

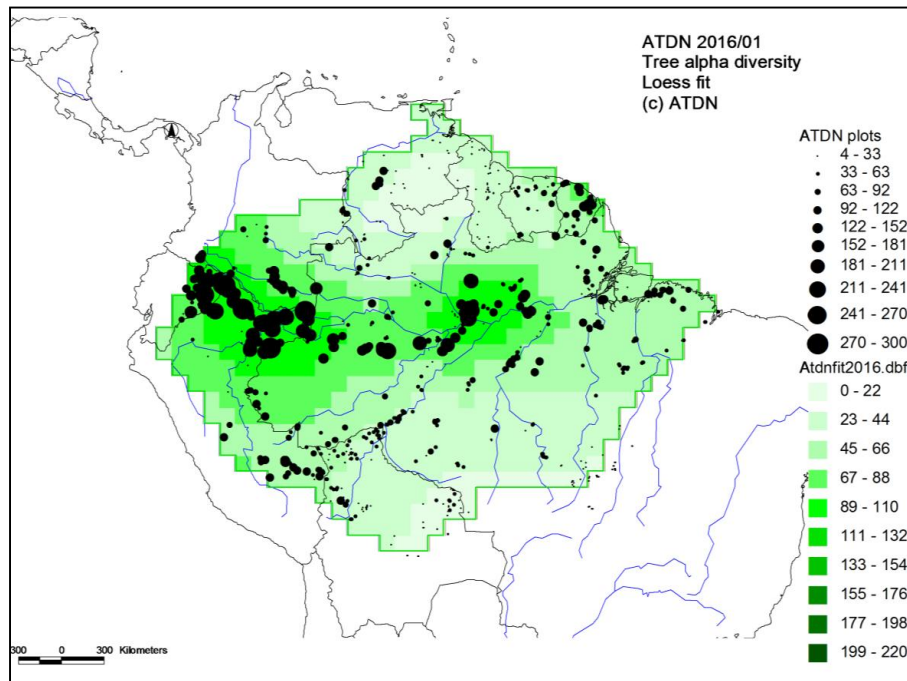
# Mining the Landsat archive for detecting spatial and temporal vegetation patterns in Amazonia

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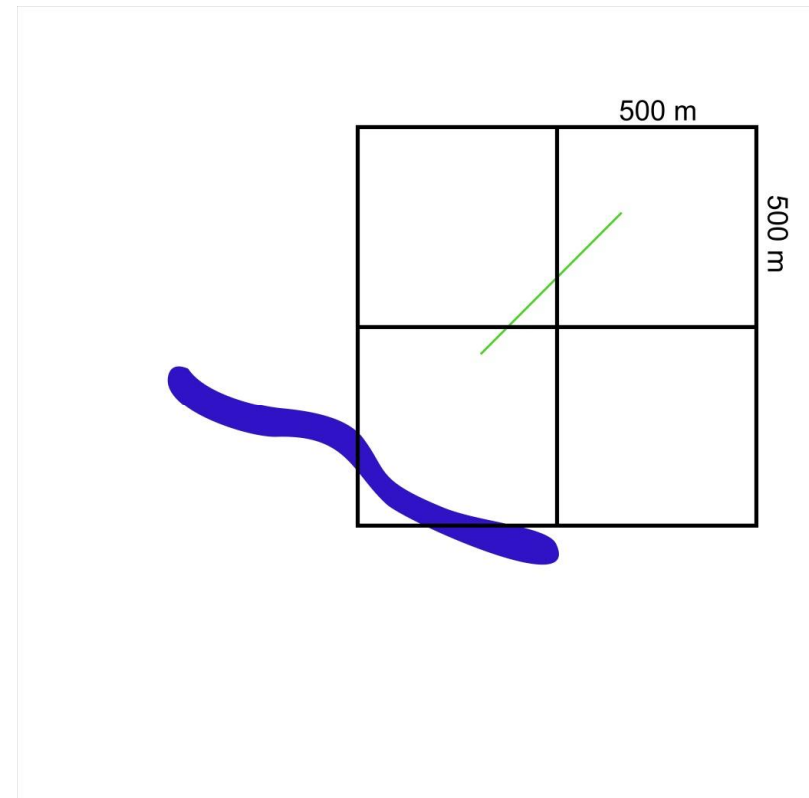


