

Antananarivo – June, 3<sup>rd</sup> 2016

# BioSceneMada

## Deforestation scenarios



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## 1 Introduction

- Barnes' approach
- Objectives

## 2 Deforestation trends

- Model
- Projections

## 3 Spatializing

- Map of deforestation
- Model
- Results

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# Another approach

Barnes 1990 Afr. J. Ecol.

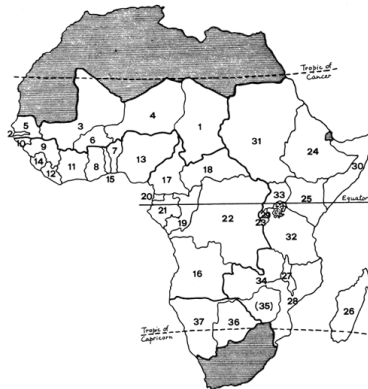
*Afr. J. Ecol.* 1990, Volume 28, pages 161–173

## Deforestation trends in tropical Africa

R. F. W. BARNES\*

*Wildlife Conservation International, Department of Zoology, University of Cambridge*

- deforestation =  $f(\text{forest} + \text{people})$
- deforestation increases with forest extent and number of people



# Another approach

Barnes 1990 Afr. J. Ecol.

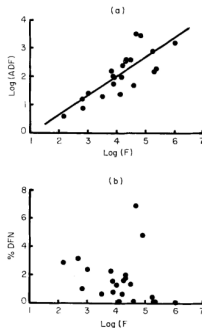
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## Deforestation trends in tropical Africa

R. F. W. BARNES\*

*Wildlife Conservation International, Department of Zoology, University of Cambridge*

- $\log(D) = \beta_0 + \beta_1 \log(F) + \beta_2 \log(P)$
- Good model :  $R^2 = 78\%$

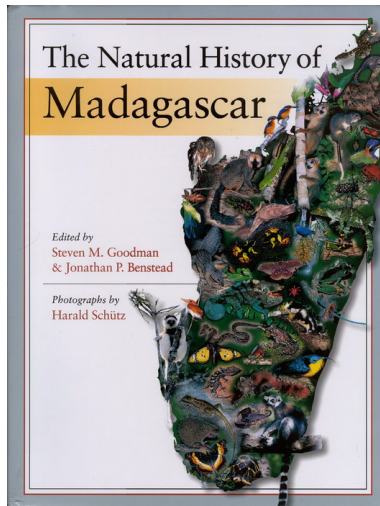


**Fig. 2.** Relationship between deforestation rates and forest area in km<sup>2</sup> (F). (a) ADF is absolute area (km<sup>2</sup>) deforested per annum.  $\log(\text{ADF}) = 0.68 \log(F) - 0.72$ ,  $r = 0.81$ , d.f. = 20,  $P < 0.0001$  (b) % DFN is the percentage area of forest that is felled per annum.  $r = 0.23$ , d.f. = 20, NS.

# Objectives

## Impact of deforestation on climate

- Actualize and improve Barnes' approach
- Spatialize deforestation
- Africa and Madagascar

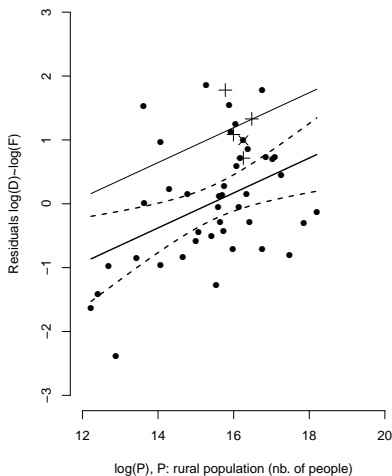
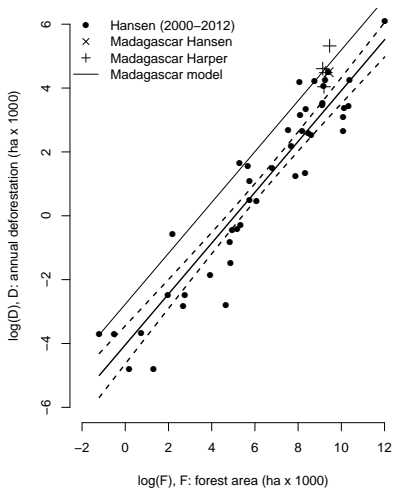


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# Results

Whole Africa: 44 countries





# Results

$$\log(D) = -8.450 + 0.796^{***} \log(F) + 0.286^{**} \log(P)$$

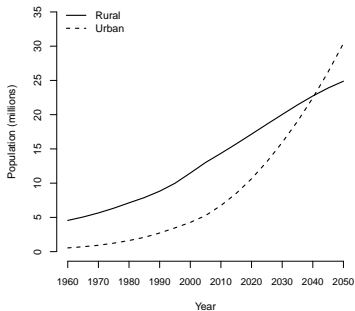
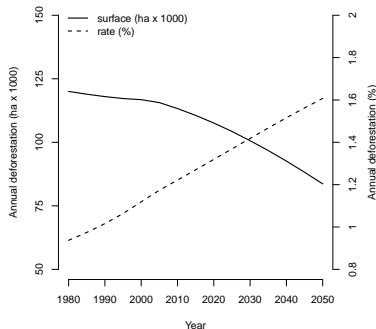
$R^2 = 91\%$ ,  $F = 206.8$  on 2 and 40 DF, p-value  $< 2.2e - 16$

## Improving Barnes' approach

- Hansen data (2000-2012) + WorldBank data for population
- **Rural population** in place of total population
- One **historical mean deforestation rate** by country

