

Master thesis

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## Résumé et Abstract

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## Acknowledgments

I would like to thank...

## Introduction

Sustainable forest management in the tropics (i.e. managed selective harvesting of timber) has been widely promoted internationally to combat tropical deforestation and degradation [Zimmerman and Kormos, 2012]. Currently tropical logging accounts for one eighth of global timber production [Blaser et al., 2011] and is still increasing. Most tropical timber production originates from selective logging, the targeted harvesting of timber from commercial species in a single cuttint cycle [Martin et al., 2015].

On the other hand, tropical rainforests have fascinated ecologists due to their outstanding diversity [Connell, 1978]. Effectively tropical forests host over half of the Earth's biodiversity [Scheffers et al., 2012]. High biodiversity from tropical rainforests is the source of many ecosystem functions. Amongst others, tropical forests play a key role in biogeochemical cycles, including carbone storage [Lewis et al., 2004]. **Add insights into carbon storage role of tropical forest.** Ecosystem functions from tropical forests support numerous ecosystem services, such as timber production and climate regulation.

But several authors argue that selective logging represents a major threat to biodiversity [Carreño-Rocabado et al., 2012, de Avila et al., 2015, Gibson et al., 2013, Martin et al., 2015, Zimmerman and Kormos, 2012], challenging the sustainable definition from current selective logging. We consequently need to assess both short and long term impacts of selective logging on tropical forest ecosystems to implement better syslvicultural practives in order to reach sustainability.

The question of selective logging impact on tropical forest can be directly related to the emerging field of biodiversity and ecosystem fonctionning [Loreau, 2000]. Tropical forest outstanding biodiversity will be both a factor and a result of forest ecosystem response to logging disturbance. And forest ecosystem response to logging disturbance will directly modify ecosystem fonctionning in both short and long term. Consequently assessing selective logging effect on tropical forest linking biodiversity and ecosystem seems an obvious and promising way [Loreau, 2010]. **Paragraph to fully review !**

Negative short term impacts of selective logging have been assessed [Carreño-Rocabado et al., 2012; de Avila et al., 2015; but see Martin et al., 2015]. Much less is known about the long term impact [Osazuwa-Peters et al., 2015]. The main reason is the difficulty to conduct long term empirical study [but see Herault et al., 2010], which can be completed by the use of forest simulators [Huth et al., 2004, Köhler and Huth, 2004, Rüger et al., 2008, Tietjen and

Huth, 2006]. Individual-based models of forest dynamics present the perfect framework to develop such joint biodiversity-ecosystem approaches [Maréchaux and Chave]. Individual-based models describe forest ‘patches’ accumulating carbon through time, assessing tree growth within the patch, or releasing carbon through gap opening [Bugmann, 2001]. Up to several dozens of different Plant Functional Types (PFTs) are generally defined and models can sometimes be fully spatially explicit [Pacala et al., 1996]. Recently, the forest growth simulator TROLL [Chave, 1999], an individual-based and spatially explicit forest model, was developped to introduce recent advances in plant physiological community. TROLL model relates physiological processes to species-specific functional traits [Maréchaux and Chave]. Consequently, TROLL model allow to simulate fully a neotropical forest biodiversity to study biodiversity-ecosystem functioning link response to logging disturbance.

**Major question greater diversity (taxonomic and functional) brought a better resilience to disturbance ?**

# 1 Model description

## 1.1 Overview

TROLL model each tree individually in a located environment. Thus TROLL model, alongside with SORTIE [Pacala et al., 1996, Uriarte et al., 2009] and FORMIND [Fischer et al., 2016, Köhler and Huth, 1998], can be defined as an individual-based and spatially explicit forest growth model. TROLL simulates the life cycle of individual trees from recruitment, with a diameter at breast height (dbh) above 1 cm, to death with growth and seed production. Trees are growing in a located light environment explicitly computed within voxels of  $1\text{ m}^3$ . Each tree is consistently defined by its age, diameter at breast height (dbh), height (h), crown radius (CR), crown depth (CD) and leaf area (LA) (see figure 1). Tree geometry is calculated with allometric equations but leaf area vary dynamically within each crown following carbon allocations. Voxels resolution of  $1\text{ m}^3$  allow the establishment of maximum one tree by  $1\text{ x }1\text{ m}$  pixels. Each tree is flagged with a species label inherited from the parent tree through the seedling recruitment. A species label is associated to a number of species specific parameters (see table 1) related to functional trait values which can be sampled on the field.