# Amazonian biodiversity



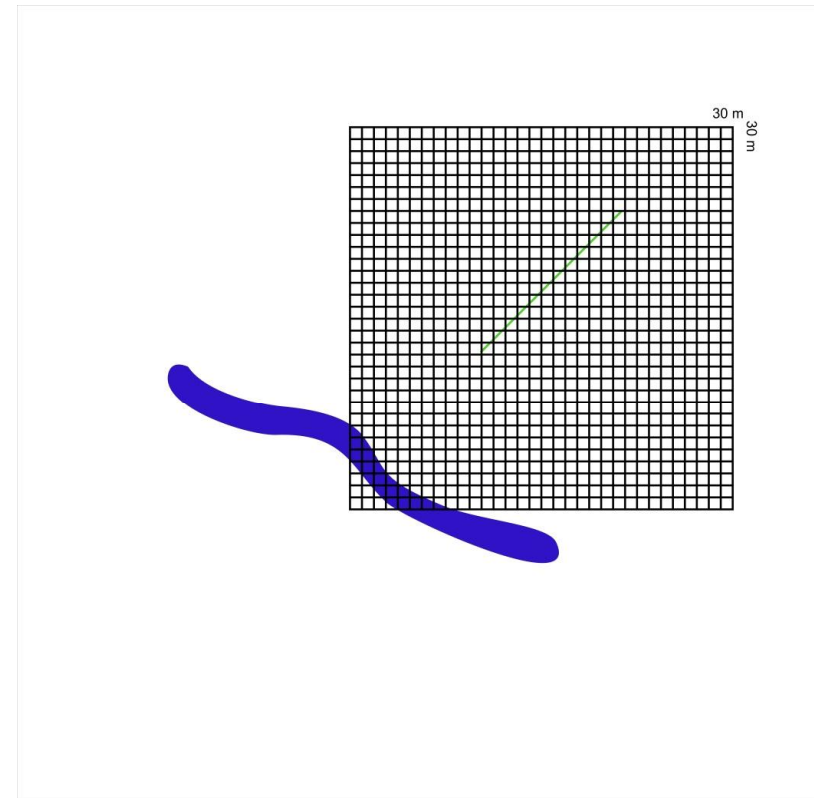
# Low resolution (500 m-1 km) satellite data

- + Near-daily global coverage
- + Continental to global scale studies
- + Studies on vegetation phenology
- Spatial resolution mismatch with most field inventories

