



## Use and prediction

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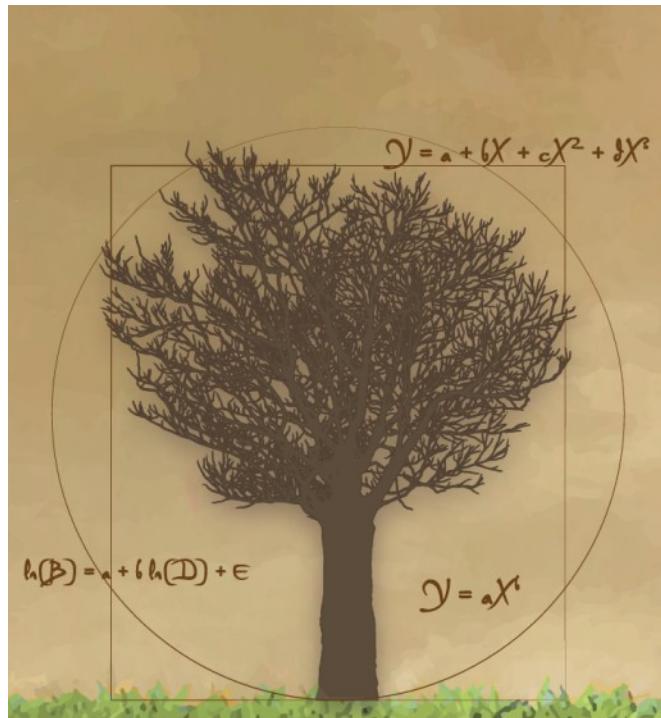
<https://hal.inrae.fr/hal-02804504v1>

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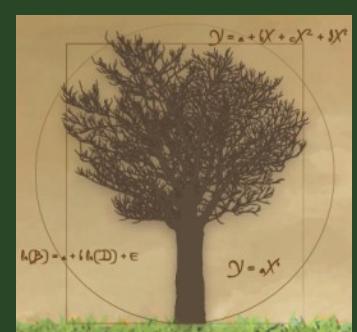
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# Use and prediction



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Gael Sola, Dr. Matieu  
Henry, Dr. Nicolas Picard

Training on tree allometric equations,  
December 10-14th 2012, Lusaka, Zambia



# Using a biomass/volume equation

- ✖ Range of calibration
- ✖ Confidence intervals for the predictions
  - ➡ Linear regression

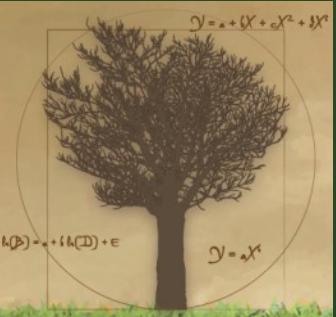
Confidence interval for the mean

$$\bar{Y}(X) \pm t_{1-\alpha/2} \hat{\sigma} \sqrt{\frac{1}{n} + \frac{(X - \bar{X})^2}{\sum_i (X_i - \bar{X})^2}}$$

Confidence interval for an individual prediction

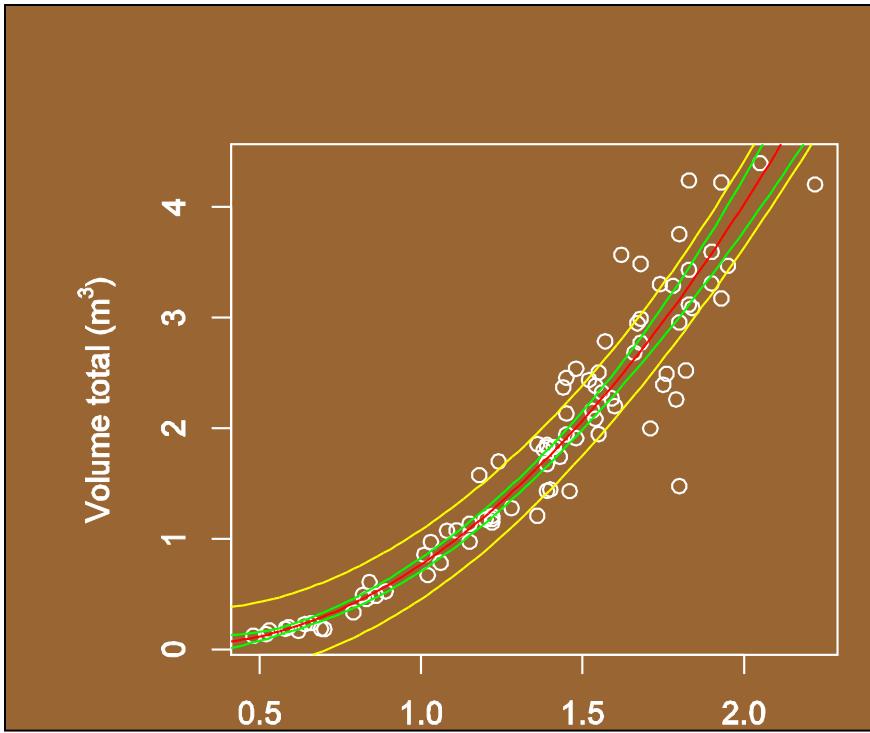
$$\bar{Y}(X) \pm t_{1-\alpha/2} \hat{\sigma} \sqrt{\frac{n+1}{n} + \frac{(X - \bar{X})^2}{\sum_i (X_i - \bar{X})^2}}$$

$t_{1-\alpha/2}$  quantile at the level  $1-\alpha/2$  for the student low at  $n-2$  degrees of freedom



# Using a biomass/volume equation

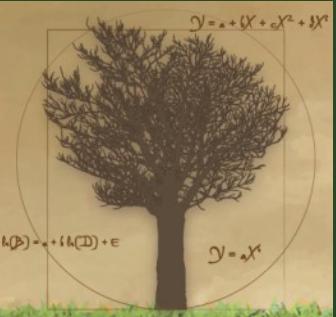
- Example: *Isoberlinia doka*



Red – model

Yellow – confidence interval for an individual tree

Green – confidence interval for the mean



# Using a biomass/volume equation

- Confidence intervals for the predictions

→ General case for linear and non linear regression,  
utilization of the delta-method (Serfling, 1980)

