

# The fate of African tropical forests: High resolution continental maps of deforestation risk and future forest cover



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## 1 Introduction

- Long term projections
- Spatial projections
- Objectives

## 2 Data

- Historical deforestation
- Explicative variables

## 3 Modelling

- Statistical model
- Software

## 4 Results

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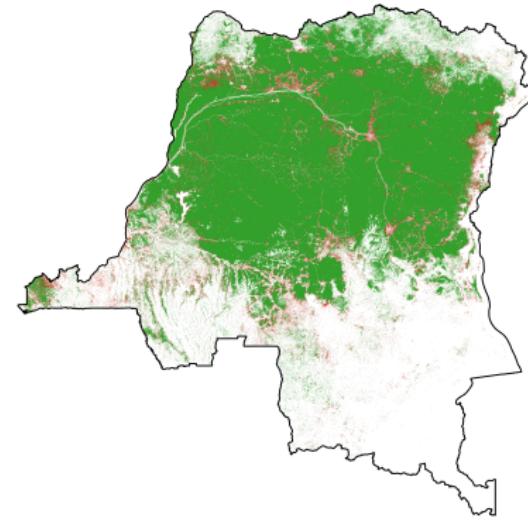
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# Long term projections

- Tropical forests shelter most of the terrestrial biodiversity and carbon stocks
- They are currently being deforested at rates close to 1%/yr



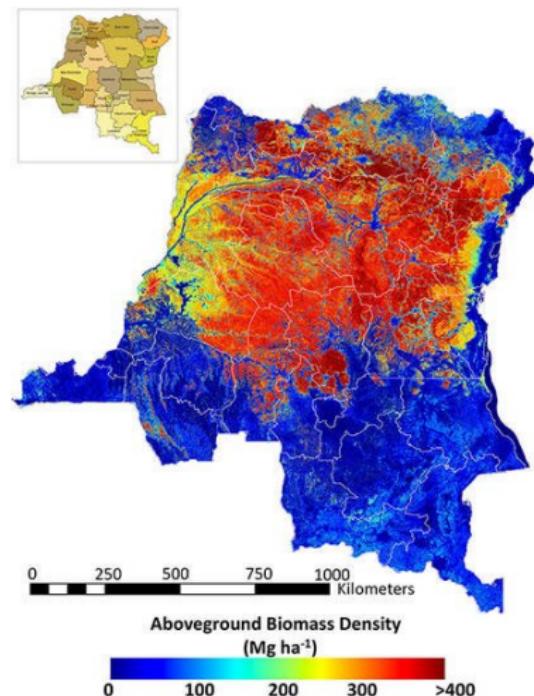
**2005-2015** deforestation in  
Democratic Republic of the Congo

What happens when you project annual deforestation on the medium to long term (2050-2100) ?

→ Long term projections

# Spatial projections

- Not all forests are equally threatened
- And biodiversity and forest carbon stocks vary spatially



Aboveground biomass in Democratic Republic of the Congo

What are the consequences of long term deforestation for biodiversity and

# Objectives

- Deriving high-resolution maps of the spatial probability of deforestation
- Projecting forest cover change until 2050 under a business-as-usual scenario

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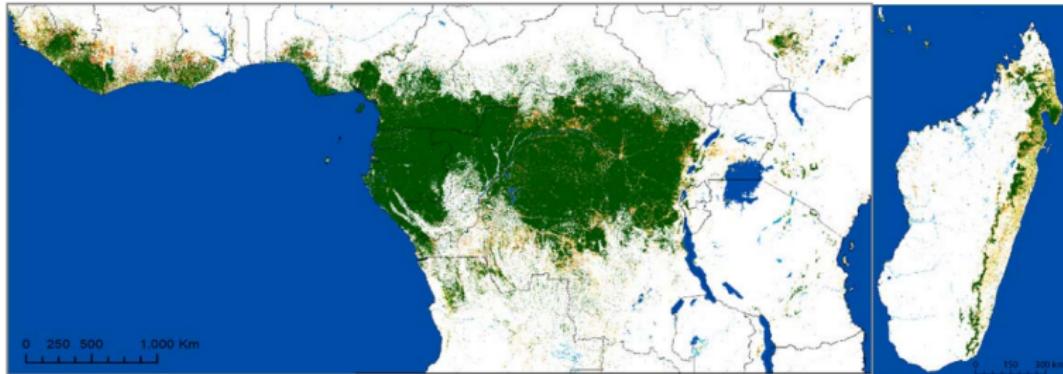
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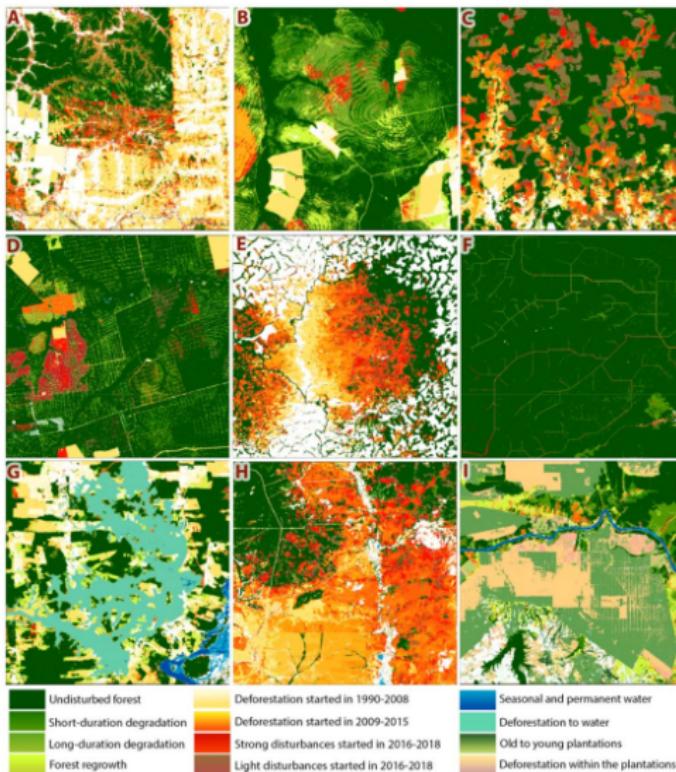
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# Historical deforestation