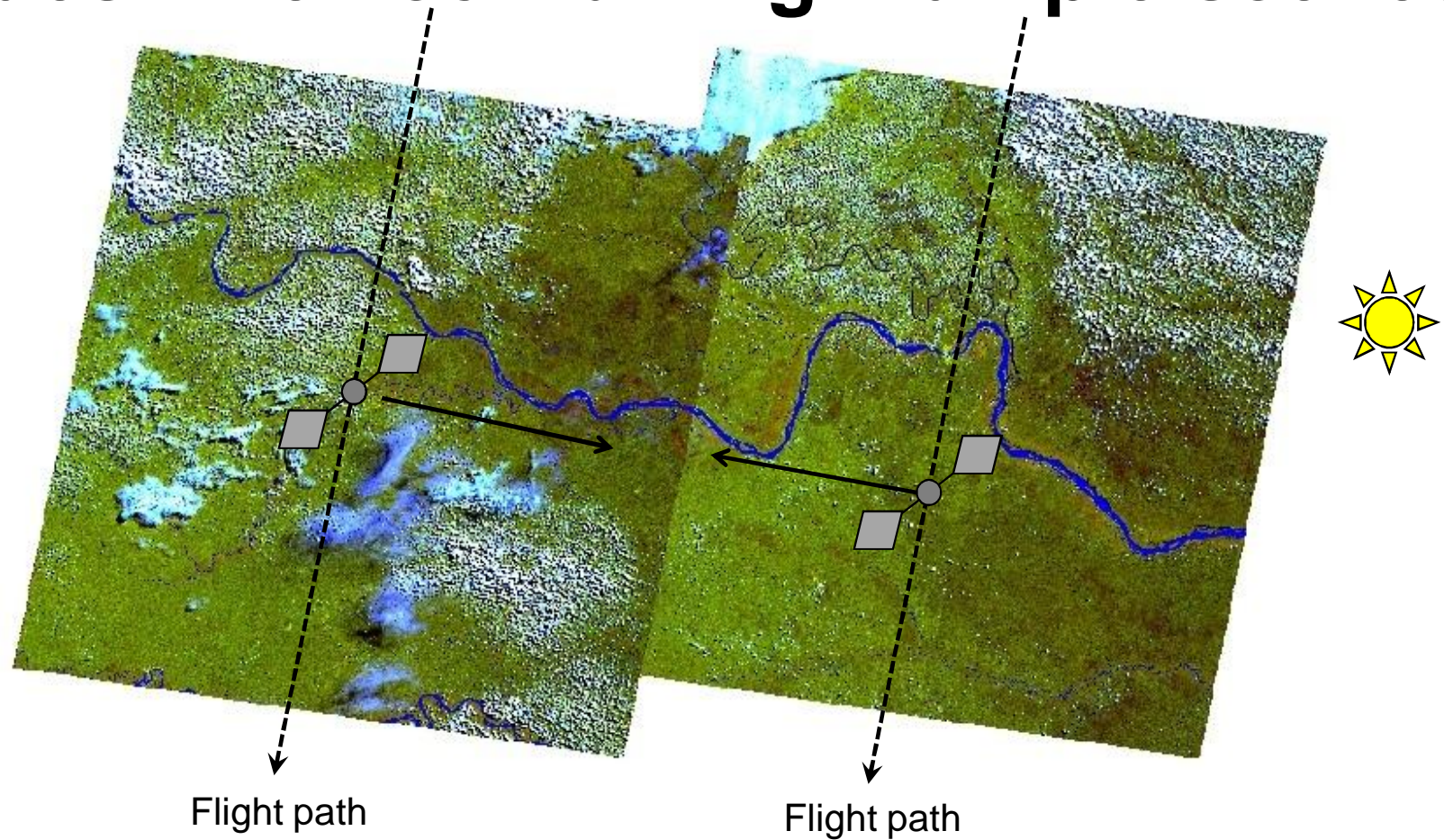


# Medium resolution (10 m-100 m) satellite data

+ Better suited for combination with field inventories

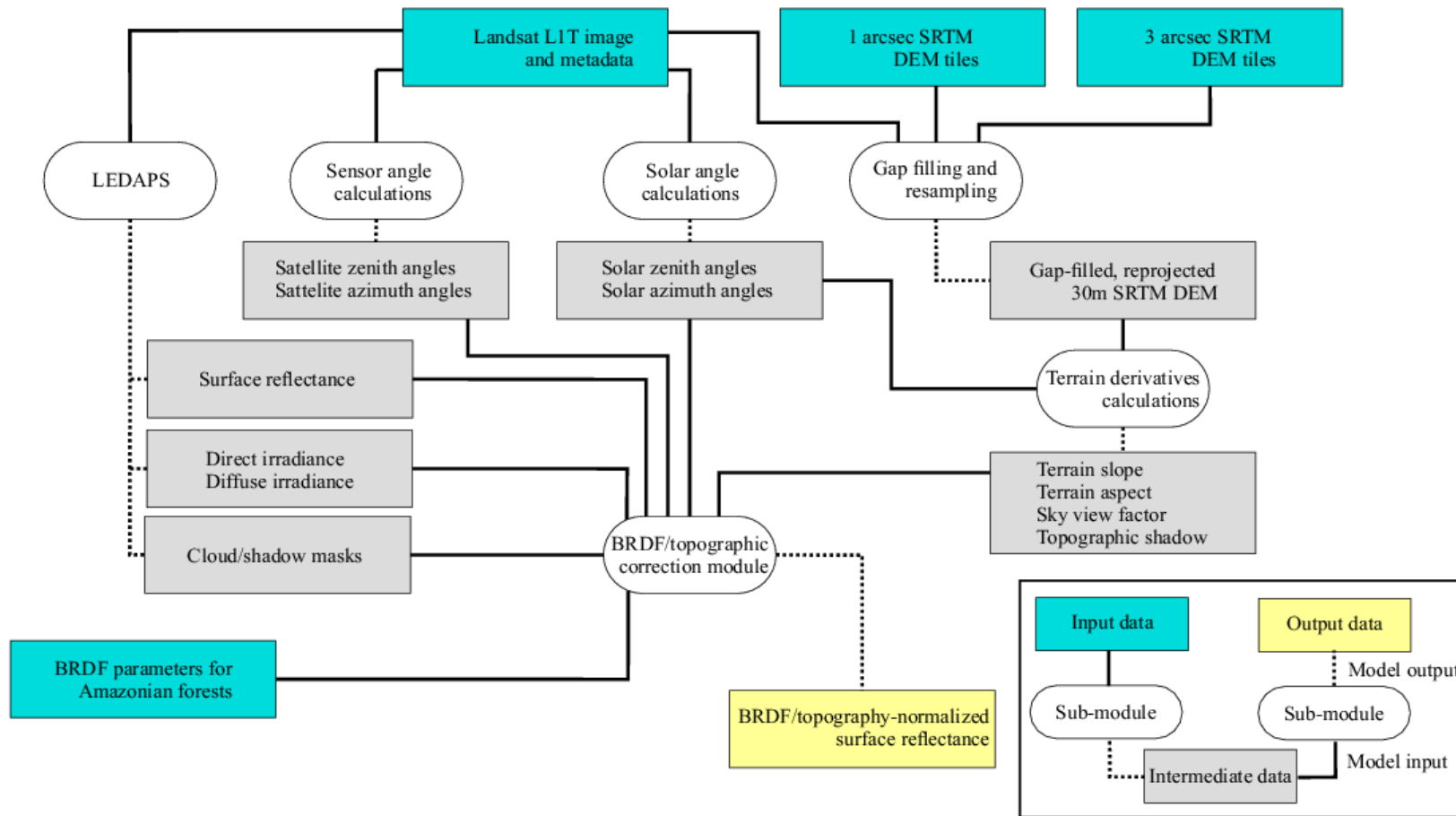