Carbon assimilation is computed over half-hourly period of a representative day. Then allocation is computed to simulate tree growth from an explicit carbone balance (in contrast to previous models). Finally environment is updated at each timestep set to one month. Seedlings are not simulated explicitly but as a pool. In addition belowground processes, herbaceous plants, epiphytes and lianas are not simulated inside TROLL. The source code is written in C++ and

Table 1: Species-specific parameters used in TROLL from @Li. Data originates from the BRIDGE [Baraloto2010] and TRY [Kattge2011] datasets.

Abbreviation	Description	Units
\$LMA\$	leaf mass per area	$\text{g.m}^{-2}$
\$N\_m\$	leaf nitrogen content per dry mass	$\text{mg.g}^{-1}$
\$P\_m\$	leaf phosphorous content per dry mass	$\text{mg.g}^{-1}$
\$wsg\$	wood specific gravity	$\text{g.cm}^{-3}$
\$dbh_{\{thresh\}}\$	diameter at breast height threshold	\$m\$
\$h_{\{lim\}}\$	asymptotic height	\$m\$
\$a\_h\$	parameter of the tree-height-dbh allometry	\$m\$

available upon request. All analyses were conducted in R version 3.4.0 **Cite R, add entry in Mendeley.**

## 1.2 Abiotic environment

A voxel space, with a resolution of  $1\text{ m}^3$ , is used to explicitly model the abiotic environment. For each tree crown, leaf area density is calculated on tree geometry assuming a uniform distribution across voxels occupied by the crown. Leaf area density is computed within each voxel summing all tree crowns inside the voxel  $v$ , and is denoted  $LAD(v)$  (leaf area per voxel in  $\text{m}^2.\text{m}^{-3}$ ). The vertical sum of  $LAD$  from voxel  $v$  to the ground level defines  $LAI(v)$  (leaf area per ground area in  $\text{m}^2.\text{m}^{-2}$  commonly called leaf area index):

$$LAI(v) = \sum_{v'=v}^{\infty} LAD(v') \quad (1)$$

Daily variations in light intensity (photosynthetic photon flux density PPFD in  $\mu\text{mol}_{photons}.\text{m}^{-2}.\text{s}^{-1}$ ), temperature (T in degrees Celsius), and vapor pressure deficit (VPD in  $kPA$ ) are computed to assess carbon assimilation within each voxel of the canopy and for a representative day per month (see Appendix 1 from Maréchaux and Chave for further details). Variation of PPFD Within the canopy is calculated as a local Beer-Lambert extinction law:

$$PPFD_{max,month}(v) = PPFD_{top,max,month} * e^{-k*LAI(v)} \quad (2)$$

The daily maximum incident PPFD at the top of canopy  $PPFD_{top,max,month}$  is given as input. The extinction rate  $k$  is assumed as constant, besides is variation with zenith angle and species leaf inclination angle [Meir et al., 2000]. Moreover only vertical light diffusion is considered ignoring lateral light diffusion, which can have an important role especially in logging gaps. Finally, intra-day variation at half hour time steps  $t$  for a representative day every month are