**Confidence interval for the mean**

$$\bar{Y}(X) \pm t_{(1-\alpha/2)} \cdot \sqrt{S_{\bar{y}}^2}$$

**Confidence interval for an individual prediction**

$$\bar{Y}(X) \pm t_{(1-\alpha/2)} \cdot \sqrt{S_{\bar{y}}^2 + \hat{\sigma}^2 \cdot \hat{\sigma}_{c,c} \cdot X^{\hat{z}}}$$

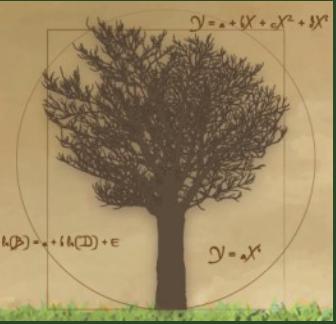
with :  $S_{\bar{y}}^2 = \left( \frac{\partial Y}{\partial \beta} \right)^T \cdot \hat{\Sigma}_{\beta} \cdot \left( \frac{\partial Y}{\partial \beta} \right)$  The variance for  $\bar{Y}$

$\left( \frac{\partial Y}{\partial \beta} \right)$  The matrix of the derivative of Y toward the model parameters

$\left( \frac{\partial Y}{\partial \beta} \right)^T$  The transposed matrix of  $\left( \frac{\partial Y}{\partial \beta} \right)$

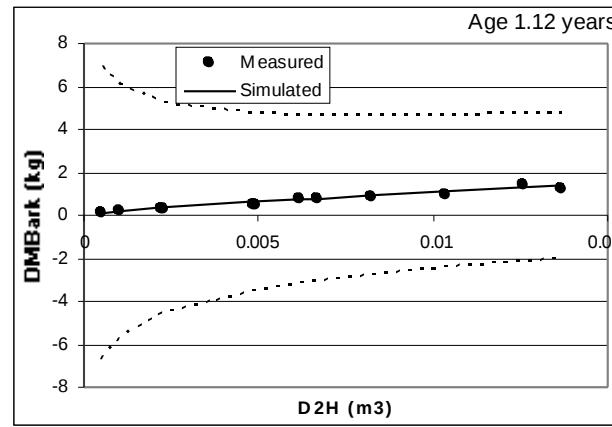
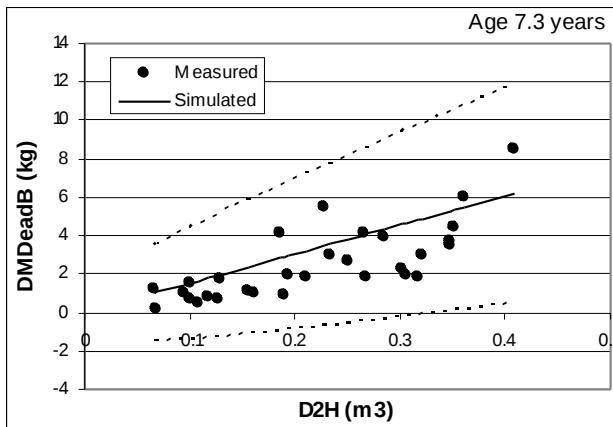
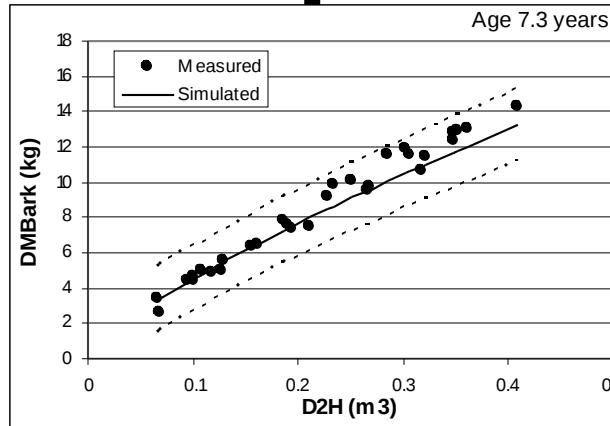
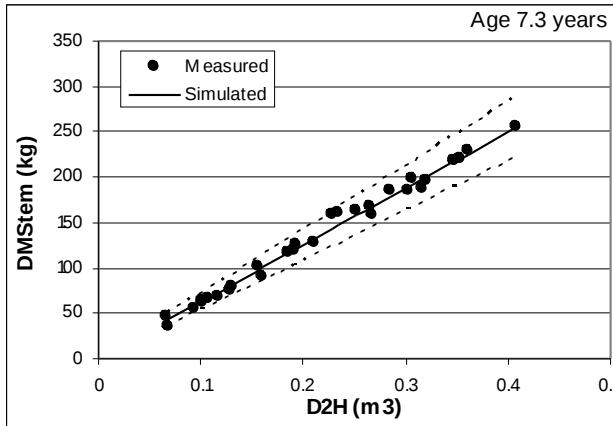
$\hat{\Sigma}_{\beta}$  The covariance matrix of the parameters

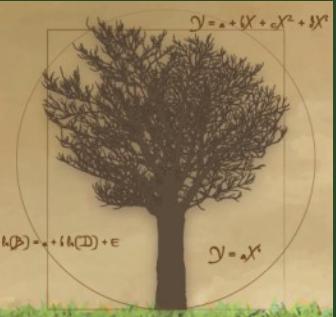
$\hat{\sigma}^2$	The variance of errors of the given compartment
$\hat{\sigma}_{c,c}$	The variance of errors of the given compartment regarding the whole system of equation
$X^{\hat{z}}$	The weighting function



# Using a biomass/volume equation

Example : Eucalyptus in Congo (Saint-Amandé et al., 2005)





# Using a biomass/volume

- From the tree to the stand, Monte-Carlo simulations

**equation**

Model for variance

$$Y = f(\beta, X) + \varepsilon(\gamma, X)$$

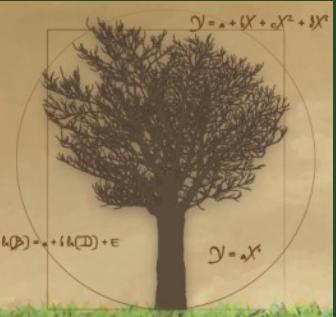
Model for mean

$$\mu = \beta_1 + (\beta_2 - \beta_3 \text{age} + \beta_4 e^{-\beta_5 \text{age}}) d^2 h$$