# Issues when combining multiple scenes



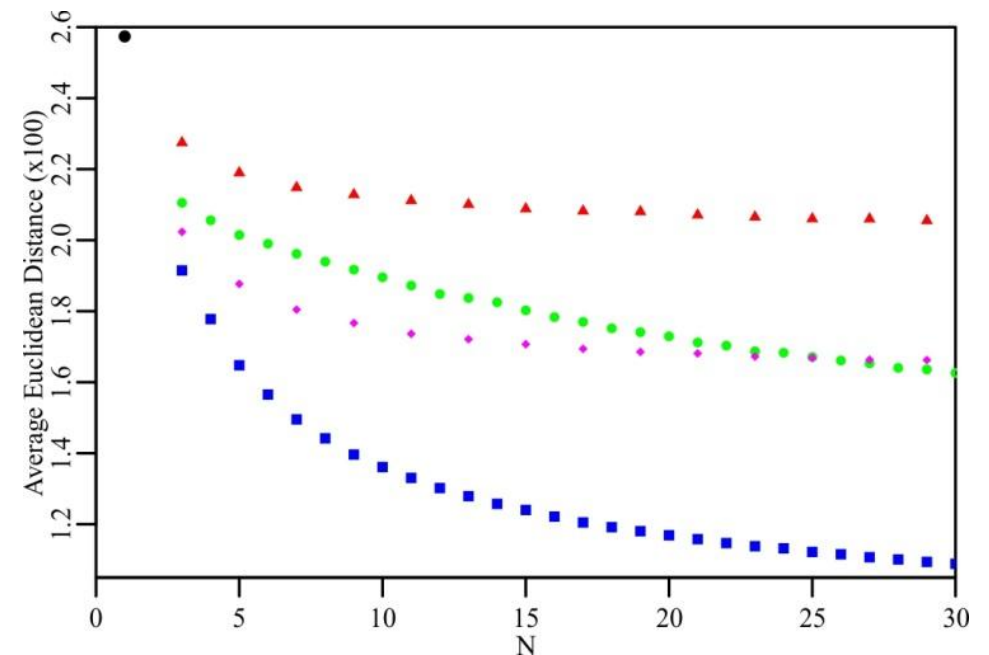
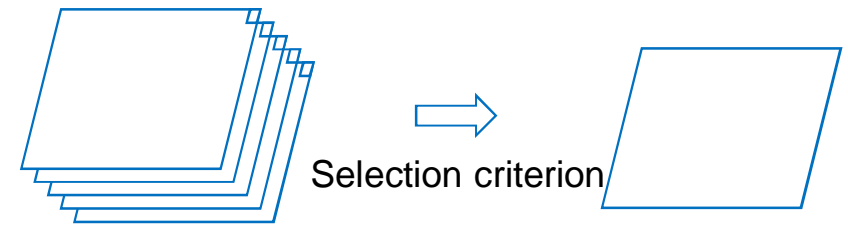
1. Clouds / atmospheric contamination
2. Directional effects