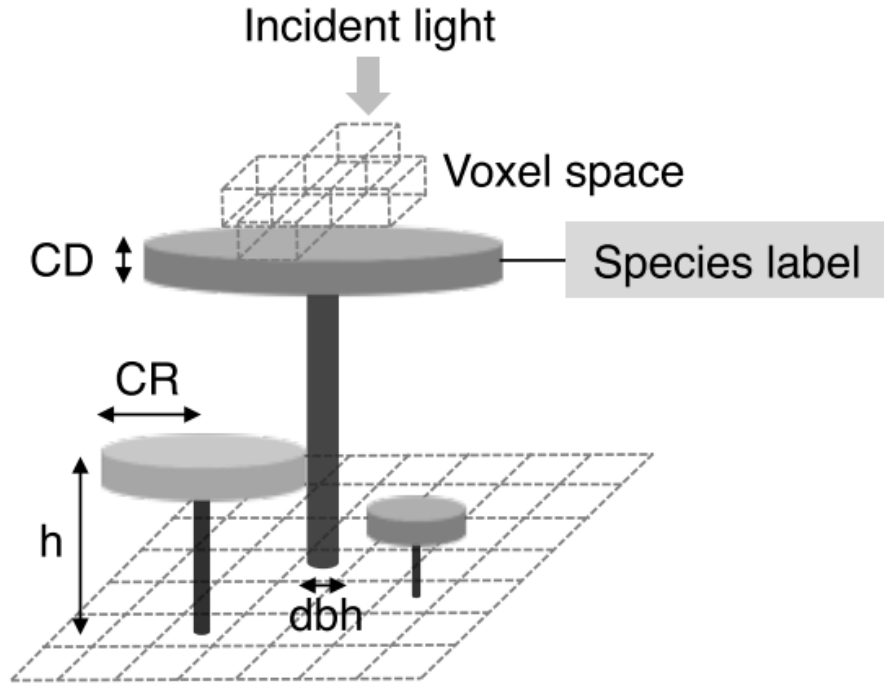


Figure 1: Individuals tree inside TROLL explicit spatial grid from [Maréchaux and Chave](#). Tree geometry (crown radius CR, crown depth CD, height h, diameter at breast height dbh) is updated at each timestep following allometric relationship with assimilated carbon allocated to growth. Each tree is flagged with a species label linking to its species-specific attributes. Light is computed explicitly at each timestep for each voxel.



used to compute  $PPFD_{month}(v, t)$ ,  $T_{month}(v, t)$  and  $VPD_{month}(v, t)$ . Water and nutrient process both in soil and inside trees are not simulated.

## 1.3 Photosynthesis

### 1.3.1 Theory

Troll simulates the carbon uptake of each individual with the Farquhar, von Caemmerer and Berry model of C3 photosynthesis [Farquhar et al., 1980]. Gross carbon assimilation rate ( $A$  in  $\mu mol CO_2.m^{-2}.s^{-1}$ ) will be the minimum of either Rubisco activity ( $A_v$ ) or RuBP generation ( $A_j$ ):

$$A = \min(A_v, A_j) \mid A_v = V_{cmax} * \frac{c_i - \Gamma^*}{c_i + K_m} ; A_j = \frac{J}{4} * \frac{c_i - \Gamma^*}{c_i + 2 * \Gamma^*} \quad (3)$$

$V_{cmax}$  is the maximum rate of carboxylation ( $\mu mol CO_2.m^{-2}.s^{-1}$ ).  $c_i$  is the  $CO_2$  partial pressure at carboxylation sites.  $\Gamma^*$  is the  $CO_2$  compensation point in absence of dark respiration.  $K_m$  is the apparent knietic constant of the Rubisco. And  $J$  is the electron transport rate ( $\mu mole^{-}.m^{-2}.s^{-1}$ ).  $J$  depends on the light intensity with  $PPFD$ :

$$J = \frac{1}{2 * \theta} * [\alpha * PPFD + J_{max} - \sqrt{(\alpha * PPFD + J_{max})^2 - 4 * \theta * \alpha * PPFD * J_{max}}] \quad (4)$$

$J_{max}$  is the maximal electron transport capacity ( $\mu mole^{-}.m^{-2}.s^{-1}$ ).  $\theta$  is the curvature factor. And  $\alpha$  is the apparent quantum yield to electron transport ( $mole^{-}.mol photons^{-1}$ ).

Carbon assimilation by photosynthesis will then be limited by the  $CO_2$  partial pressure at carboxylation sites. Stomata controls the gas concentration at carboxylation sites throught stomatal transport:

$$A = g_s * (c_a - c_i) \quad (5)$$

$g_s$  is the stomatal conductance to  $CO_2$  ( $mol CO_2.m^{-2}.s^{-1}$ ). TROLL simulates stomatal conductance  $g_s$  with the model from [Medlyn et al., 2011]:

$$g_s = g_0 + (1 + \frac{g_1}{\sqrt{VPD}}) * \frac{A}{c_a} \quad (6)$$

$g_0$  and  $g_1$  are parameters from the model. TROLL model assume  $g_0 \approx 0$  (empirically tested and considered as reasonable).

### 1.3.2 Parametrization

Leaf traits can be used as proxy of photosynthesis, especially leaf nutrient content which directly play a role in it [Wright et al., 2004]. Domingues et al. [2010] suggested that  $V_{cmax}$  and  $J_{max}$  were both limited by the leaf concentration of nitrogen  $N$  and phosphorus  $P$  ( $mg.g^{-1}$ ):

$$\log_{10}V_{cmax-M} = \min( \begin{matrix} -1.56 + 0.43 * \log_{10}N - 0.37 * \log_{10}LMA \\ -0.80 + 0.45 * \log_{10}P - 0.25 * \log_{10}LMA \end{matrix} ) \quad (7)$$

$$\log_{10}J_{max-M} = \min( \begin{matrix} -1.50 + 0.41 * \log_{10}N - 0.45 * \log_{10}LMA \\ -0.74 + 0.44 * \log_{10}P - 0.32 * \log_{10}LMA \end{matrix} ) \quad (8)$$

$V_{cmax-M}$  and  $J_{max-M}$  are the photosynthetic capacities at  $25^{\circ}C$  of mature leaves per leaf dry mass (resp.  $\mu molCO_2.g^{-1}.s^{-1}$  and  $\mu mole^{-}.g^{-1}.s^{-1}$ ).  $LMA$  is the leaf mass per are ( $g.cm^{-2}$ ).  $V_{cmax}$  and  $J_{max}$  are calculated by multiplying  $V_{cmax-M}$  and  $J_{max-M}$  by  $LMA$ .  $V_{cmax}$  and  $J_{max}$  variation with temperature are calculated with Bernacchi et al. [2003] (see Appendix 2 from Maréchaux and Chave for further details).