**Y = f(input data, parameters, error term)**

Diameter (d) and height (h). Both contained errors. We assumed that  
 $\sigma=0.3$  cm for diameter  
 $\sigma=3\%$  of height if less than 15 m  
 $\sigma=1$  m if above 15 m

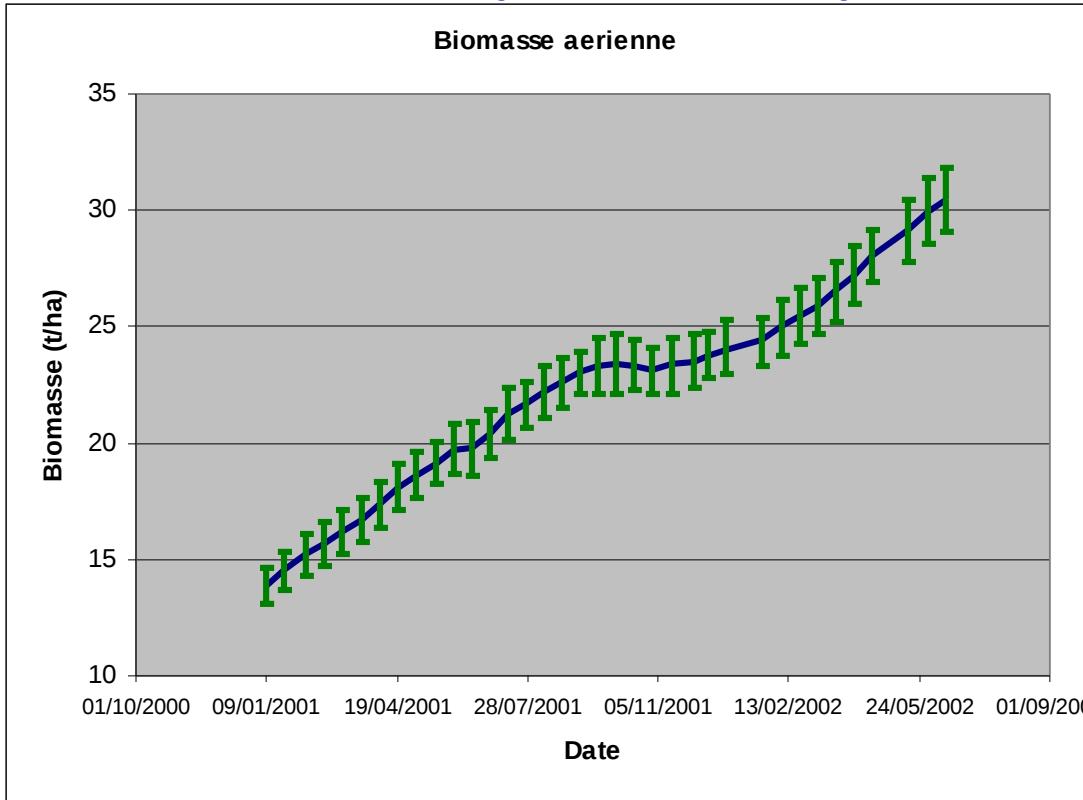
$\beta, \gamma$  : estimated by the fitting procedure. We got their mean and their asymptotic standard deviation.  
They are correlated (within a given compartment and between compartments)



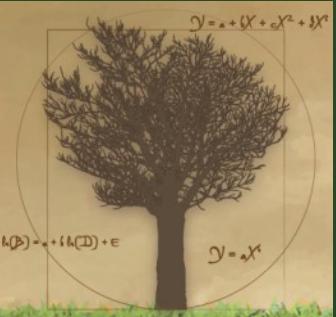
# Using a biomass/volume equation

- From the tree to the stand, Monte-Carlo simulations

Only the error term vary



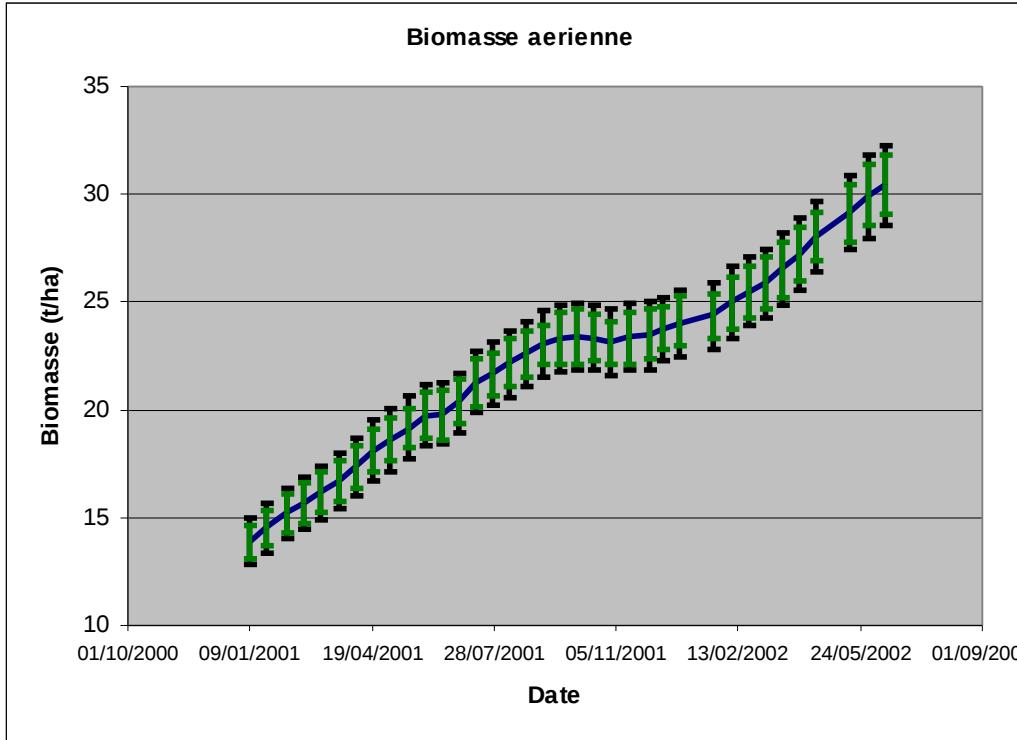
$$Y = a + b.X + N(0, \sigma)$$



# Using a biomass/volume equation

- From the tree to the stand, Monte-Carlo simulations

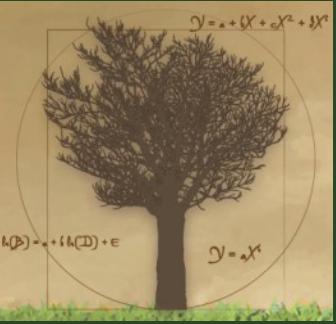
Error term & parameters of the mean vary