# Taito workflow for image preprocessing and correction of directional effects (in R)



# Image compositing

- Depending on selection criterion, improvement in radiometric consistency of composite image with increasing data
- Trade-off:
  - temporal resolution
  - radiometric consistency
  - computing resources

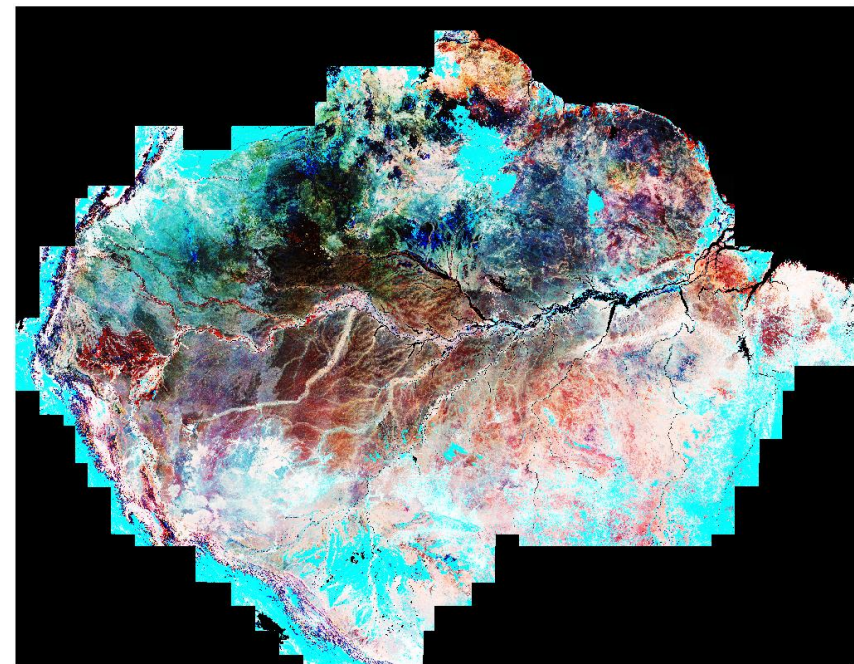




# Application 1

## Basin-wide vegetation modelling

- Combination with field surveys of species composition/soil
- Extremely small spectral differences between vegetation types
- Requires single composite image with high spatial consistency
- Compositing period: months July-September from 2000-2009
- $\approx 30.000$  scenes (at  $\approx 100\text{MB}$  per compressed scene)

