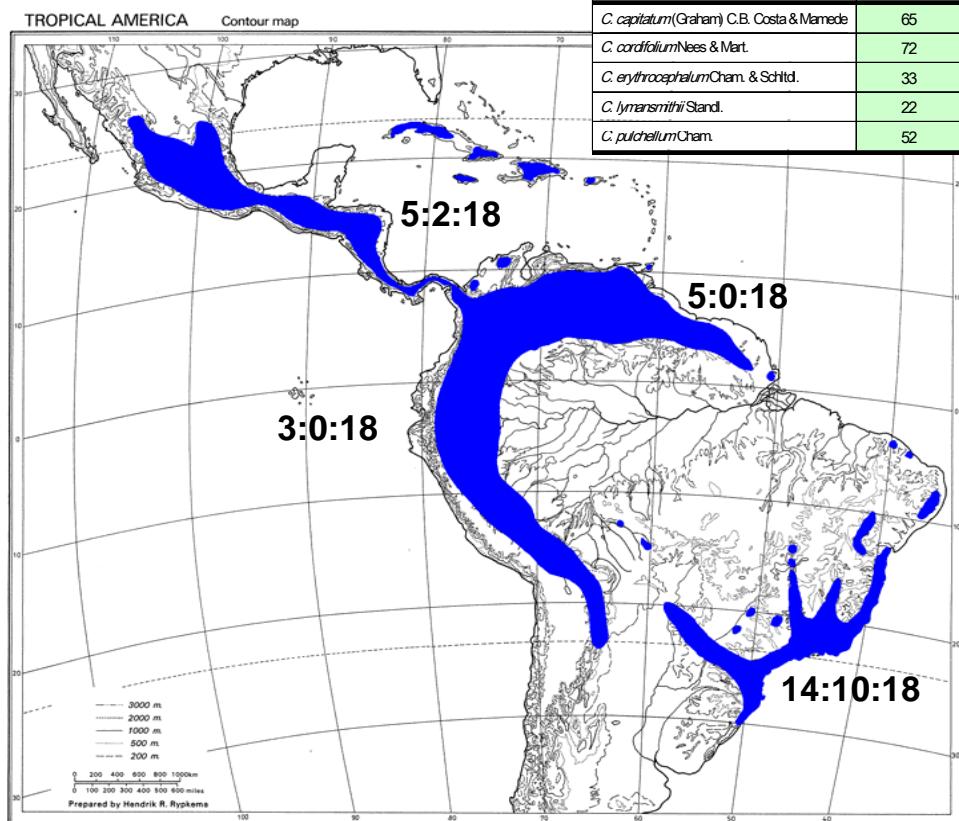


## Model Sensibility to input data positioning errors



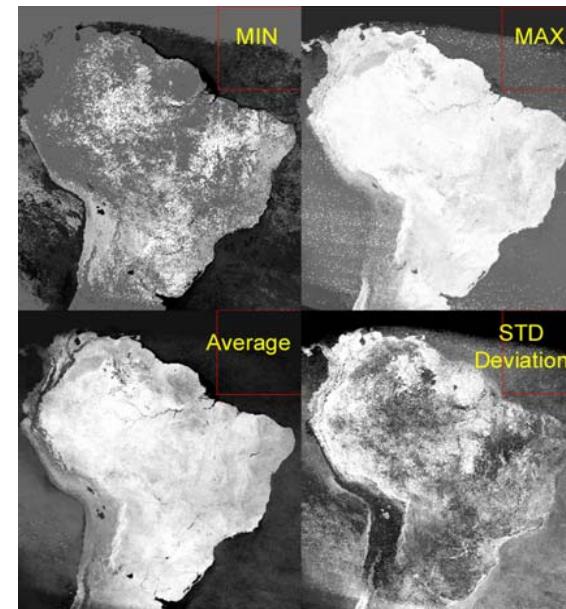


# RS and Species Distribution Modeling



Studied species	Training points		Evaluation points	
	Presence	Presence	Presence	Absence
<i>C. capitatum</i> (Graham) C.B. Costa & Mamede	65		15	15
<i>C. cordifolium</i> Nees & Mart.	72		16	16
<i>C. erythrocephalum</i> Cham. & Schld.	33		8	8
<i>C. lyman-smithii</i> Standl.	22		5	5
<i>C. pulchellum</i> Cham.	52		12	12

Nature	Variables	Resolution (Degree)	Source	Date
Clima	Maximum temperature Minimum temperature Average temperature Precipitation Bioclimatic variables	0.25	Weather stations WorldClim Project	Average monthly climate data from 1950-2000 series
Relieve	Elevation Slope Aspect	0.0089	SRTM NASA	2000 imagery
Vegetation RS	Maximum NDVI Minimum NDVI Average NDVI Standard deviation NDVI	1.0	AVHRR-17 NASA/CPTEC	Fortnightly mosaic 2005





# RS and Species Distribution Modeling



*C. lanceolatum*



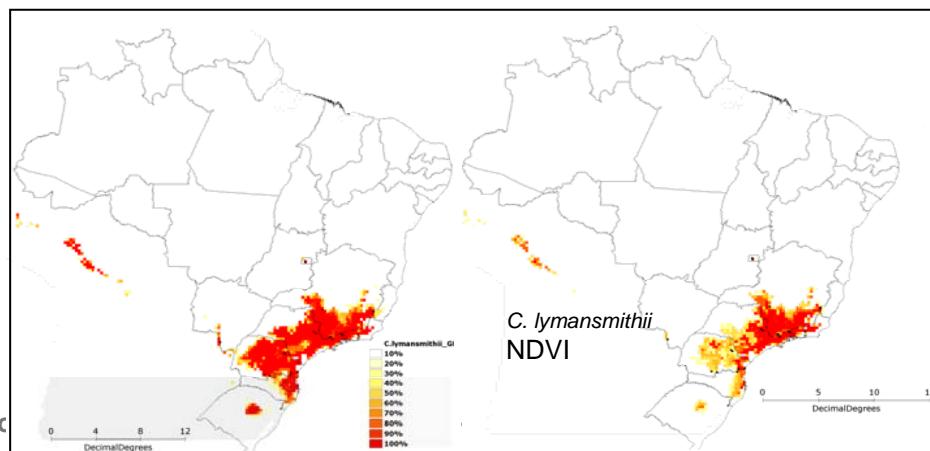
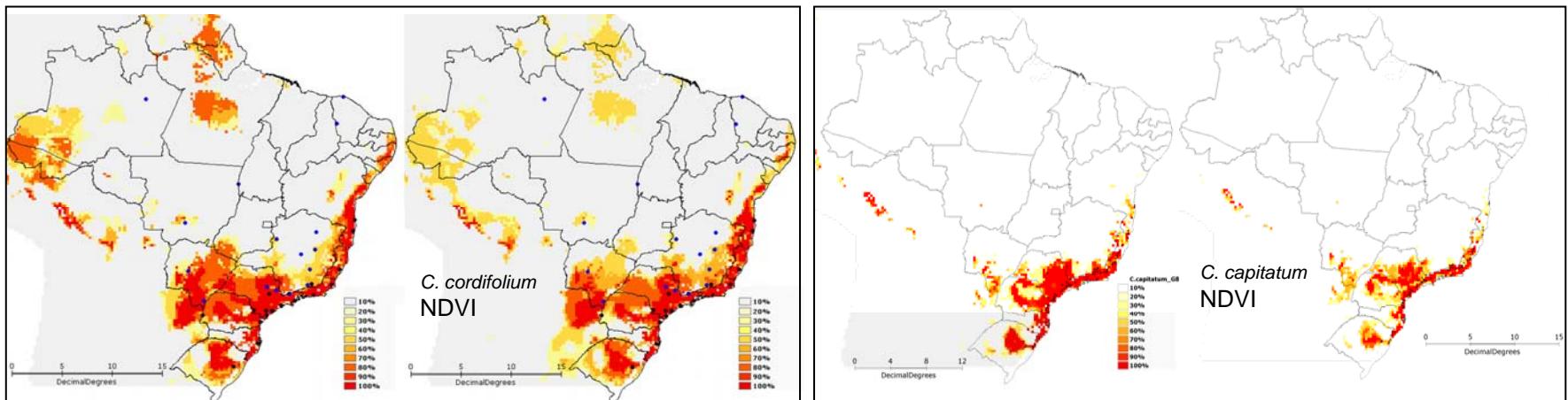
*C. lanceolatum*