$$Y = a + b.X + N(0, \sigma)$$

$$N(\alpha, \sigma\alpha)$$

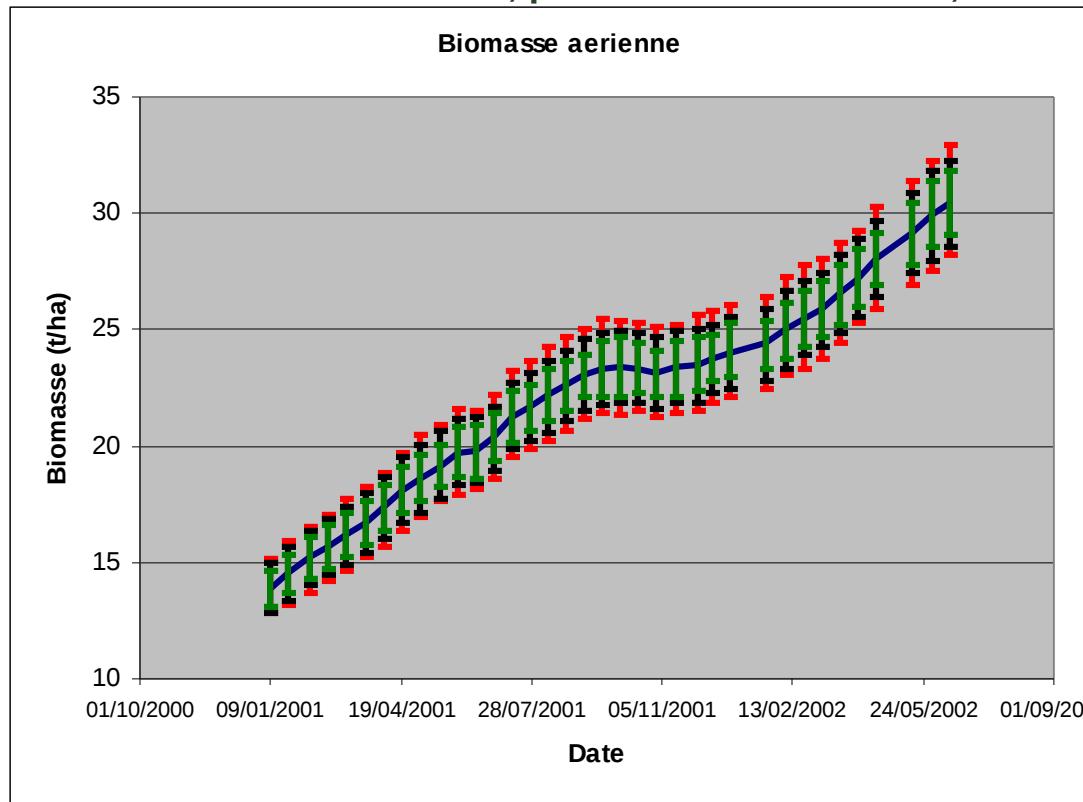
$$N(\beta, \sigma\beta)$$



# Using a biomass/volume

- From the tree to the stand, Monte-Carlo **equation** simulations

Error term, parameters of the mean, and input data vary

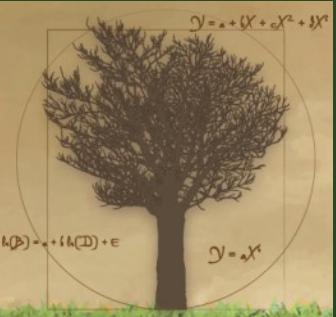


$$Y = a + b.X + N(0, \sigma)$$

$$N(\alpha, \sigma\alpha)$$

$$N(\beta, \sigma\beta)$$

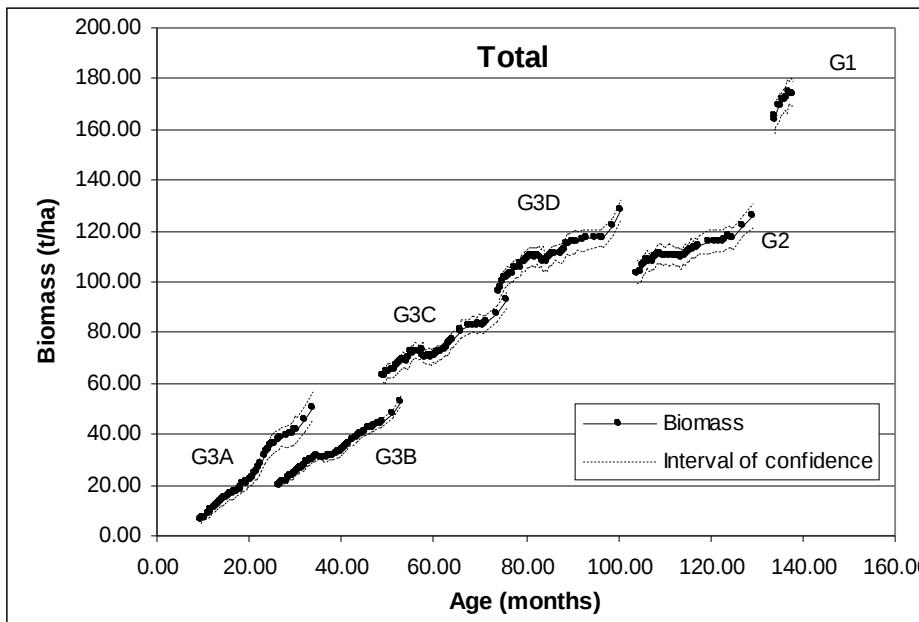
$$N(\Xi, \sigma\xi)$$



# Using a biomass/volume

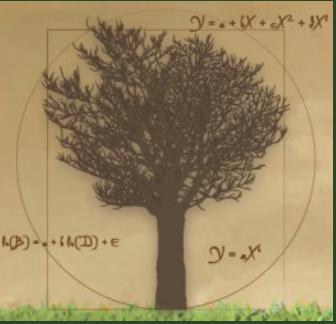
- From the tree to the stand, Monte-Carlo **equation** simulations