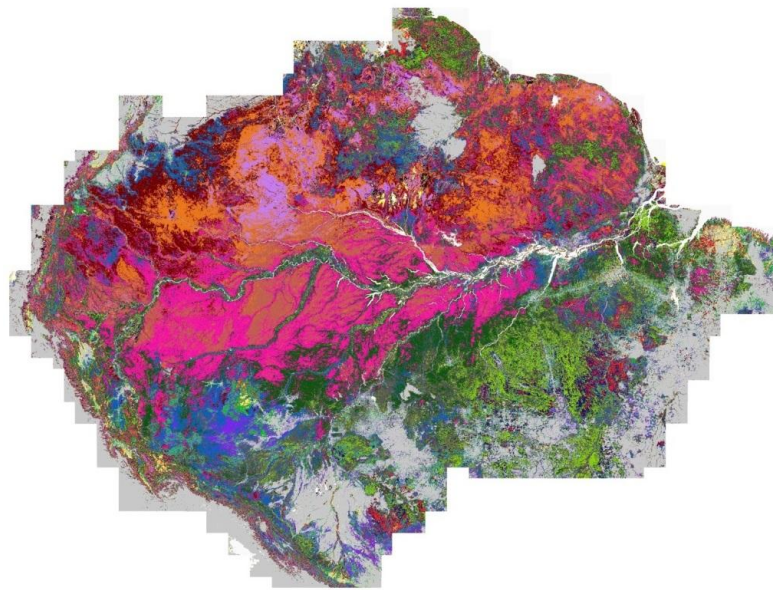




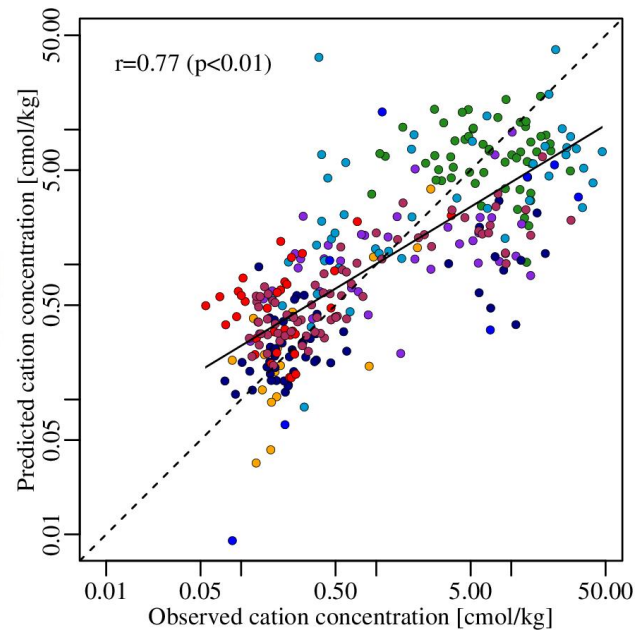
# Application 1

## Basin-wide vegetation modelling

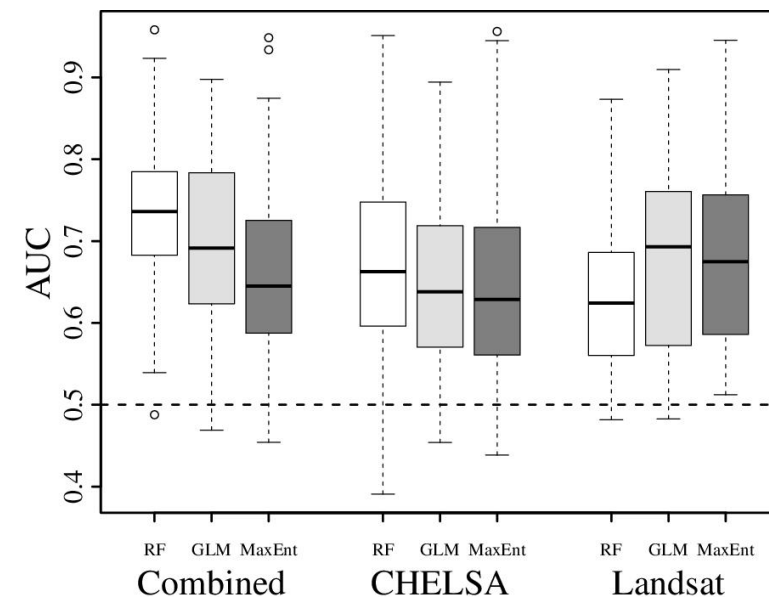