- Wall-to-wall map of **tropical moist forest cover** change at 30 m resolution from 1990 to 2018
- Using the 37-years full Landsat satellite archive and Google Earth Engine
- Time-series analysis at the pixel scale using a complex decision tree based on expert knowledge



# Historical deforestation



# Historical deforestation

- **Vancutsem Ch., F. Achard , J.-F. Pekel , G. Vieilledent, S. Carboni , D. Simonetti , J. Gallego.** Long-term monitoring of the tropical moist forests dynamics reveals unprecedented deforestation rates. Submitted to *Nature Communications*.
- Response variable : deforestation on 2005-2015

# Explicative variables

- Variable types : **landscape, accessibility, protection status**

Product	Source	Variable derived	Unit	Resolution (m)
Deforestation maps (2005-2015)	Vancutsem et al. (1)	forest/non-forest	—	30
		distance to forest edge	m	30
		distance to previous deforestation	m	30
Digital Elevation Model	SRTM v4.1 CSI-CIAR (2)	altitude	m	90
Highways	OSM - Geofabrik (3)	slope	°	90
Places		distance to roads	m	150
Waterways	WDPA (4)	distance to towns	m	150
Protected areas		distance to river	m	150
		presence of protected area	—	30

- (1) Vancutsem et al., (2) <http://srtm.csi.cgiar.org>,  
(3) <http://www.geofabrik.de>, (4) <http://protectedplanet.net>

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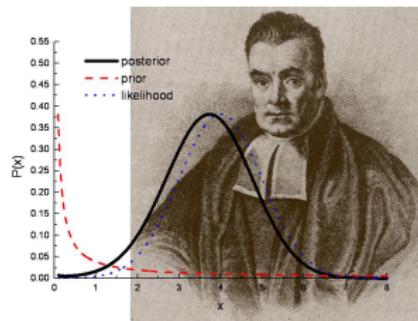
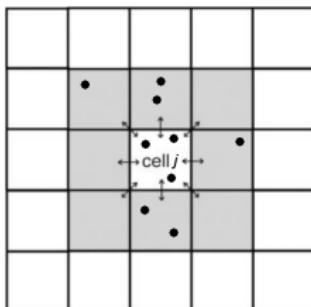
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# Statistical model

- $Y_{ij} \in \{0, 1\} \sim \text{Bernoulli}(\theta_{ij})$
- $\text{logit}(\theta_{ij}) = f(\text{spatial factors}_i) + \rho_j$
- Autocorrelated spatial random effects  $\rho_j$  (10 km) to account for **unmeasured** or **unmeasurable** factors : population density, soil type, geographical barriers, law enforcement locally
- Hierarchical Bayesian framework



# Statistical model

- One model per country
- 40,000 sample points (balanced sampling deforested/non-deforested areas)
- Variable selection based on expert knowledge regarding effect sign

# Software

The screenshot shows the GitHub repository page for 'forestatrisk'. The repository has 257 commits, 1 branch, 1 release, 1 environment, 1 contributor, and is licensed under GPL-3.0. The latest commit was made 7 days ago. The repository has 8 issues, 0 pull requests, 0 projects, and a wiki.

Branch: master ▾ New pull request Create new file Upload files Find File Clone or download ▾

File	Description	Time
ghislainv/New tuto	Latest commit cd54275 7 days ago	
C	Update	last month
docs	New tuto	7 days ago
forestatrisk	urllib for Python3	last month

- forestatrisk Python package :  
<https://github.com/ghislainv/forestatrisk>
- Rasters processed by chunks : high resolution (30 m, large spatial scale)
- Fast, without memory issues
- Parallel computation : one node per country

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... Thank you for your attention ...  
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