For most compartments, standard errors were small with regard to standing biomass (below 10%)



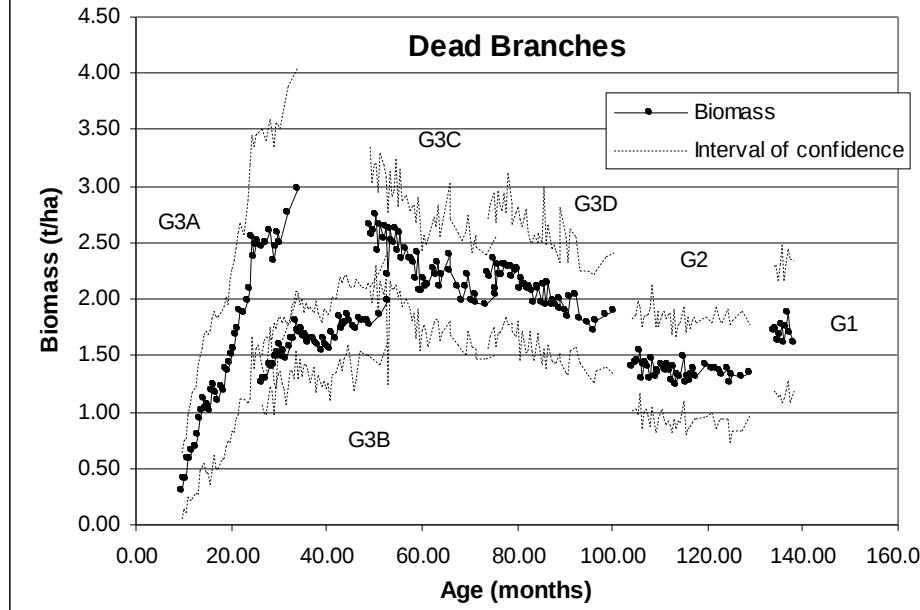
At 100 months :

Total biomass =  $128 \pm 1.9$  t/ha  
Above-Ground =  $104 \pm 1.8$  t/ha  
Below-ground =  $24 \pm 1$  t/ha



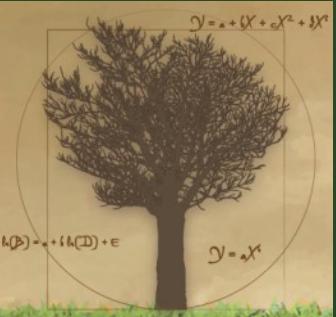
# Using a biomass/volume

- From the tree to the stand, Monte-Carlo **equation** simulations  
**Except for the dead branches biomass (worst model)**



At 100 months :

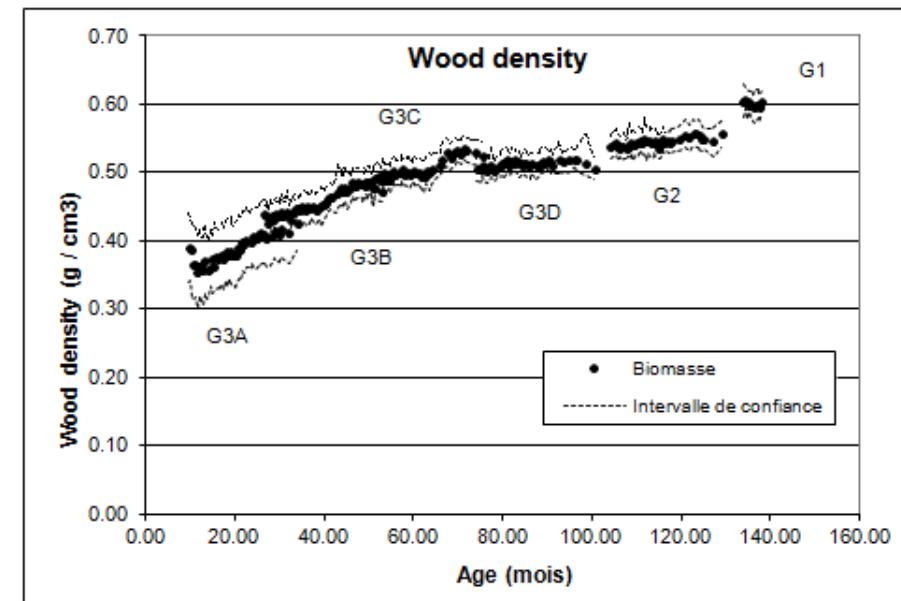
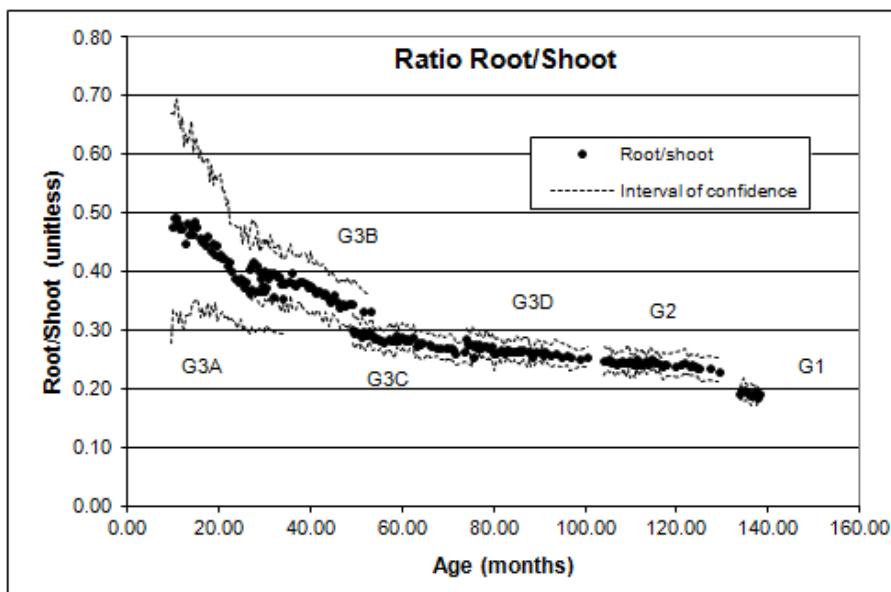
Dead B =  $1.9 \pm 0.3$  t/ha

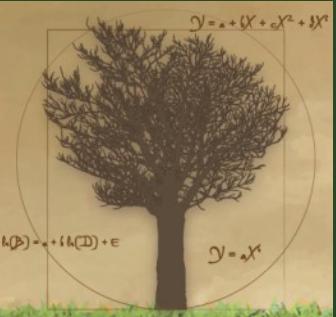


# Using a biomass/volume equation

- From the tree to the stand, Monte-Carlo simulations

Same principles of simulations can be applied also to ratios (root-shoot, wood density, etc.)