*C. hasslerianum*



*C. erythrocephalum*  
Foto: C.B. Costa

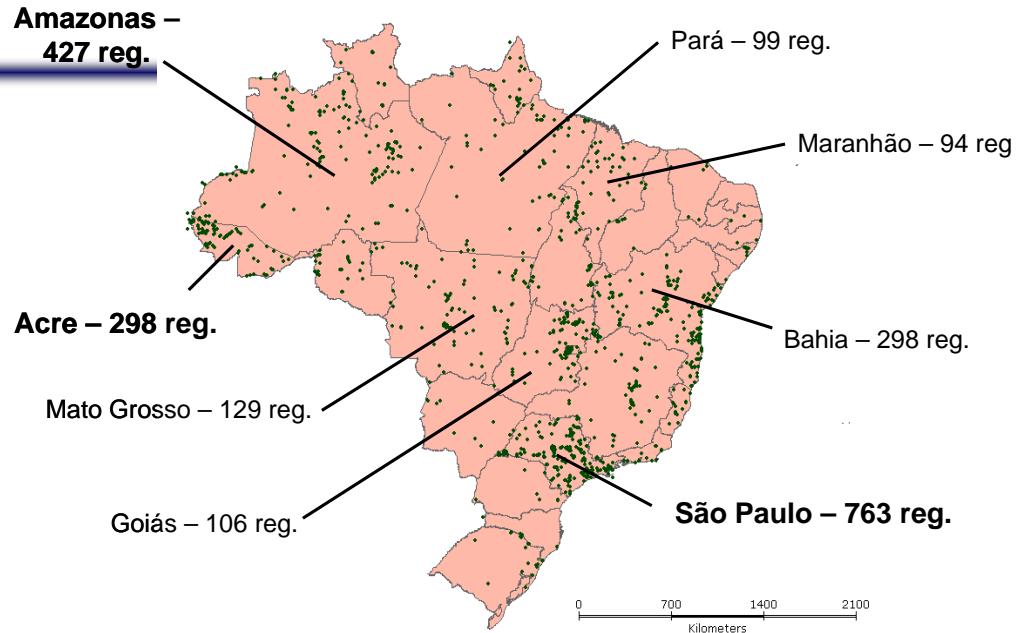
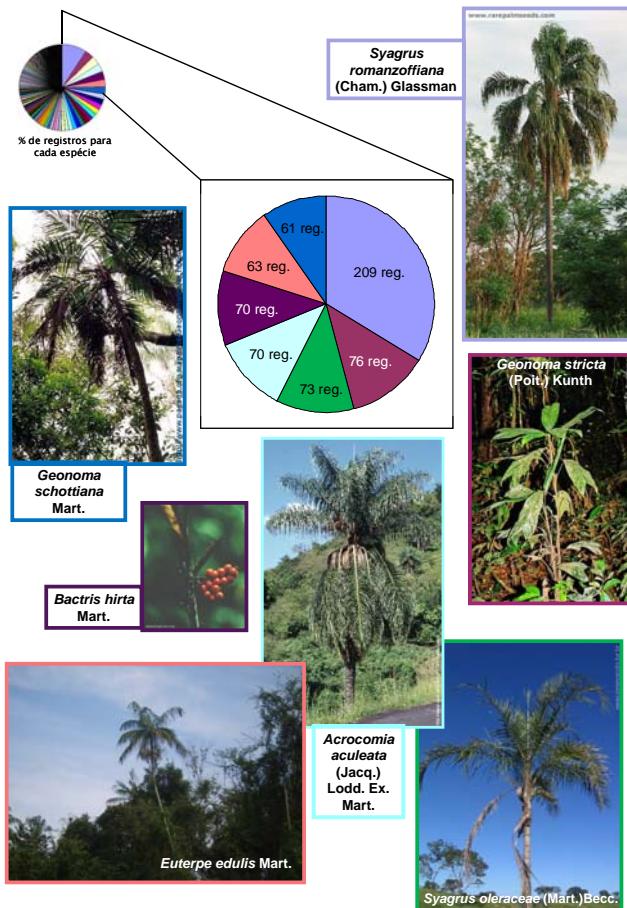


Species	Kappa		Mann-Whitney (U Statistic)			
	no NDVI	NDVI	no NDVI	NDVI	Critical value ( $\alpha = 5\%$ )	N
<i>C. lyman-smithii</i>	0.8	0.8	7.5	7.5	2	5
<i>C. erythrocephalum</i>	0.5	0.5	21.5	22.5	12	8
<i>C. pulchellum</i>	0.83	0.83	<b>16*</b>	<b>15*</b>	37	12
<i>C. capitatum</i>	0.6	0.53	<b>55*</b>	<b>48.5*</b>	64	15
<i>C. cordifolium</i>	0.75	0.56	<b>46.5*</b>	<b>36*</b>	75	16



# Species Distribution Modeling

- Data Base – Arecaceae
- RS data



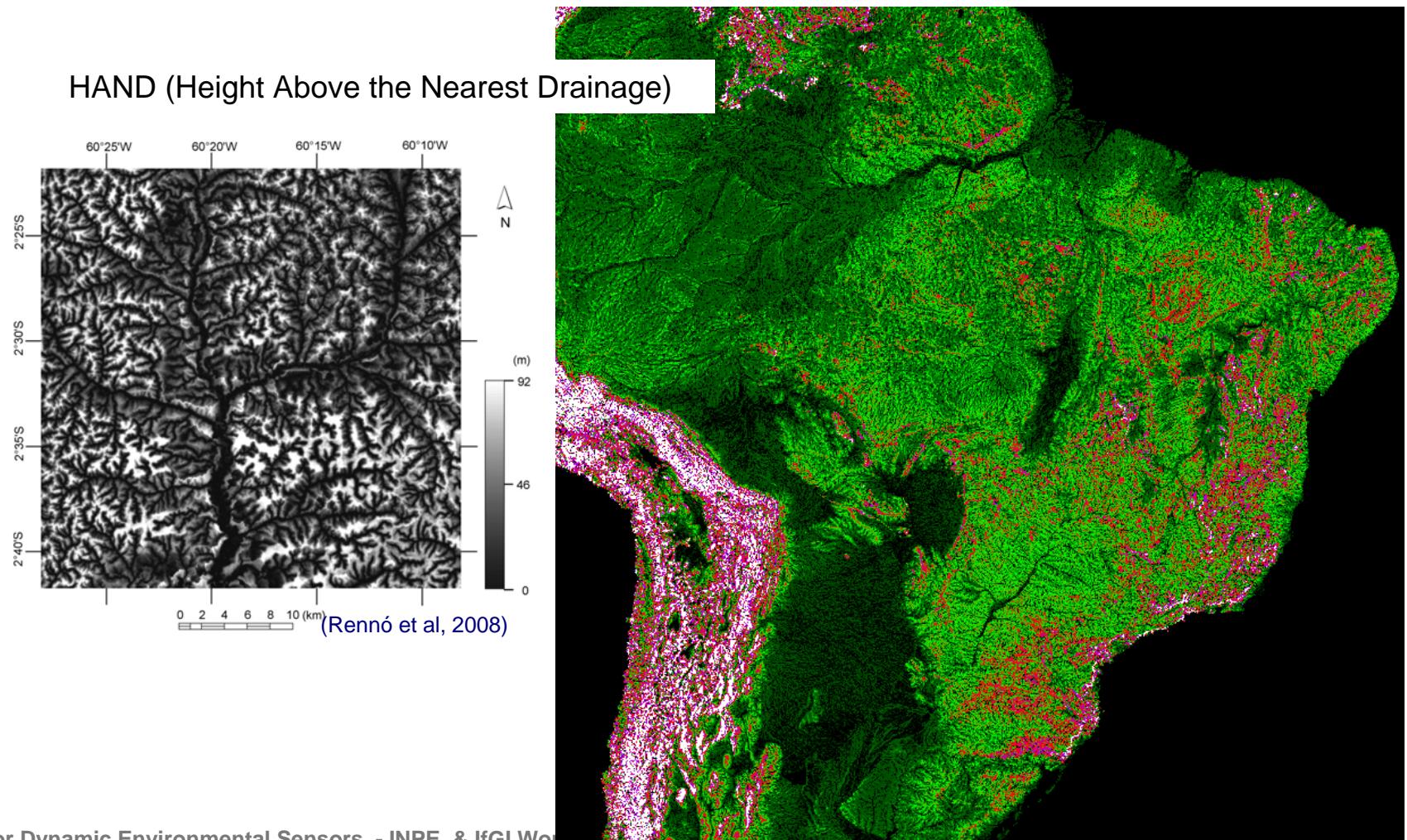
- ✓ 9524 records, with 3360 records with geographical coordinates;
- ✓ 2637 records after corrections (errors: sea coordinates, duplications, and taxonomy);
- ✓ Richer genders: Bactris (38 spp.), Geonoma (37), Syagrus (25), Attalea (22) e Astrocaryum (13).

