# $\begin{array}{c} \mbox{Compilation of a $N_2$O emission inventory from} \\ \mbox{tropical rainforest soils} \end{array}$

Using a detailed biogeochemical model to scale from site to global scales

Christian Werner, Ralf Kiese and Klaus Butterbach-Bahl

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- In-situ measurements
- 3 Model development
- 4 Emission inventories
- 5 Conclusion and future work

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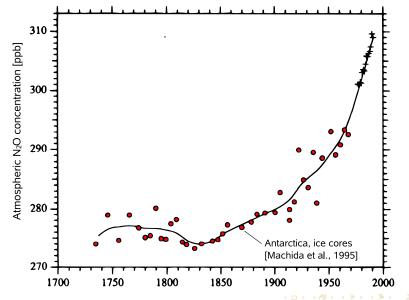


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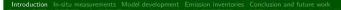
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# Atmospheric concentration of N<sub>2</sub>O

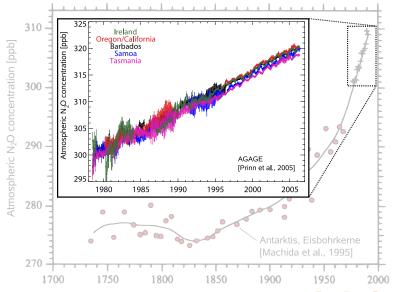


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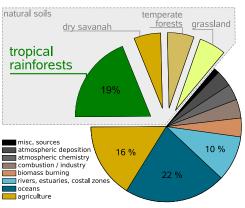
# Atmospheric concentration of $N_2O$





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# Sources of N<sub>2</sub>O



- Tropical rainforest soils biggest terrestrial source
- Large uncertainty of total soil N<sub>2</sub>O source strength  $(3.3 9.0 \text{ Tg yr}^{-1})$

[Data: Lee et al., 1997; IPCC 2007]

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# Existing $N_2O$ emission measurements



- No daily measurements (exception: Australia)
- Environmental parameter and weather data often missing or unsufficient
- Need for concise datasets of high temporal resolution

# Inventory methodologies



#### Bottom-up (I): empirical up-scaling

- + simple methodology, very common (IPCC standard procedure)
- too simple?, no temporal variability, no process-interactions, very dependant on datasets

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#### Top-down: inverse modelling

- + global scale, estimate of total landsurface exchange
- spatial resolution, no single sources, verification

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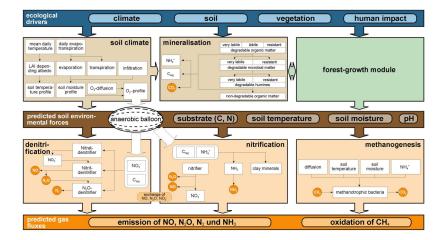
#### Bottom-up (II): biogeochemical modelling

- + explicit spatial units, realistic process functioning, temporal resolution
- high complexity of models, need for detailed measurements and GIS data

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# ForestDNDC



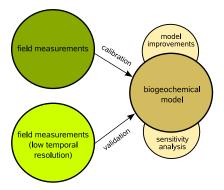
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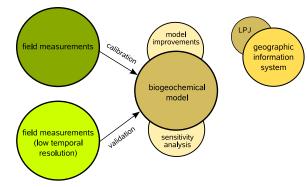


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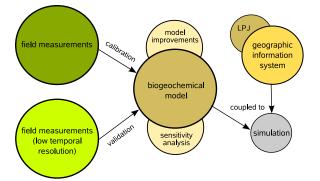






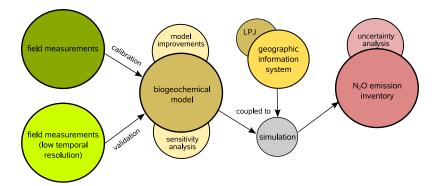
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#### In-situ measurements

# Field measurements





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# Field measurements





#### Kakamega Forest, Kenya 2004

- relict of former equatorial Guinea-Congo rainforest
- 1500m a.s.l, loamy soils, deeply weathered
- 20.4°C mean annual temperature
- 1530mm mean annual precipitation



# Field measurements





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- 1500m a.s.l, loamy soils, deeply weathered
- 20.4°C mean annual temperature
- 1530mm mean annual precipitation



#### Xishuangbanna, SW-China 2005

- seasonal tropical rainforest
- 770m a.s.l., sandy soils, gravel
- 21.8°C mean annual temperature
- 1493mm mean annual precipitation (strongly seasonal)



# Detection of N<sub>2</sub>O emissions from soils

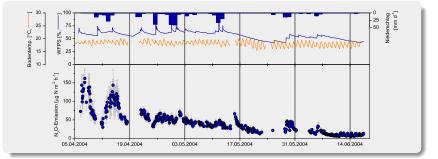
#### Methodology

- Fully-automated detection of N<sub>2</sub>O, CH<sub>4</sub> and CO<sub>2</sub> (*static chamber method*)
- Simultanuous recording of environmental factors (WFPS, soil temp.)
- Quantification of spatial heterogenity by manual measurements on other sites