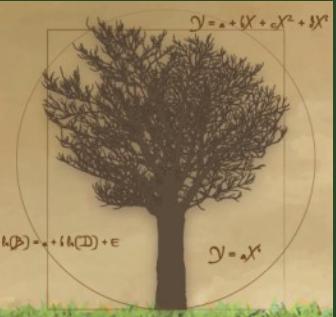
# Using a biomass/volume equation

- From the tree to the stand, Monte-Carlo simulation

## Biomass increments

Plot	Age (months)	Year	Start date	End date	Total biomass increment (t/ha)
G3A	9 to 22	2001	23/03/2001	23/03/2002	19.5 ± 1.6
G3A	22 to 34	2002	23/03/2002	02/04/2003	25.6 ± 3.3
G3B	26 to 38	2001	08/01/2001	27/12/2001	12.0 ± 0.9
G3B	38 to 49	2002	27/12/2001	28/11/2002	12.9 ± 1.0
G3C	49 to 61	2001	12/01/2001	11/01/2002	9.6 ± 1.9
G3C	61 to 74	2002	11/01/2002	31/01/2003	15.3 ± 2.4
G3D	74 to 86	2001	13/01/2001	11/01/2002	14.7 ± 2.9
G3D	86 to 99	2002	11/01/2002	31/01/2003	10.9 ± 2.8

Standard errors were relatively large (from 7 to 25 % of the biomass increment)  
 For the eddy-correlation site,  $\Delta \text{biomass}_{2002} = 12.9 \pm 1.0 \text{ t/ha/year}$

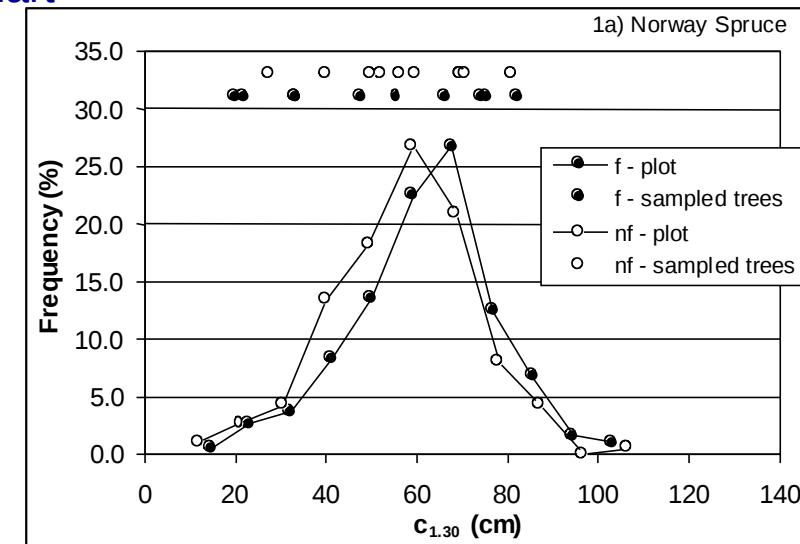
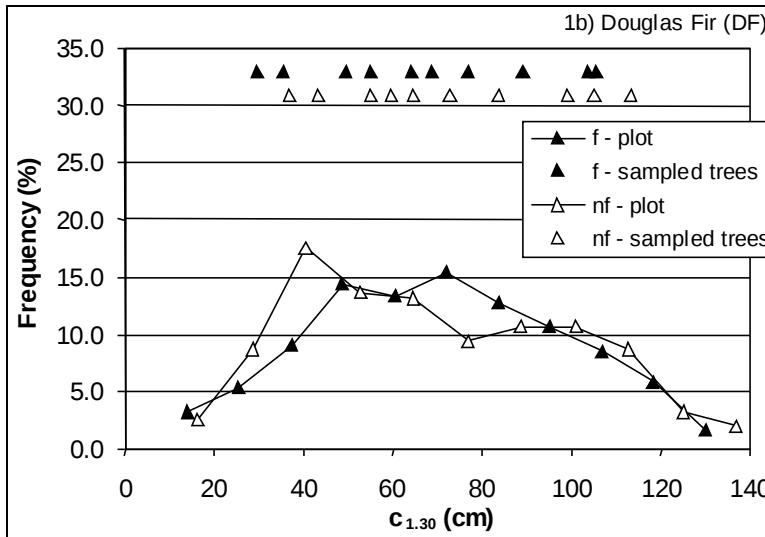


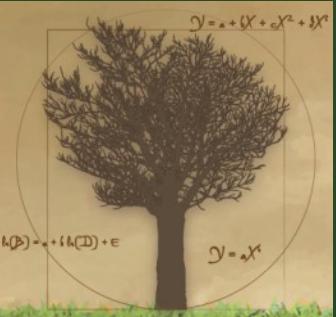
# Using a biomass/volume equation

- Behind the single estimation of biomass, there is understanding of the ecosystem functioning

Example Sicard et al. 2005 (accepted in Trees, Structure and Function).  
Fertilization effect on Spruce and Douglas fir