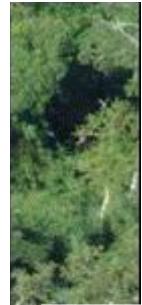
(Arasato, 2009)



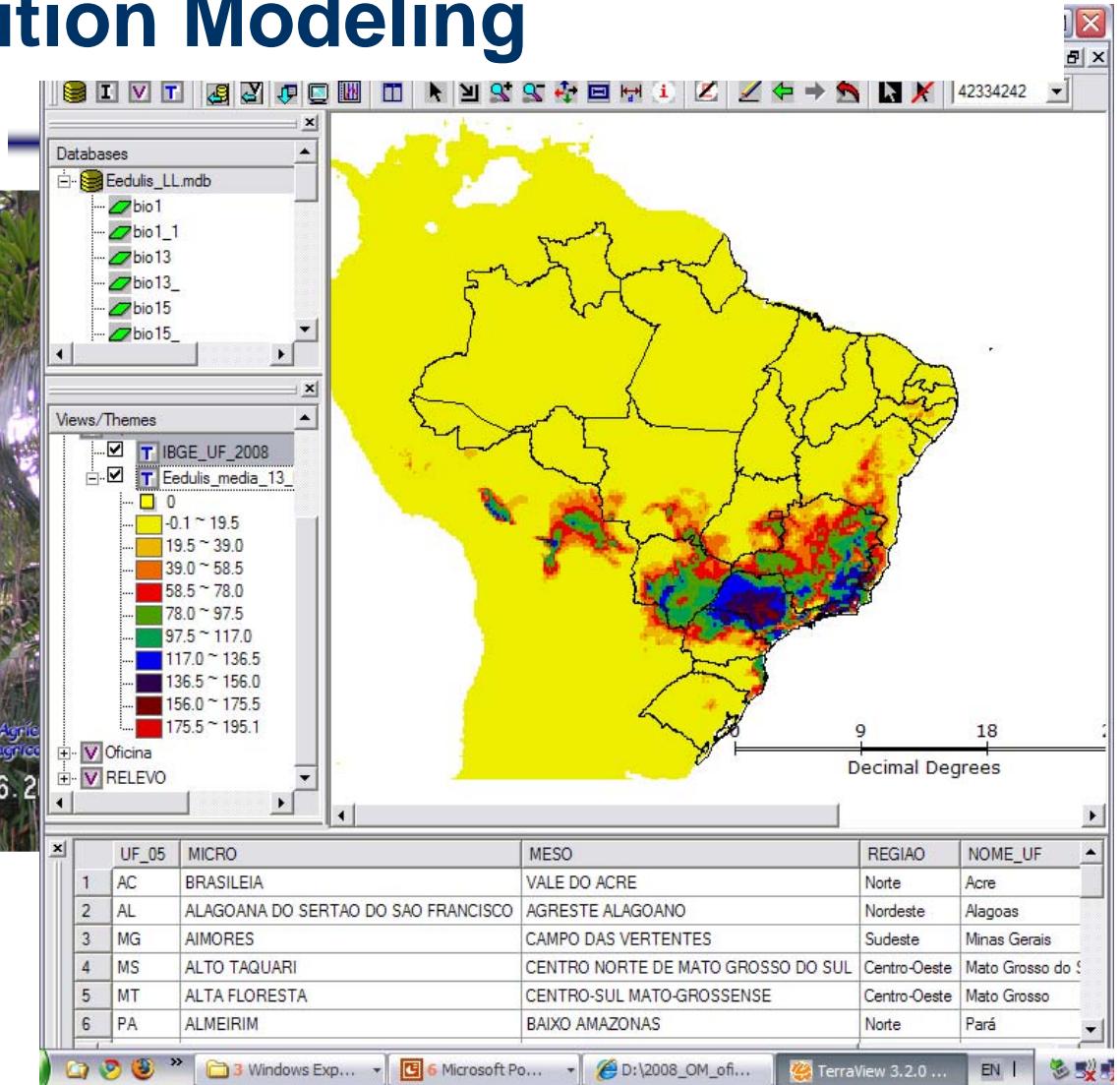
# RS and Species Distribution Modeling

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# Species Distribution Modeling



*Euterpe edulis*

Arasato (2009)