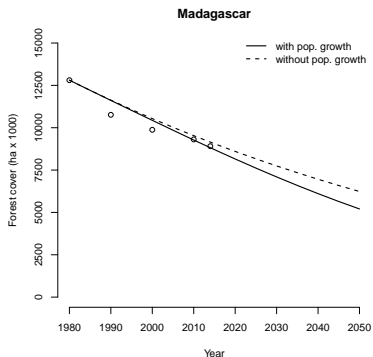
# Results

## Projections

**Madagascar****Population with time****Madagascar****Deforestation with time**

# Results

## Projections



- Start = 1980 (12.8 Mha). Projections and validation on 1980-2015.
- Observed 2015 : 8.9 Mha, predicted 2015 : 8.7 Mha.
- Better predictions when accounting for demographic growth.
- Forest in 2050 : **5.2 Mha**.

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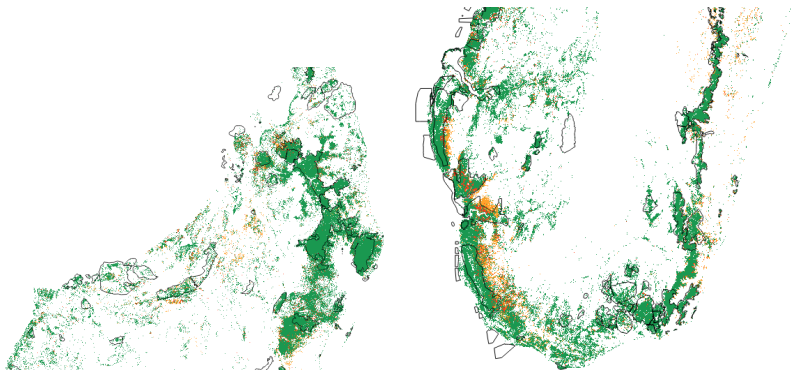
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# Maps of past deforestation

- Past deforestation :  
1990-2000-2010
- Without clouds
- At 30m resolution



# Map of past deforestation



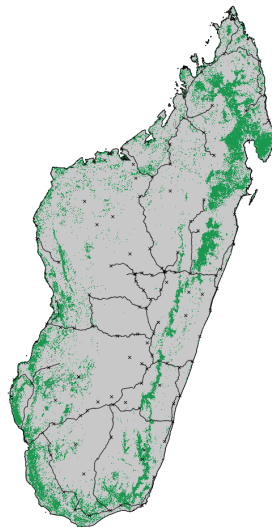
# Model

## Spatial probability of deforestation

- Sampling : 100,000 points
- $\text{logit}(\theta_i) = f(\text{spatial factors}_i) + \rho_j$
- Spatial factors : 30 m
- Period 2000-2010

## Type of spatial factors

- **Landscape factors** : dist. to forest edge, dist. to past deforestation
- **Accessibility factors** : altitude, dist. to road, town
- **Land-policy factors** : protected area network



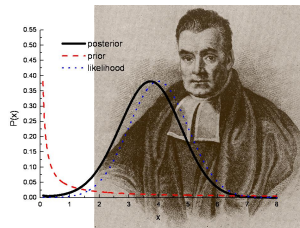
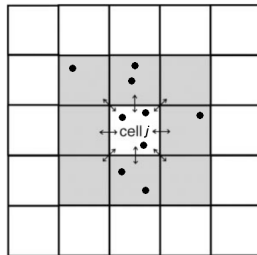
# Model

## Spatial random effect

- $\text{logit}(\theta_i) = f(\text{spatial factors}_i) + \rho_j$
- $\rho_j$  : spatial random effect
- $\rho_j$  : 10 km ( $\sim 1500$  cells  $j$ ),  
interpolated 1 km

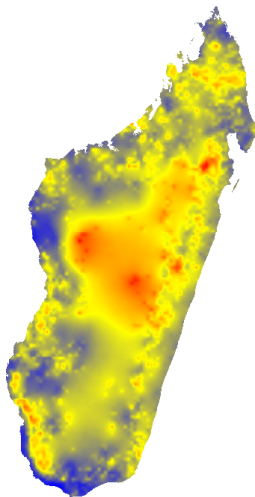
## Inference

- hierarchical Bayesian approach
- hSDM R package

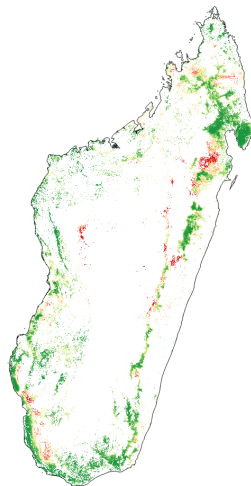




# Spatial probability of deforestation



**Spatial random effect**



**Probability of deforestation**

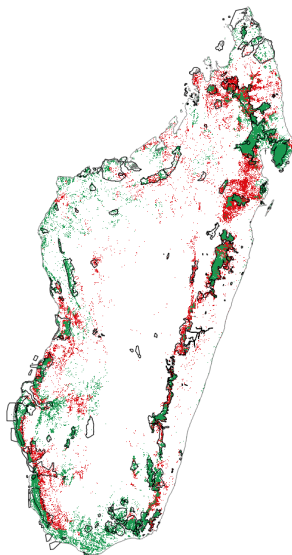
# Future deforestation


## Forest cover in 2050

- Forest in **2010** : 9.3 Mha
- Forest in **2050** : 5.2 Mha

## Forest cover in 2050

- Coherent pattern at fine scale
- Forest concentrated in protected areas
- and in remote areas





... Thank you for attention ...