Unsupervised classification



Soil fertility modelling



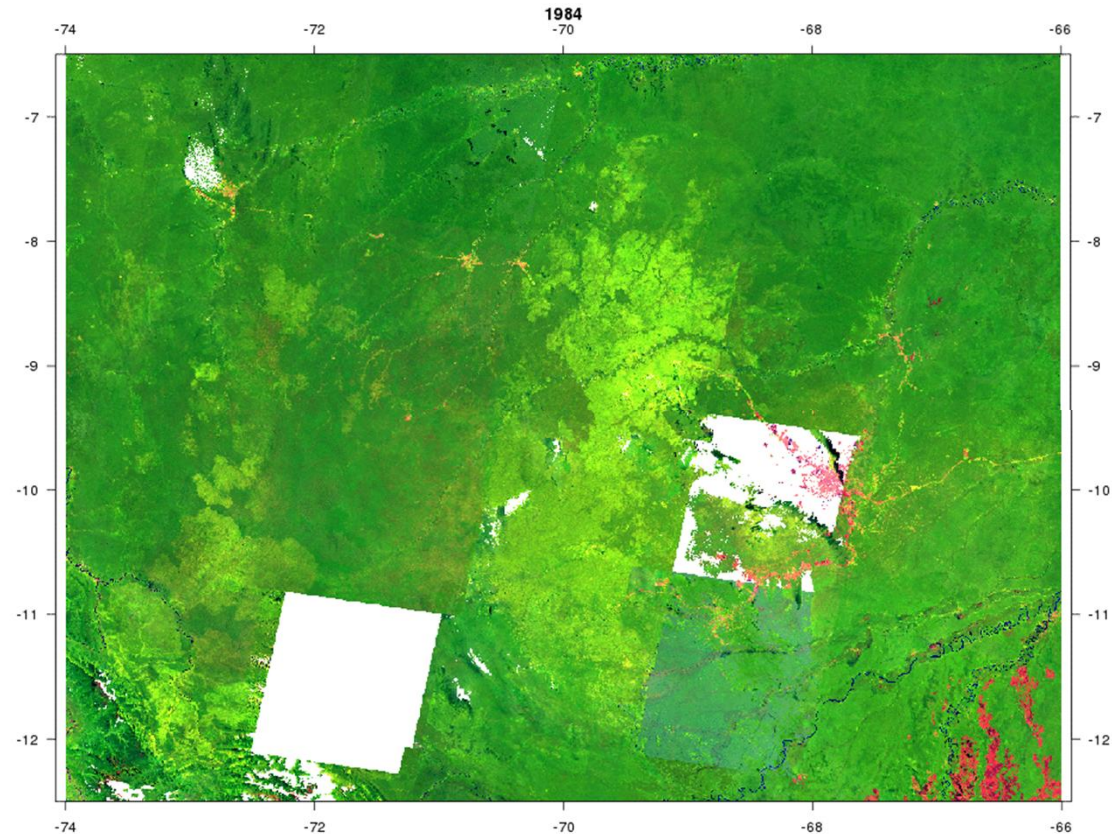
Understory species distribution modelling