# Restrict Distribution

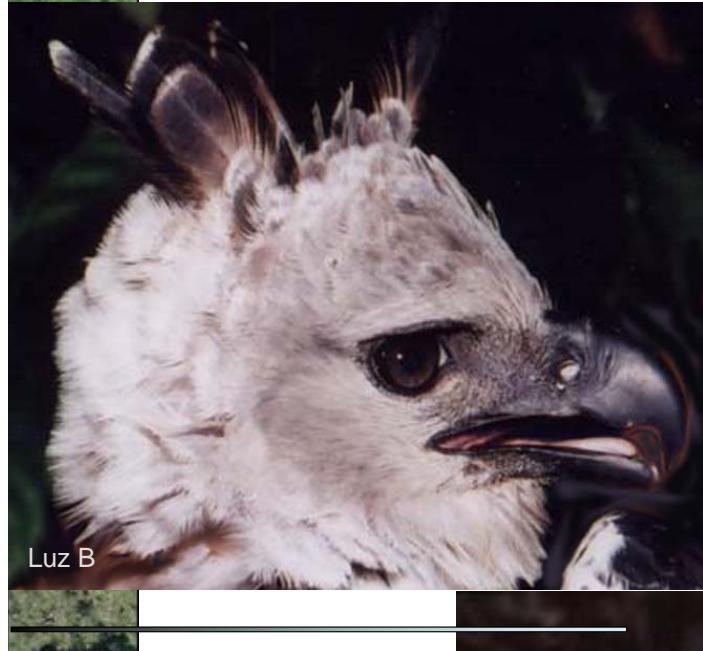


*Ortophytum sp*

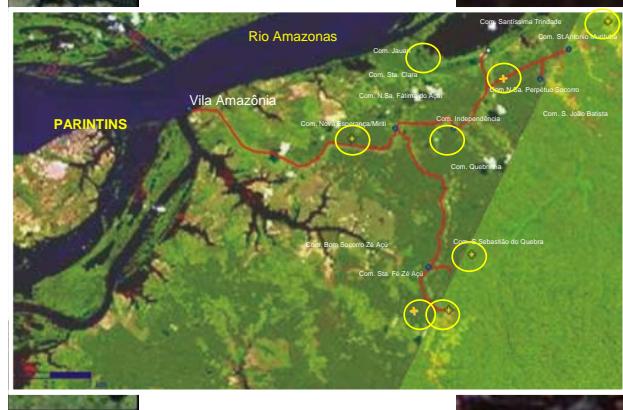




# Sensitive species



- Satellite monitoring
- Habitat definition

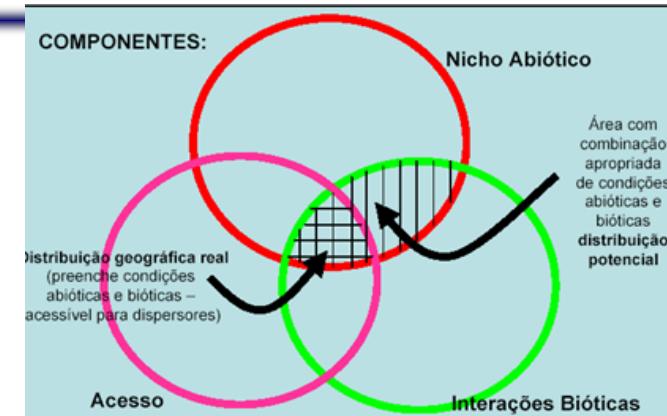


*Harpia harpyja*



# Species Distribution Modeling

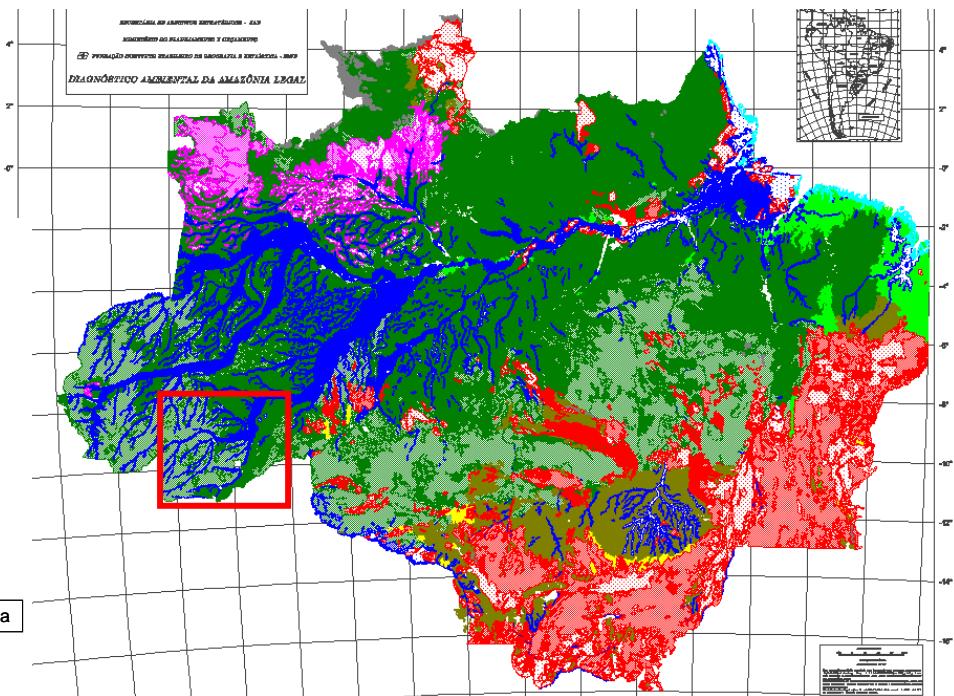
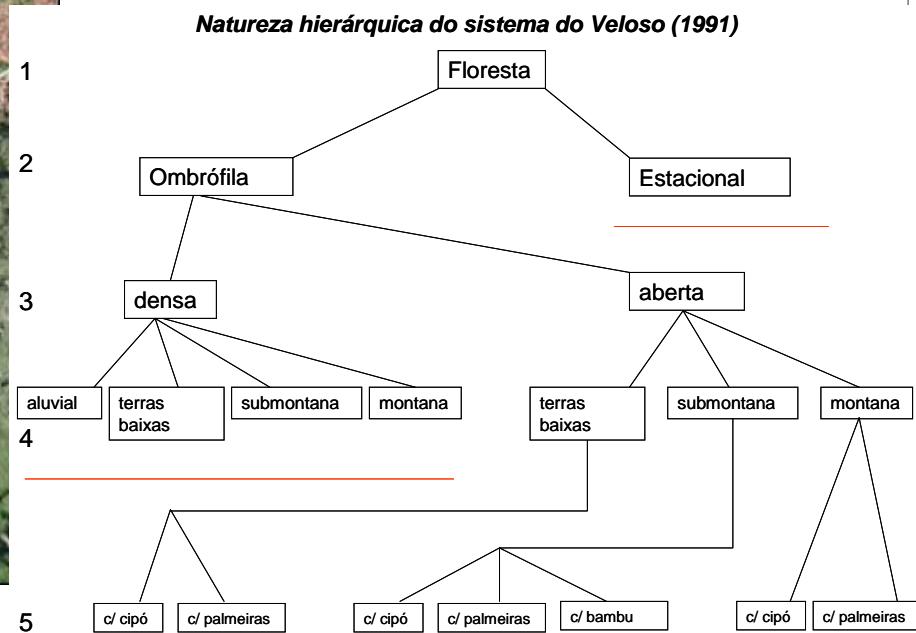
- Just geographical expression of part of “fundamental niche”
- Historical factors, genetic, biological interactions – not considered
- Biodiversity ? Based on Species (all of them?) How to integrate in space? In time?
- Community modeling ?





# Biodiversity Inferences

- Alternative data to understand biodiversity
  - Phyto-fisionogmy (vegetation types) as proxy
  - Ecorregions
  - Remote Sensing