Step 1 : analysis of the bar chart



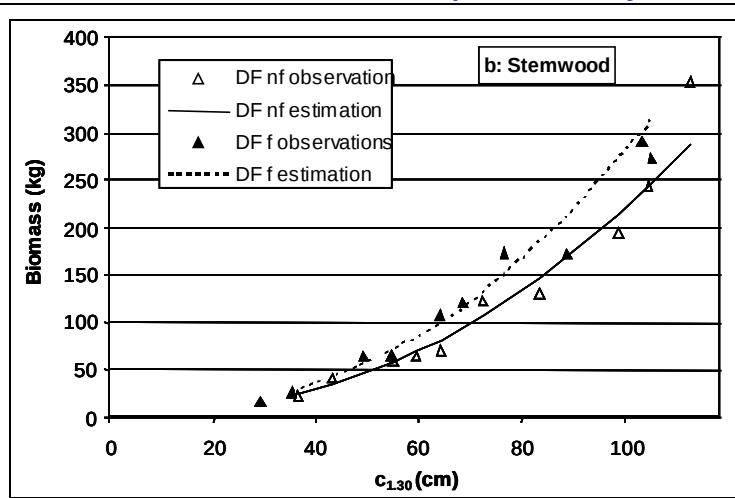


# Using a biomass/volume equation

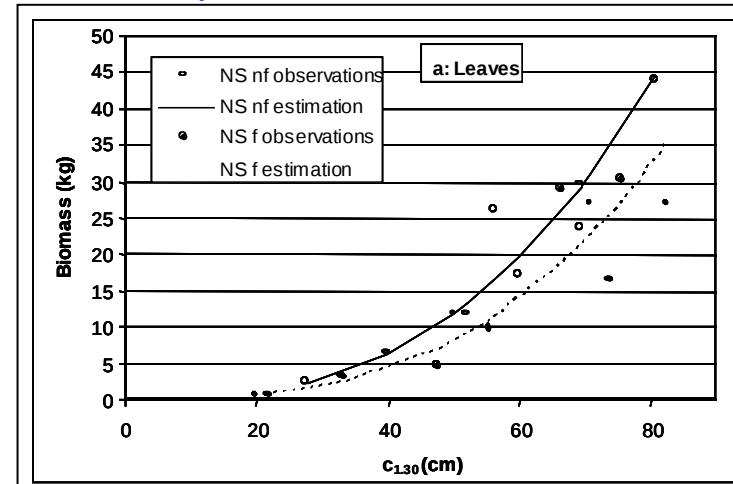
- Behind the single estimation of biomass, understanding of the ecosystem functioning

Example Sicard et al. 2005 (accepted in Trees, Structure and Function).  
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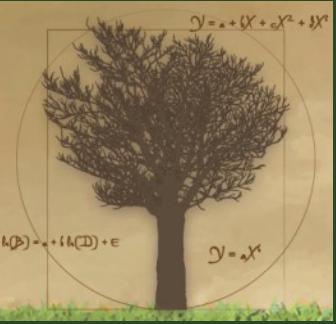
## Step 2 : analysis of the biomass equations



Douglas differences are only significant for the TRUNK



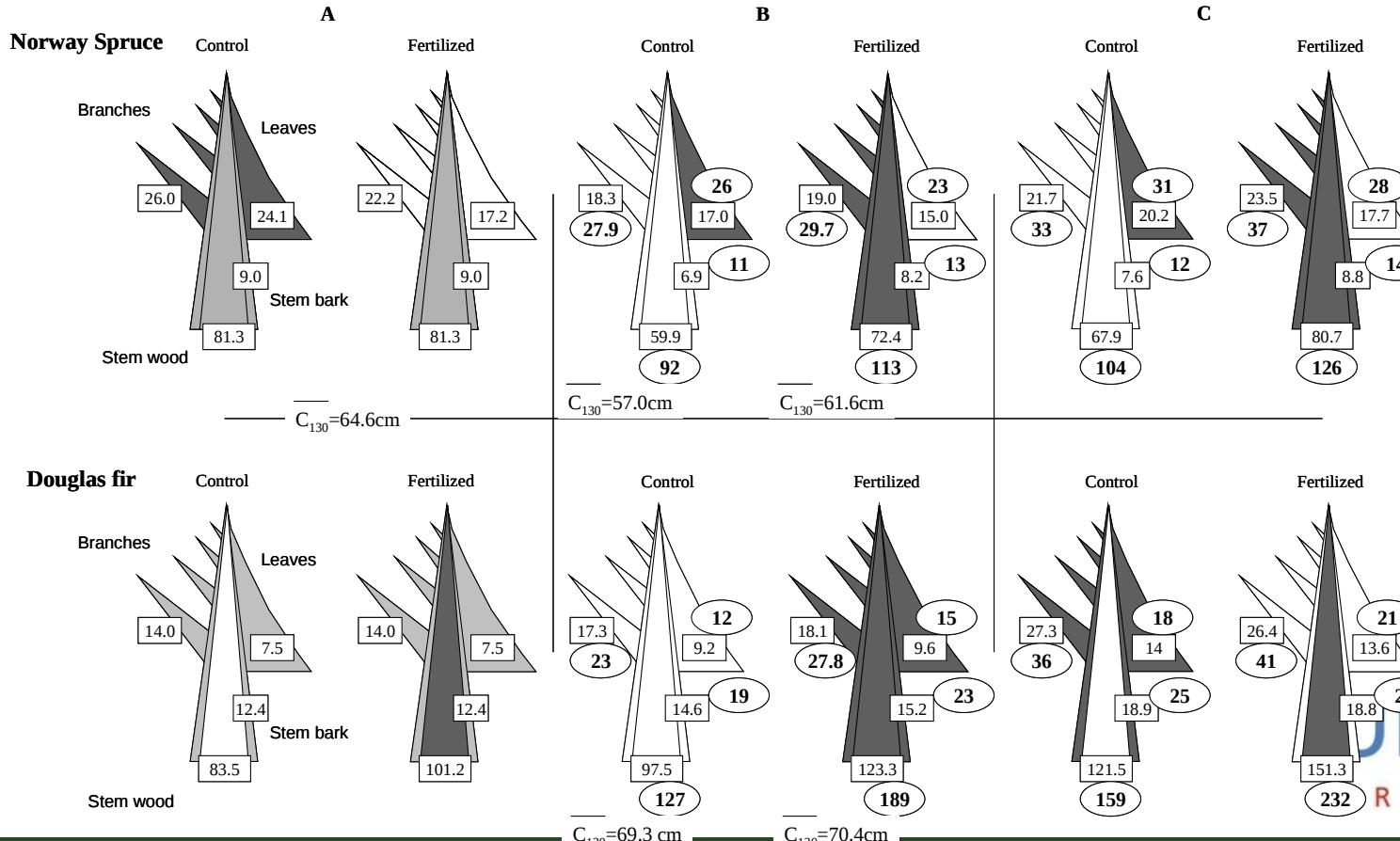
Spruces differences are only significant for the LEAVES



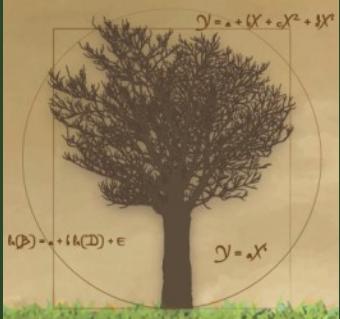
# Using a biomass/volume equation

- Behind the single estimation of biomass, there is understanding of the ecosystem functioning