# Application 2

## Bamboo forests

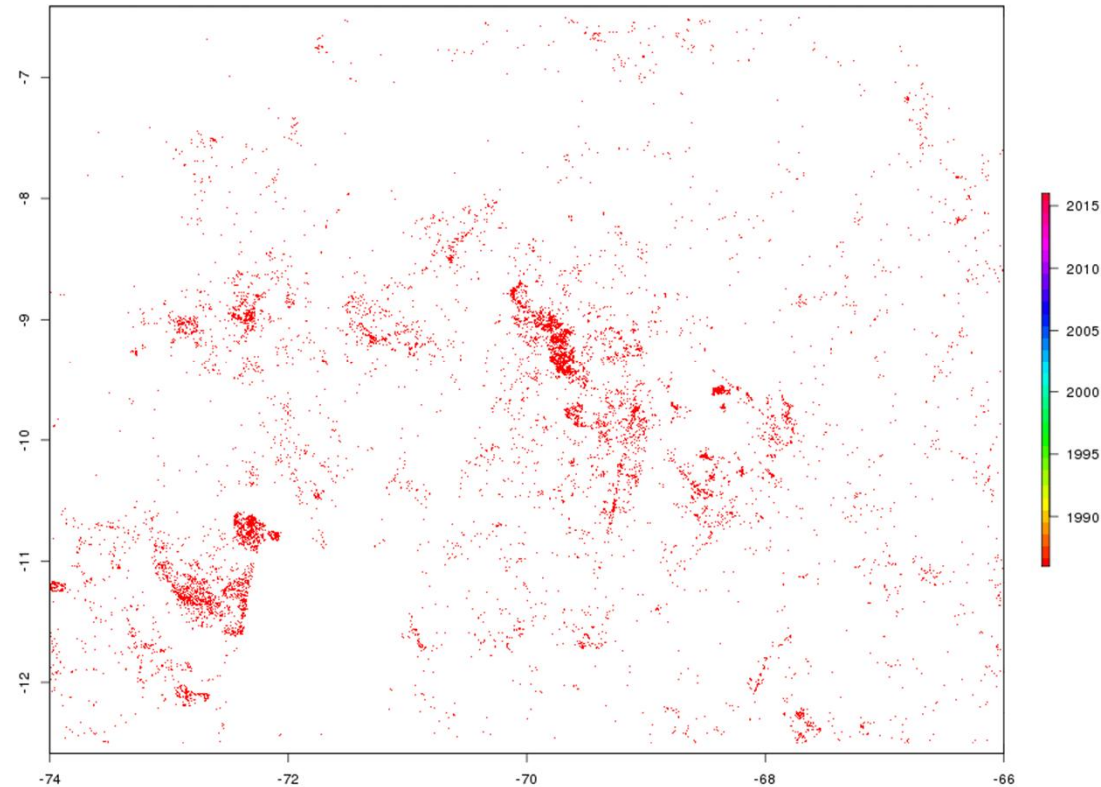
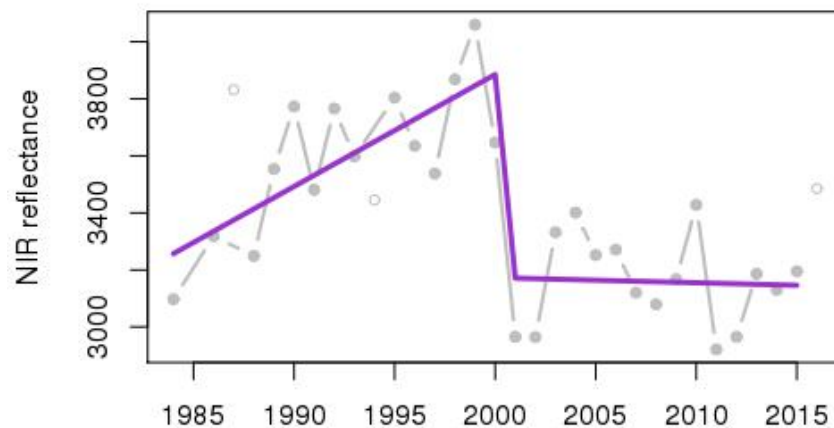
- Die-off/regrowth cycles of  $\approx 27$  years
- Synchronous patches up to order of 10 km diameter
- Yearly composites 1984-2017



# Application 2

## Bamboo forests

- Pixel-based time series analysis
- Dynamic time warping



# Practical issues

## Data volume

- Each 8-bit Landsat scene (.tar.gz)  $\approx$  100 MB
  - Raw data 30.000 scenes  $\approx$  3 TB
  - Processed imagery: 16-bit
- Landsat freely available from USGS EarthExplorer
- For bulk data user, EarthExplorer Inventory service
  - JSON API in R
  - Querying and downloading integrated in processing chain
  - Allows only single download, no parallelization possible
  - Download speed max.  $\approx$  10 MB/sec (10 sec/scene)  $\implies$  83 h.
- 30 m digital elevation model for Amazon region

# Practical issues

## Data processing

- Processing of each raw Landsat scene
  - Cloud masking, atmospheric correction (top-of-atmosphere to surface reflectance), calculation of illumination/viewing angles, correction of topographic/directional effects
  - $\approx 1$  h/scene  $\Rightarrow$  1250 days
  - Straightforward parallelization per scene
- Combining individual Landsat scene in composite image
  - 30 m resolution for entire Amazon biome  $\approx 100$  GB
  - Not manageable for most personal computers
  - Tile-based approach, 0.5 degree tiles (to do: virtual raster)
  - For each tile, parallelization per image row



# Practical issues

## Data processing

- Time series analysis
  - See presentation Jan
  - Pixel-based
    - Data input/processing parallelized by data rows

## Data distribution

- Work in progress





**UNIVERSITY  
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**Thank you!**

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