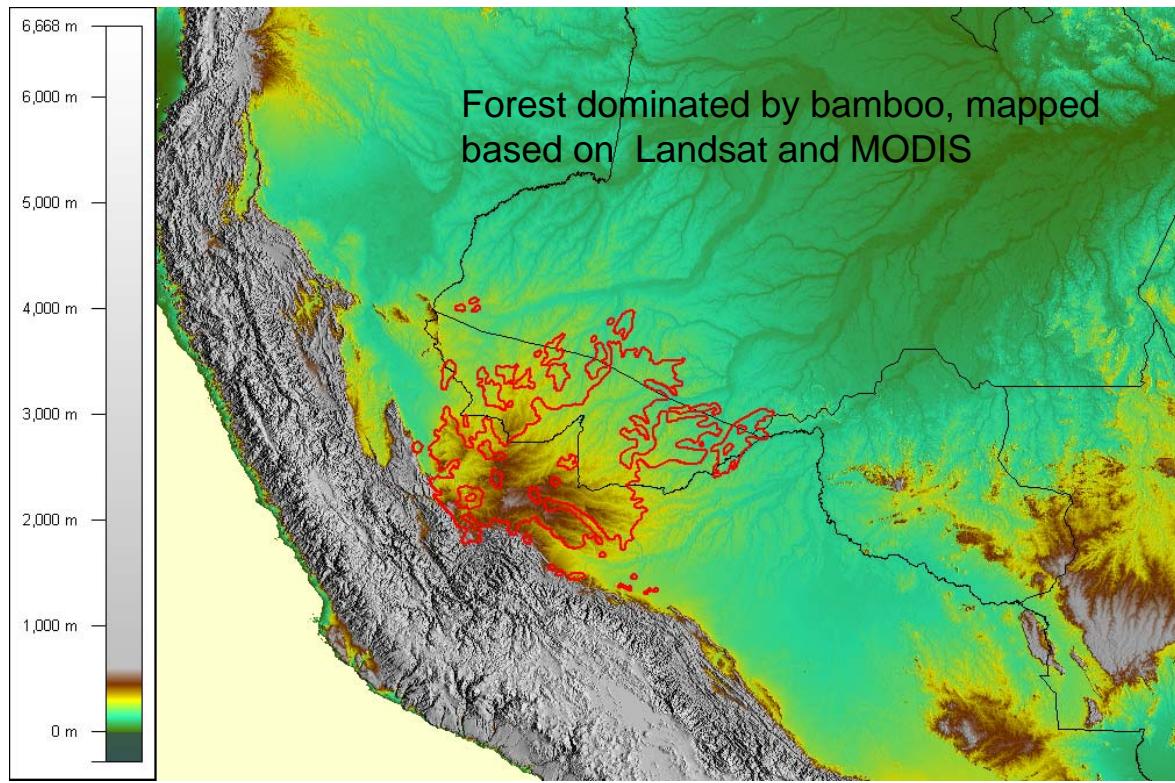




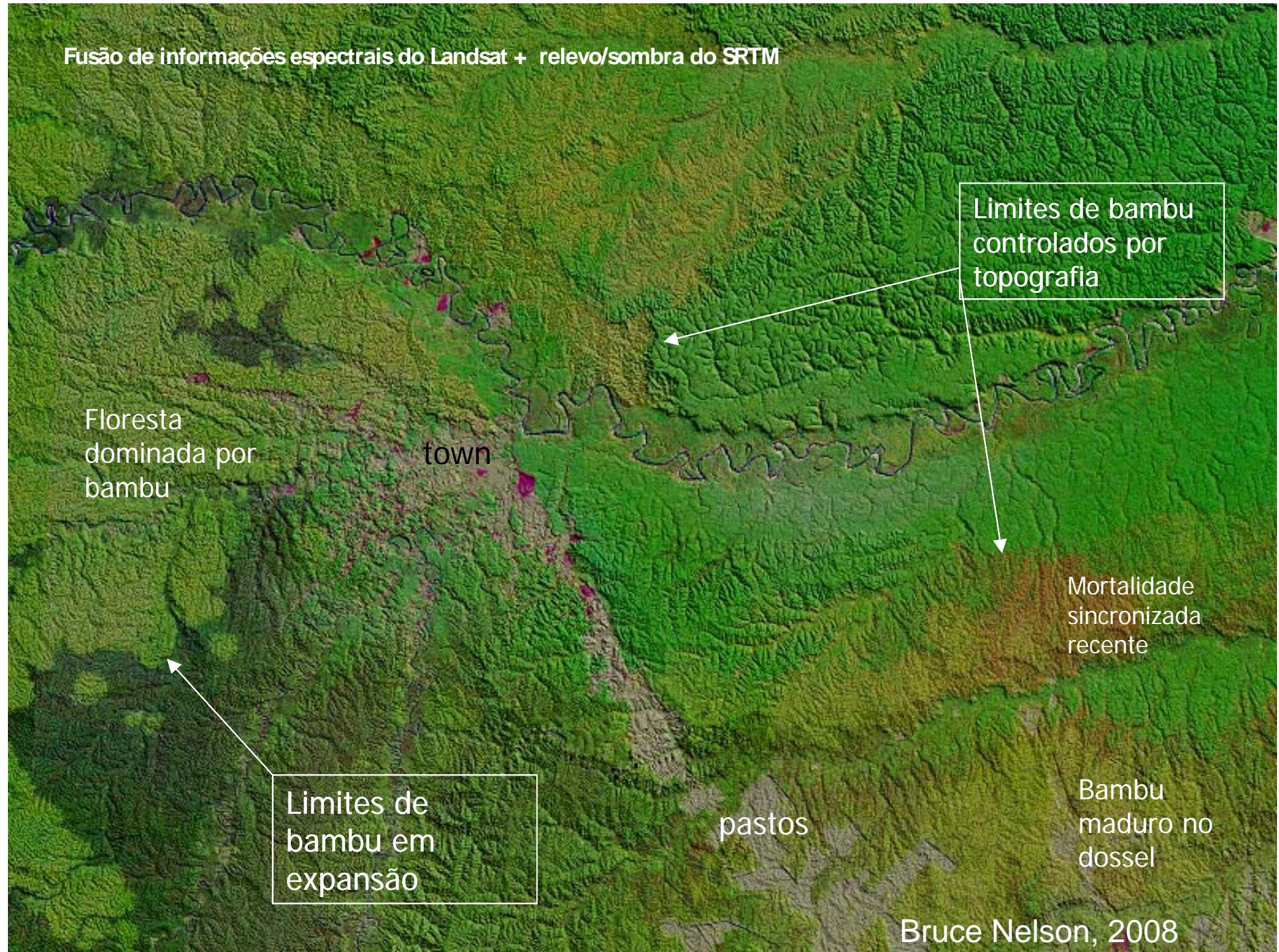
# Biodiversity Inferences

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- Alternative data to estimate biodiversity
  - Phyto-fisionogmy (vegetation types) as proxy



Bruce Nelson, 2008



# Três tipos de vegetação/solo detectados no sudoeste da Amazônia

Qual é o grau de dissimilaridade florística?



Bruce Nelson, 2008



# Biodiversity Inferences

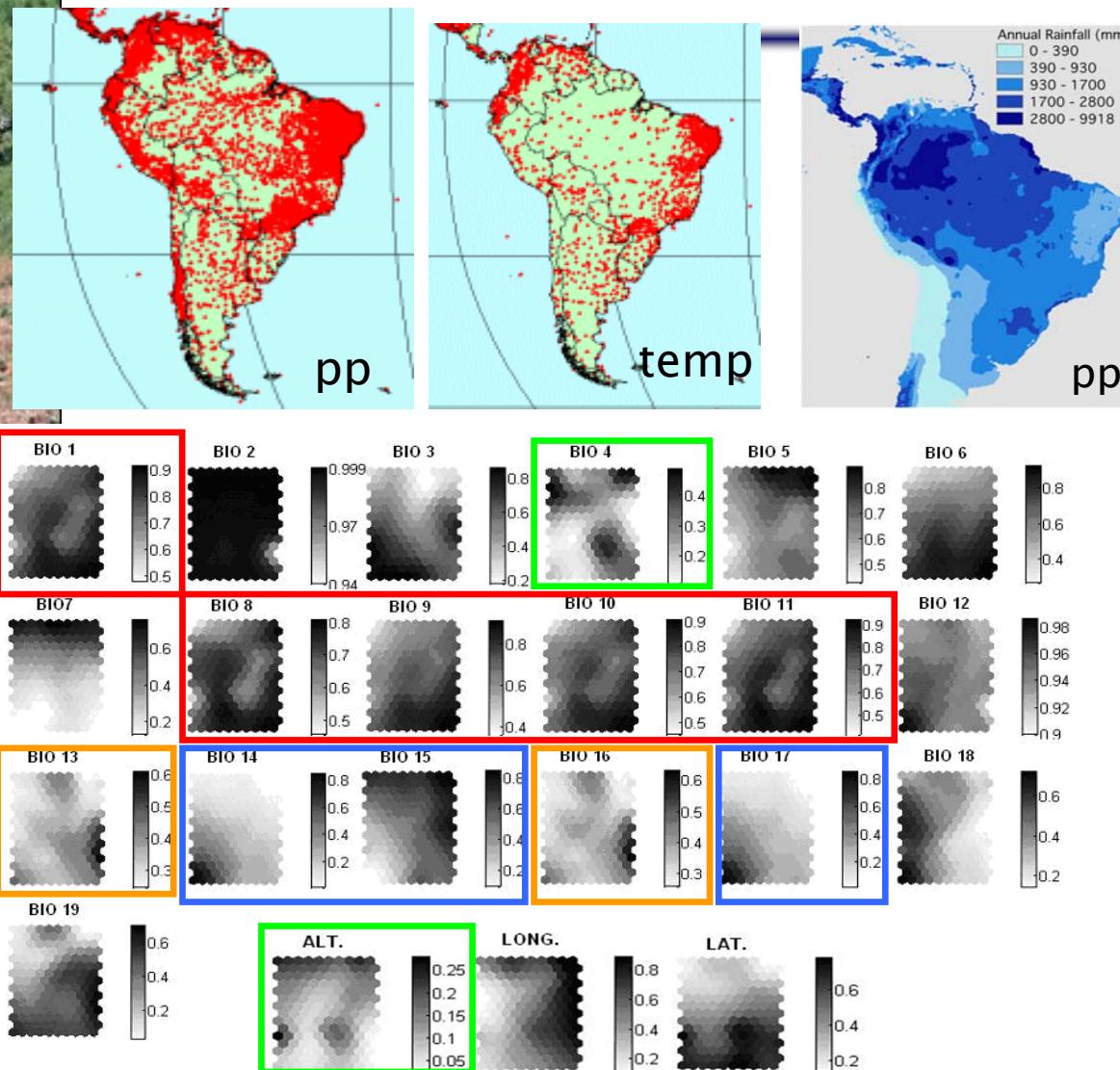
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- Alternative data to estimate biodiversity
  - Ecoregions