Step 3 : decomposition of the fertilization effect on a per hectare basis



# Additional Resources



**Manual for building tree volume and biomass allometric equations**

From field measurement to prediction

**Summary of the manual for building tree volume and biomass allometric equations**

From field measurement to prediction

**Manual for building volume and biomass equations (in French and soon available in English and in Spanish)**

**cirad**

**Summary of the manual for building tree volume and biomass allometric equations**

From field measurement to prediction

**Manual for building volume and biomass equations (in French and soon available in English and in Spanish)**

**cirad**

The complexity of tree growth

17



Project no. 037132  
**CARBOAFRICA**  
 Quantification, understanding and prediction of carbon cycle, and other  
 GHG gases, in Sub-Saharan Africa  
 Sixth Framework Programme of European Commission  
 Priority 1.1.6.3: Global Change and Ecosystems  
 STREP (Specific Targeted Research Project)



**Literature review on current methodologies to assess C balance in CDM**  
 Literature review on current methodologies to assess C balance in CDM  
 Afforestation/reforestation projects and a few relevant alternatives for assessing water and nutrient balance, as a complement to carbon sequestration assessments.

Saint-André L.<sup>a,\*</sup>, Rousaud O.<sup>a,\*\*</sup>, Joubert C.<sup>a</sup>, Libouy M.<sup>b</sup>, Bon A.<sup>c</sup>, D'Annunzio R.<sup>c,d</sup>, Le Grandcourt A.<sup>a,\*\*</sup>, Jourdan C.<sup>e</sup>, Derrien D.<sup>a</sup>, Picard N.<sup>a</sup>, Zeller C.<sup>a</sup>, Gouraud J.M.<sup>a</sup>, Levillain J.<sup>a</sup>, Henne M.<sup>d</sup>, Gonsalves J.<sup>a,\*\*</sup>, Delaporte P.<sup>a</sup>, Bouillet J.-P.<sup>a</sup>, Lachou J.P.<sup>a,\*\*</sup>

- ▲ CIRAD, UPR80 "Ecosystèmes et Plantes", Montpellier, F-34326 France
- CATIE, Turrialba, 7170 Costa Rica
- USP, IAG and Ciencias Florestais, São Paulo, Brazil
- UR2PI, Plateau et milieux, Pointe-Noire, RD Congo
- ◎ Ifra, Biogéochimie des Ecosystèmes Forestiers, Nancy, F-54296 France
- \* CIRAD, UPR37 "Dynamique des forêts tropicales", Montpellier, F-34326 France
- \*\* UNITUS, DISAFRI, Viterbo, IT-01100 Italy

Actual submission date: 05/11/2007

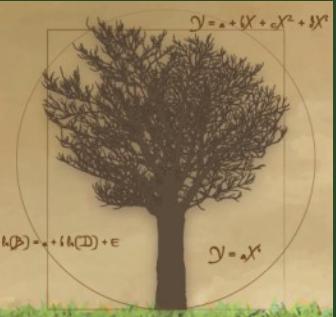
Start date of project: 01/10/06  
 Organisation name of lead contractor for this deliverable: CIRAD

Duration: 3 years  
 Revision [1]

Project co-financed by the European Commission within the Sixth Framework Programme (2002-2006)		
Dissemination Level		
PU	Public	PU
PP	Restricted to other programme participants (including the Commission Services)	
RE	Restricted to a group specified by the consortium (including the Commission Services)	
CO	Confidential, only for members of the consortium (including the Commission Services)	

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**UN-REDD**  
 P R O G R A M M E

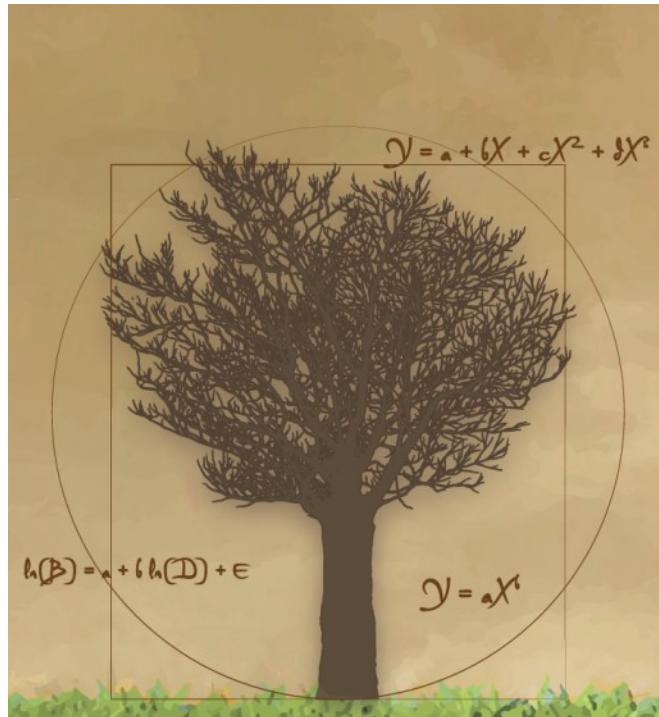


# Many thanks to....

***Dr. Stephen Adu-Bredou, Angela Amo-Bediako, Dr. Winston Asante, Dr. Aurélien Besnard, Fabrice Bonne, Noëlle Bouxiero, Emmanuel Cornu, Dr. Christine Deleuze, Serge Didier, Justice Eshun, Charline Freyburger, Dominique Gelhaye, Dr. Astrid Genet, Dickson Gilmour, Hugues Yvan Gomat, Dr. Christophe Jourdan, Dr. Jean-Paul Laclau, Dr. Arnaud Legout, Lawrence et Susy Lewis, Dr. Fleur Longuetaud, Dr. Raphaël Manlay, Jean-Claude Mazoumbou, Adeline Motz, Dr. Alfred Ngomanda, Dr. Yann Nouvellon, Dr. Claude Nys, Charles Owusu-Ansah, Thierry Paul, Régis Peltier, Dr. Jacques Ranger, Michaël Rivoire, Dr. Olivier Roupsard, Dr. Armel Thongo M'bou and Prof. Riccardo Valentini***

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- Thank you for your attention,
- Any question ?



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