# Spatial modelling of Ebola virus transmission in a changing forest landscape

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## **Emerging infectious diseases**

# 25% mortality worldwide 60% animal origin





Increase in incidence of EID

'Hotspots' for EID

Jones et al. 2008 Doi 10.1038/nature06536

# Global changes, drivers of EID







Living Planet 24 May 2022

Context

## **Forest loss and fragmentation**





Current Opinion in Virology Volume 3, Issue 1, February 2013, Pages 79-83



Human ecology in pathogenic landscapes: two hypotheses on how land use change drives viral emergence

Kris A Murray, Peter Daszak 🖾

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#### Bats, Coronaviruses, and Deforestation: Toward the Emergence of Novel Infectious Diseases?

Aneta Afelt 1\*, Roger Frutos 2,3 and Christian Devaux 4



OPEN Recent loss of closed forests is associated with Ebola virus disease outbreaks





Context

## **Ebola virus dynamics**



Ebola virus circulation and transmission in a forested socio-ecosystem: (1) bats, (2) wildlife, (3) human – wildlife contact, (4) human communities. © D. Guard-Lavastre/Cirad, modified from CDC: <u>http://www.cdc.gov/vhf</u>/ebola/resources/virus-ecology.html

- Mortality rate ≈ 50%
- 1st case in DRC in 1976
- $\approx$  22 outbreaks; 16 since 2001.
- West Africa (2013 2016) >28 600 cases 11 325 deaths

Human – Human transmission by direct or indirect (body fluids or contaminated surface)





*Explore transmission dynamics in a potential Ebola virus reservoir in a changing forest landscape* 

# Earth observation for land cover mapping







## Ecology of Hypsignathus monstrosus



	ØPLOS ONE	
Z. Tierpsychol., 45, 225-2 © 1977 Verlag Paul Parey	155 (1977) , Berlin und Hamburg	REARINGARTOLE
ISSN 0044-3573 / ASTM-Coden: ZETIAG		Lek-associated movement of a putative
		Ebolavirus reservoir, the hammer-headed
		fruit bat (Hypsignathus monstrosus), in
		northern Republic of Congo
		Sarah H. Olixong <sup>1+</sup> , Garand Boungag <sup>1</sup> , Alain Ondole <sup>1</sup> , Trent Bushmaker <sup>1</sup> , Stephanie N. Softert <sup>1</sup> , Enva Kuisma <sup>1</sup> , Dylan W. Taylor <sup>1</sup> , Vincent J. Manster <sup>1</sup> , Chris Walterg <sup>1+</sup>
University of	California, San Diego, Departmen La Jolla, California	1 Miller Connected Tables, Annel Phogram, Seron, Kinn Yin, United Editoria of Annessa, 2 Wildler Connected Tables, Marcenelle, Register Carpon, Vinnis Ghong, Belance, Laborettar of Hongs, Existing of Internet Phenetics, Marcella and Internet and Phene year existing San San San Marcella and Annessa Wildler San
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Lek Matin	g Behavior in the Hammer-headed Bat	
By Jack W. BRADDIEY		MAMMALIAN SDECIES 11 11
	-, ,	IVIANINIALIAN OFECIES No. 357, pp. 1-4, 4 hgs.
^♥	Afrique SCIENCE 11(1) (2015) 227 - 236 ISSN 1813-548X, http://www.afriquescience.info	Hypsignathus monstrosus. By Paul Langevin and Robert M. R. Barclay Published 26 April 1990 by The American Society of Mammalogists
Données préli tête de ma	iminaires sur la distribution spatio-temporelle a rteau, <i>Hypsignathus monstrosus</i> H. Allen, 1861 du Plateau (Abidjan, Côte d'Ivoire)	es chauves-souris à dans la commune
Coffi Jean Mag	loire NIAMIEN <sup>1+</sup> , Blaise KADJO <sup>2</sup> , Inza KONE <sup>2</sup> et Koua	kou Eliézer N'GORAN <sup>2</sup>

#### + current studies in Congo & Guinea

- Potential Ebola reservoir
- Capable of long migrations
- Concentration of displaying males during breeding season (leks)

#### In Guinea:

- Competes for resources (ex. mangoes) with humans
- 2 breeding seasons/year

#### Model

## **Spatially explicit model**

Domain specific language (Ocelet)

Interaction graphs to model *relationships* between *entities* 



#### Model

## Changes in land cover (Guinée forestière)





Guinée forestière



- Area of ~190 km<sup>2</sup>
- Breeding site for fruit bats

Between 2005 – 2015, 1% of the surface occupied in the study area by degraded, secondary and transition forest has been **converted to a mosaic of crops and forests**... but ongoing change and fragmentation of forest



2005

#### Model

## Ebola virus transmission model in fruit bats



#### Initial conditions

- No. bats in the population (1200)
- No. roosts in study area (80)
- No. foraging sites (1000)

### Fixed parameters

- Max. distance between roosts: 4 km
- No. days spent in the same roost: 1 10d
- Time spent in roost: 12h (6 am to 6 pm)
- Time spent in foraging site: 48

   511 min
- No. foraging sites / night: 5
- Max. foraging distance: 14 km

#### Simulation parameters

- Location of roosts
- Location of foraging sites
- Length of simulation (7d)
- Time steps (20min)
- (Starting date)

## Spatio-temporal variation on bat density





$$-\sum_{i=1}^{N} P_k \log(P_k) / \log(N)$$

Higher entropy → bats are more dispersed in space

 $P_k$  is the probability of a bat being located in cell<sub>i</sub> of the raster.

N is the total number of cells in the raster

Foraging



## **Bat density (Entropy)**

$$-\sum_{i=1}^{N} P_k \log(P_k) / \log(N)$$

 $P_k$  is the probability of a bat being located in cell<sub>i</sub> of the raster.

N is the total number of cells in the raster





Roosts

## Further work...

- Improve movement of bats
  - Network analysis
  - Flow analysis
- Fragmented landscape scenario
- Add other factors
  - Seasonality
  - Reproduction
- Model validation
  - o GPS data of bats in Guinea

### A more complex model



## Indicators of higher transmission

- Super spreaders
- Areas of increased contact