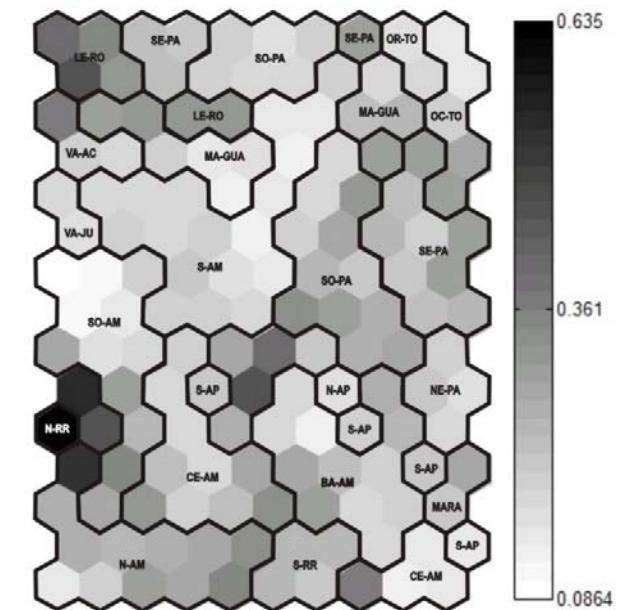


# Environmental Data Generation and Pré-processing

variables dependence



Dataset – HAND,  
Rivers Density,  
Radar image, clima,  
etc.





# Environmental data for Biodiversity Modeling

Ecoregions – Madeira-Purus, BR-319

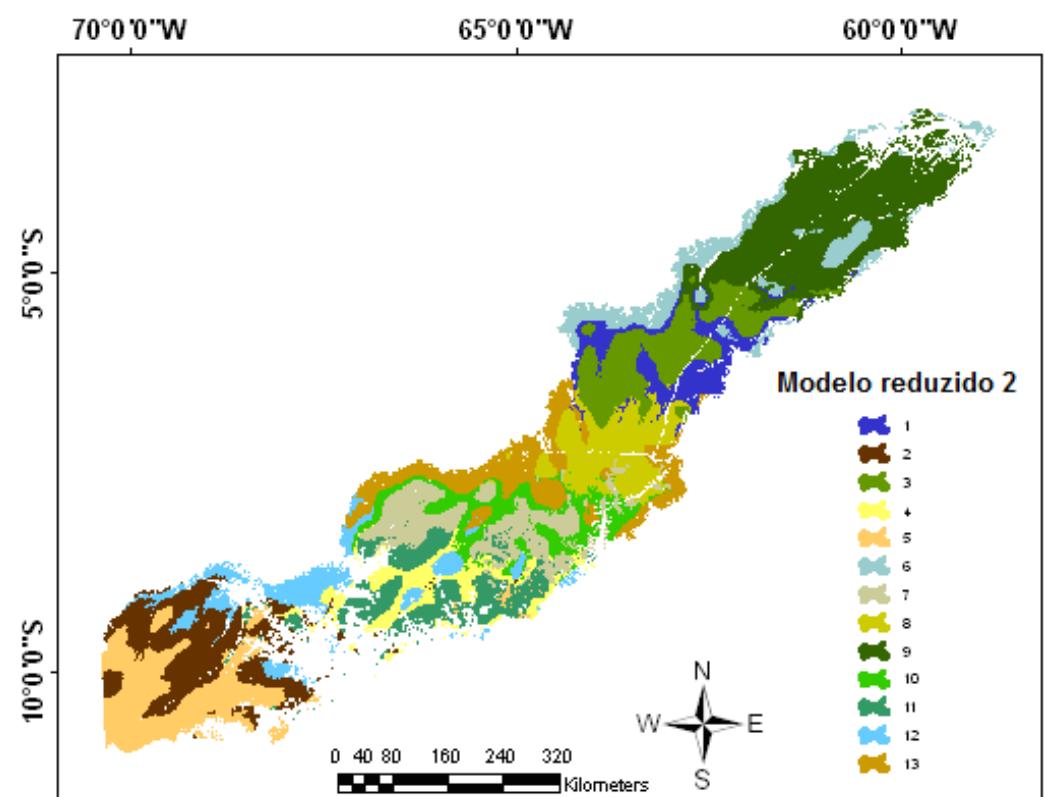
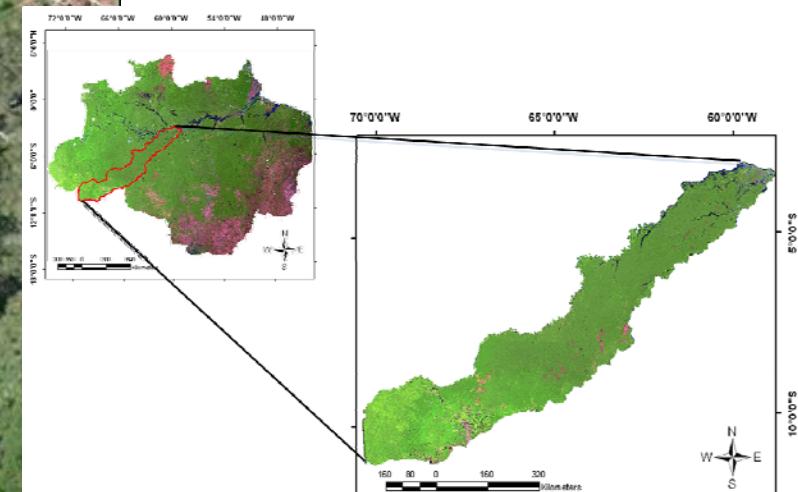
Self Organizing Mapping

Regional Scale

Self Organizing Mapping

21 Environmental variables

Clima, vegetation, soil, altitude,  
geographical distance, drainage  
density, slope and NDVI