# Kakamega Forest, Kenya



#### Site characteristics

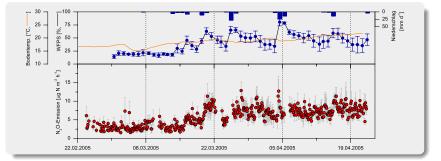
- Carbon rich soils
- Measurements at start of wet season

#### Emission characteristics

- Significant emission pulses
- Decline of N<sub>2</sub>O emissions even when WFPS remains high



# Xishuangbanna, SW-China



#### Site characteristics

- Nutrient-poor site
- Measurements in dry-wet transition (severe drought before)

#### Emission characteristics

- Very low emission level
- Low emission dynamic

# Dominant controls



#### Short-term dynamics of N<sub>2</sub>O emission

- WFPS is dominant control at both sites
- $\bullet~\mbox{WFPS}$  controls emission timing but not the integrative  $N_2O$  emission sum
- Soil temperature is of secondary importance for emission variability (small daily temperature amplitude in tropics)

# Dominant controls



#### Short-term dynamics of N<sub>2</sub>O emission

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- $\bullet~\mbox{WFPS}$  controls emission timing but not the integrative  $N_2O$  emission sum
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#### Mid-term dynamics of N<sub>2</sub>O emission

- $\bullet\,$  Amount and availability of substrate important for  $N_2O$  emission strength
- Physicochemical properties control general emission potential

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#### Introduction



### 3 Model development

4 Emission inventories



# ForestDNDC-tropica



Based on ForestDNDC-tropica [Kiese et al., 2005], PnET-N-DNDC [Stange et al., 2000]:

- Reworked vertical soil carbon profile
- Implementation of new pedotransfer functions
- Reworked model initialization (vegetation, biomass)
- Adaptation of model code for cluster environment
- Restructuring and recalibration (Site-parallel Bayesian Calibration) of model

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# **Bayesian Calibration**

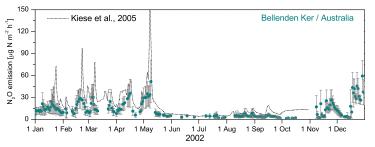


- Re-calibration of model internal parameters (pV)
- Metropolis Hastings random walk

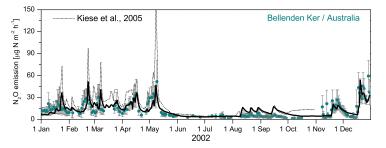
$$\Theta' = \Theta_t + \epsilon$$
 (1)

$$\beta = \frac{p(D|\Theta')p(\Theta')}{p(D|\Theta_t)p(\Theta_t)} \quad (2)$$

 also enables to calculate parameter uncertainty of pV

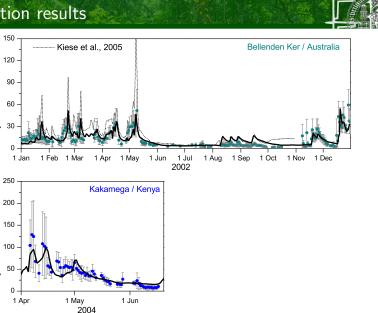




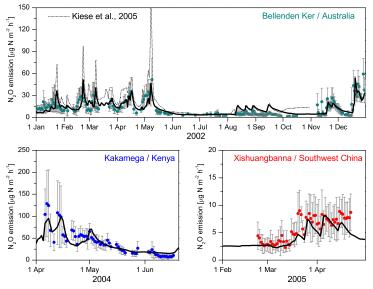


 $\rm N_{2}O$  emission [µg N m  $^{2}$  h  $^{1}$ 

 $N_2O$  emission [µg N m<sup>-2</sup> h<sup>-1</sup>]







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# Model validation





	Field site	Source	20
Calibra	ation		
1	Bellenden Ker (AU)	Kiese et al. (2003)	í16-  ⊢@́ŕ—
2	Kakamega (KE)	This study	<u> </u>
3	Xishuangbanna (CN)	This study	
			, p , b , b , b , b , b , b , b , b , b
Valida	tion		
4	Bellenden Ker (AU)	Kiese et al. (2003)	i i i i i i i i i i i i i i i i i i i
5,6	Kauri Creek (AU)	Breuer et al. (2000)	₩ 8-]
		Kiese & Butterbach-Bahl (2002)	
7,8	Massey Creek (AU)	Breuer et al. (2000)	
9	Lake Echeam (AU)	Breuer et al. (2000)	
10	La Selva (CR)	Keller & Reiners (1994)	- <u>9</u> 1 <u>9</u> 1
11	Guacimo (CR)	Liu et al. (2000)	히 전환
12	Central Rondônia (BR)	Neill et al. (1995)	
13	Jambi Province (ID)	lshizuka et al. (2002)	0 4 8 12 16 20
14	Wuasa (ID)	Purbopuspito et al. (2006)	0 4 6 12 16 20
15	Pará (BR)	Verchot et al. (1999)	Gemessene N <sub>2</sub> O-Emission [g N ha <sup>-1</sup> d <sup>-1</sup> ]