Self Organizing Mapping

GIScience for Dynamic Environmental Sensors - INPE & IfGI Workshop

(Ximenes, 2008)  
March 2009

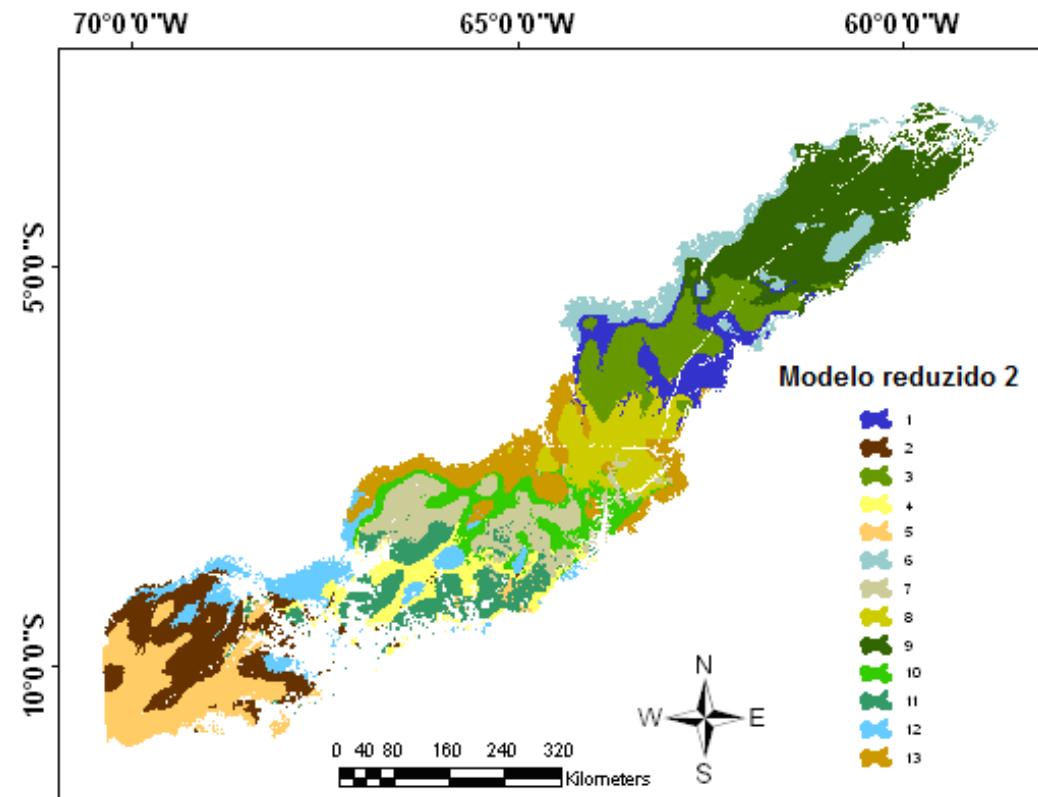


# Environmental data for Biodiversity Modeling

Ecoregions – Madeira-Purus, BR-319

Self Organizing Mapping

- Data Validation
- Natural Barriers
- Aquatic environment
- Historical factor



## Self Organizing Mapping



# Biodiversity Inferences

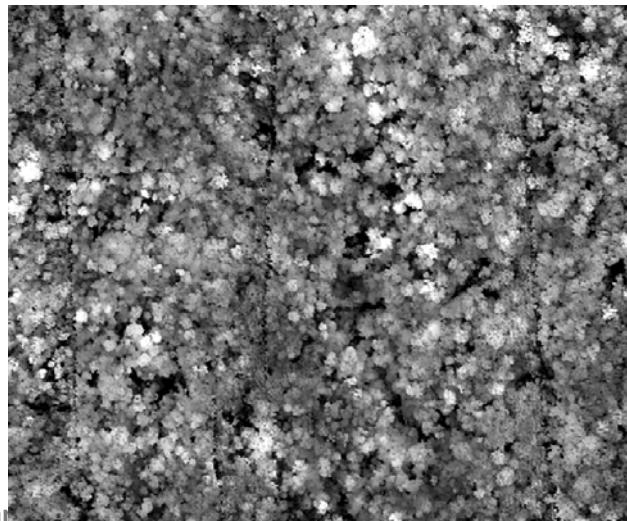
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- Alternative data to estimate biodiversity
  - Remote Sensing

**High resolution data**

Dossel structure, ground coverage, LAI

Understory vegetation  
Composition

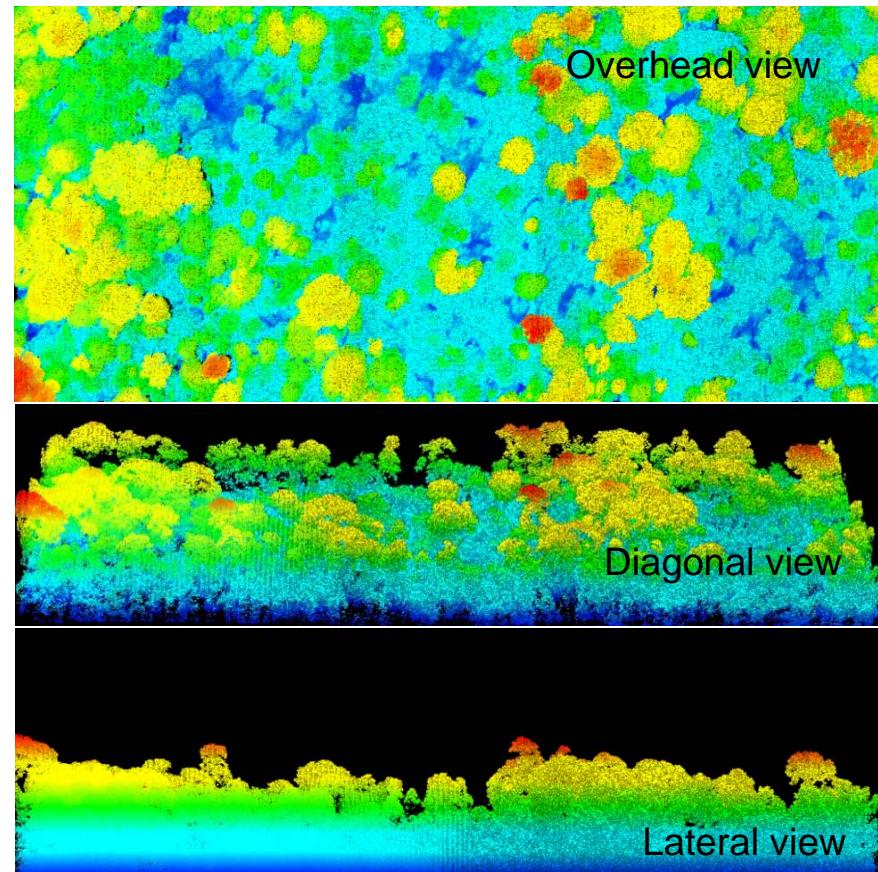




# Remote Sensing Data

- Radar Data – clouds and above dossel information
  - Phenological aspects
  - LIDAR – forest structure
  - Carbon stocks – wood density

3-D information from the canopy

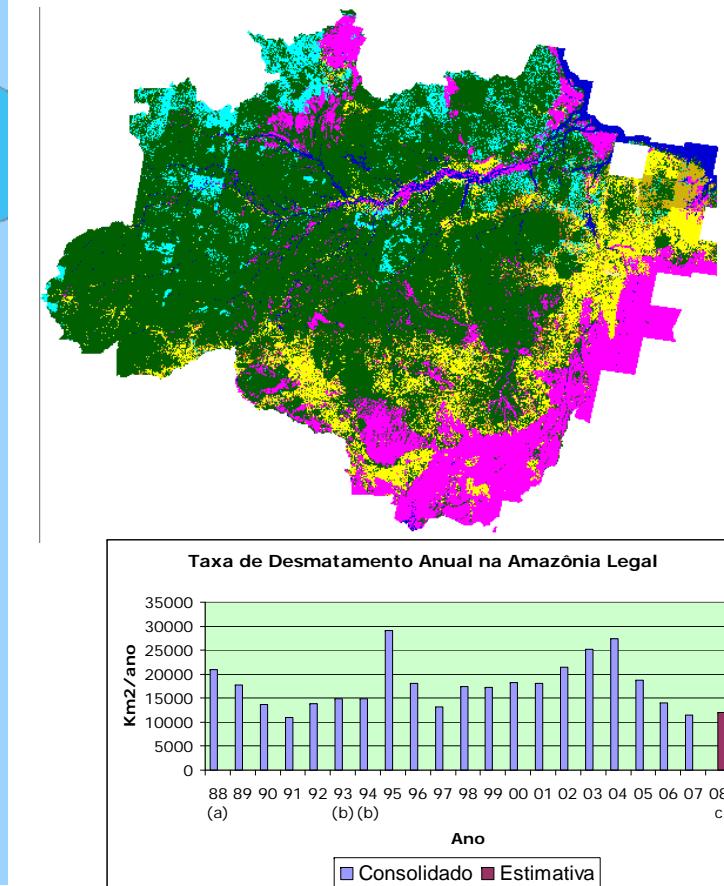
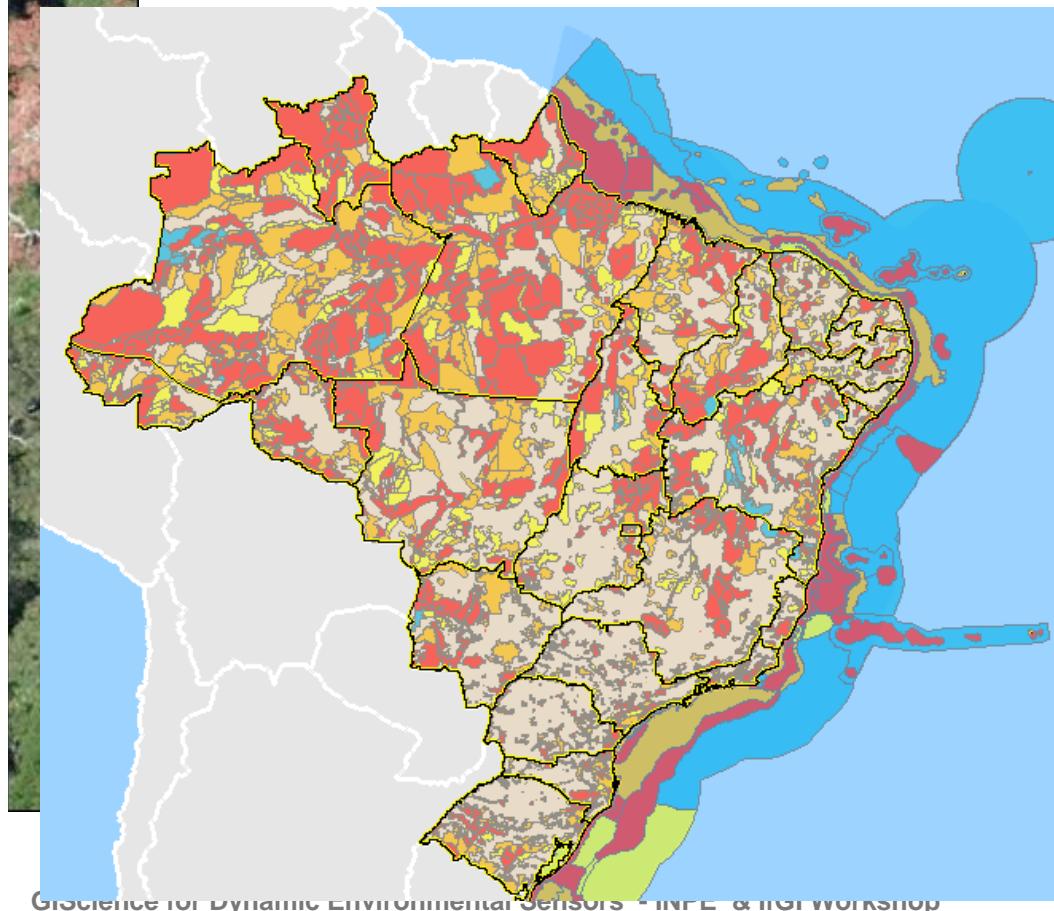


RS - Useful for inference and spatial generalization



# Biodiversity Modeling Habitat loss, changes & threats

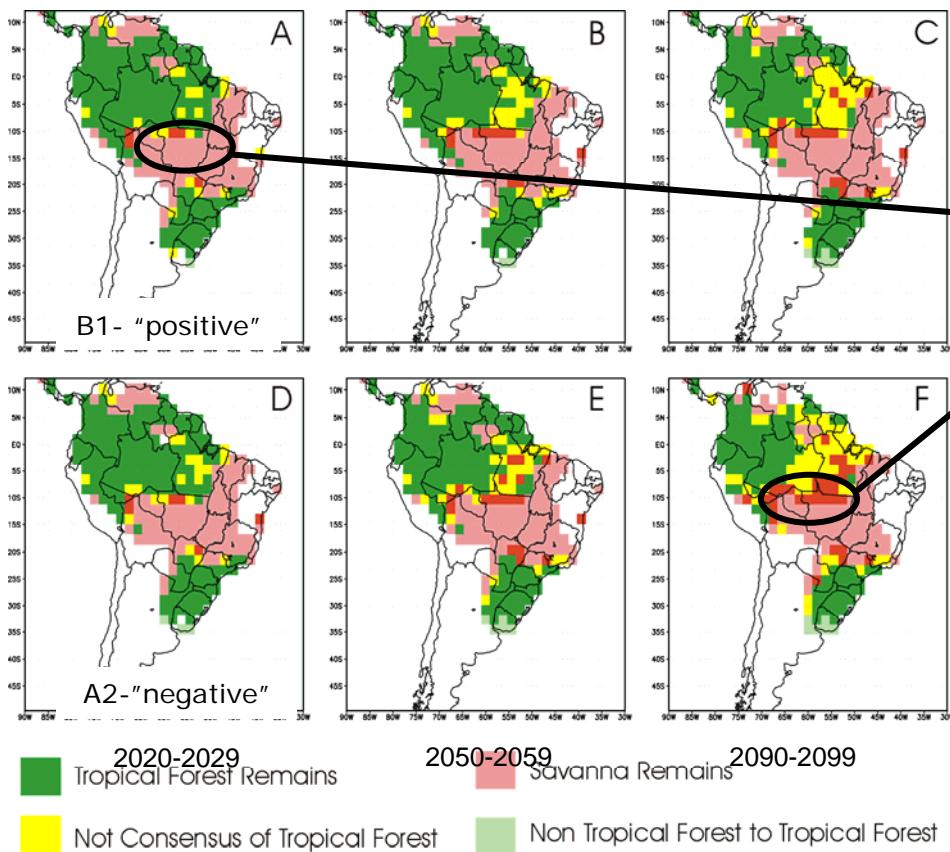
- Prioritary areas for biodiversity conservation
- Deforestation process





# Global Climate Change Modelling

- Modeling Biodiversity based on Life Form
  - “Savannization” process



BIOMA approach

??? Given the climate warming and based on the plant form spectra, is there a tendency of "savannization" of Amazonian forest ?

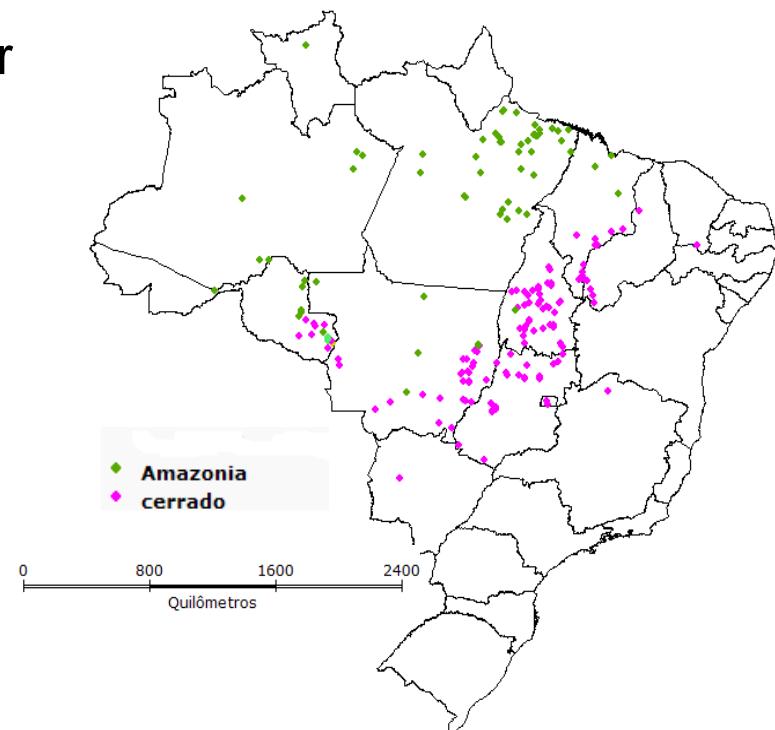


# Modeling Biodiversity based on Life Form

- Potential life forms combination over cerrado and Amazon forest frontier considering scenarios of climate change
- Modeling based on bio-climatic envelopes and life forms



Species classified base on the Function instead of taxonomy – Functional GROUPS



Species grouped by their form of life and survival strategy & E.Box Model



# Final Comments

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- Biodiversity modeling
  - Important Issue in times of Global Change
  - More questions/problems than solutions/answers
  - Complementary Approaches – every contribution is more than welcome !!
  - Understanding temporal (“slow”?) and spatial (“too diverse”?) Biodiversity dynamic
  - Modeling – despite the restrictions, one can learn from modeling exercises.



A dirt road through a dense tropical forest. Sunlight filters through the canopy of tall trees, creating bright patches on the ground. The forest floor is covered with green vegetation and fallen leaves. A tall wooden utility pole stands on the right side of the road.

**Thank you !**

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