# Data integration (I)



#### Problem: Initialization of vegetation

Modell-internal initialization developed for Australian rainforests and not applicable to global scale as such

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# Data integration (I)

#### Problem: Initialization of vegetation

Modell-internal initialization developed for Australian rainforests and not applicable to global scale as such

### Solution: Simulation of local vegetation conditions

The Lund-Potsdam-Jena Dynamic Global Vegetation Model

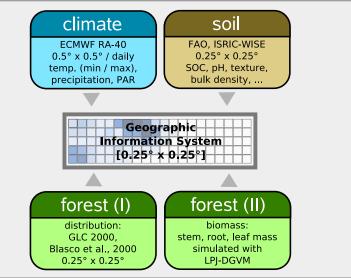
- Simulation of potential vegetation
- 1000 year spin-up simulation
- explicit output of leaf, steam and root mass

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# Data integration (II)



### Development of a Geographic Information System



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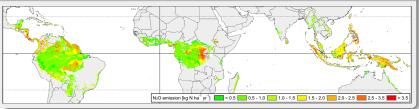


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### $N_2O$ emission inventory

## Mean annual N<sub>2</sub>O emission (1991–2000)



- $\bullet\,$  Mean annual global source strength: 1.3  $\pm$  0.3 Tg N yr^{-1}
- Pronounced spatial variability (climatic and edaphic effects)

#### Problem

Parameters of GIS are based on mean values which can be the result of broad parameter distributions in some soil groups

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#### Solution: The Latin Hypercube Sampling methodology

- Parameters: soil, biomass
- Acknowledgement of local climate conditions by grid replicates
- Combinations:  $1000 \times 200 \times 5 = 10^6$
- Advanced Monte-Carlo approach (distribution functions)

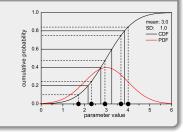


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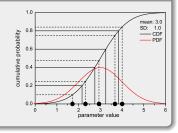


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#### Uncertainty range

Data-induced uncertainty: 0.9 - 2.4 Tg N



### Comparison of N<sub>2</sub>O inventory results

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	N <sub>2</sub> O source strength		Area	
	[Tg N yr <sup>-1</sup> ]		[10 <sup>6</sup> km <sup>2</sup> ]	
Empirical up-scaling				
Matson und Vitousek (1990)	1.8	(2.4)	14.8	
Breuer et al. (2000)	2.6	(3.6)	14.9	
Stehfest und Bouwman (2006)	1.5	(1.2)	8.5	

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### Comparison of N<sub>2</sub>O inventory results

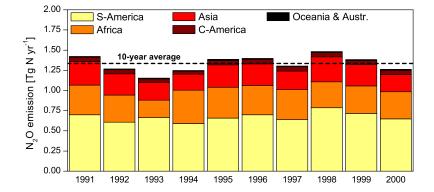
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	N <sub>2</sub> O source strength [Tg N yr <sup>-1</sup> ]		Area [10 <sup>6</sup> km <sup>2</sup> ]
<i>Empirical up-scaling</i> Matson und Vitousek (1990) Breuer et al. (2000) Stehfest und Bouwman (2006)	1.8 2.6 1.5	(2.4) (3.6) (1.2)	14.8 14.9 8.5
<i>Model-based up-scaling</i> Bouwman et al. (1995) Potter et al. (1996) Melillo et al. (2001)	1.5 1.3	(2.3) (1.3) (2.4)	16.8 10.2 5.4
This study	1.3		10.9

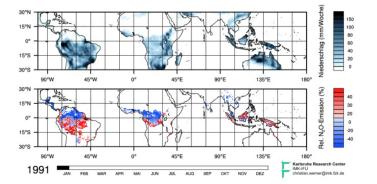
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### Inter-annual variability of N<sub>2</sub>O emissions



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#### Results

Summary

- Acquisition of detailed N<sub>2</sub>O emission datasets for model calibration
- Model improvements (ForestDNDC-tropica) and first-time application for global tropical rainforests
- $\bullet\,$  Compilation of  $N_2O$  emission inventories for the years 1991-2000 in daily resolution
- Uncertainty assessment for inventories



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- Uncertainty assessment for inventories

Using a  $\ensuremath{\mathsf{GIS}}\xspace$  coupled modelling approach for up-scaling it was shown that

- tropical rainforest soil emit 1.3 Tg N yr $^{-1}$
- $N_2O$  emissions vary substantially at the spatial scale
- N<sub>2</sub>O emissions occur with inter- und intra-annual variability
- $\bullet~N_2O$  emissions are controlled by precipitation at the global scale

## Outlook

#### Future work

- Verification of inverse models
- $\bullet$  Compilation of more  $N_2O$  emission datasets with high precision
- Improvements to model parametrization (e.g., tropical savannah biome)
- Simulation of Global Change effects
- Coupled modelling (e.g., for future climate change)







# Thank you.

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