TROLL computes leaf carbon assimilation  $A_l$  combining equations from (3) to (8) for each tree crown voxel within in each crown layer  $l$ :

$$A_l = \frac{1}{n_v * t_M} * \sum_v \sum_{t=1}^{t_M} A(PPFD_{month}(v,t), VPD_{month}(v,t), T_{month}(v,t)) \quad (9)$$

$PPFD_{month}(v,t)$ ,  $VPD_{month}(v,t)$ , and  $T_{month}(v,t)$  are derived from microclimatic data.  $n_v$  is the number of voxels within crown layer  $l$ . And the sum is calculated over the  $t_M$  half-hourly intervals  $t$  of a typical day.

## 1.4 Autotrophic respiration

A large fraction of plants carbon uptake is actually used for plant maintenance and growth respiration. The autotrophic respiration can represents up to 65% of the gross primary productivity but varies strongly among species, sites, and environnements.

TROLL uses Atkin et al. [2015] database of mature leaf dark respiration and associated leaf traits to compute leaf maintenance respiration:

$$R_{leaf-M} = 8.5431 - 0.1306 * N - 0.5670 * P - 0.0137 * LMA + 11.1 * V_{cmax-M} + 0.1876 * N * P \quad (10)$$

$R_{leaf-M}$  is the dark respiration rate per leaf dry mass at a temperaure of  $25^{\circ}C$  ( $nmolCO_2.g^{-1}.s^{-1}$ ). The other terms are in equations (7) and (8). TROLL

assume leaf respiration during day light to be 40% of leaf dark respiration, and computes total leaf respiration by accounting for the length of daylight.

TROLL model stem respiration ( $R_{stem}$  in  $\mu mol C.s^{-1}$ ) with a constant respiration rate per volume of sapwood:

$$R_{stem} = 39.6 * \pi * ST * (dbh - ST) * (h - CD) \quad (11)$$

dbh, h, CD and ST are tree diameter at breast height, height, crown depth and sapwood thickness, respectively ( $m$ ). TROLL assumes  $ST = 0.04 m$  when  $dbh > 30 cm$  and an increasing  $ST$  for lower  $dbh$ .

Finally, TROLL computes both fine root maintenance respiration, as half of the leaf maintenance respiration. Whereas coarse root and branch maintenance respiration is computed as half of the stem respiration. And growth respiration ( $R_{growth}$ ) is assumed to account for 25% of the gross primary productivity minus the sum of maintenance respirations.

## 1.5 Net carbon uptake

Net primary production of carbon for one individual  $NPP_{ind}$  ( $gC$ ) is computed by the balance between gross primary production  $GPP_{ind}$  and respirations  $R$ :

$$NPP_{ind} = GPP_{ind} - R_{maintenance} - R_{growth} \quad (12)$$

TROLL partitions individuals total leaf area  $LA$  into three pools for different leaf age classes corresponding to different photosynthesis efficiency (young, mature and old leaves with  $LA_{young}$ ,  $LA_{mature}$ , and  $LA_{old}$  respectively). Consequently we can compute growth primary production for one individual as:

$$GPP_{ind} = 189.3 * \Delta t * \sum_{l=\lfloor h-CD \rfloor + 1}^{\lfloor h \rfloor} [A_l] * \left( \frac{LA_{young}}{2} + LA_{mature} + \frac{LA_{old}}{2} \right) \quad (13)$$

h and CD are tree height and crown depth, respectively ( $m$ ).  $\lfloor x \rfloor$  is the rounding function.  $\Delta t$  is the duration of a timestep ( $year$ ).

Thus, TROLL can compute carbon allocation to wood into an increment of stem volume  $\Delta V$  ( $m^3$ ):

$$\Delta V = 10^{-6} * \frac{f_{wood} * NPP_{ind}}{0.5 * wsg} * Senesc(dbh) \quad (14)$$

$f_{wood}$  is the fixed fraction of NPP allocated to stem and branches.  $wsg$  is the wood specific gravity ( $g.cm^{-3}$ , see 1). TROLL assume large trees less efficient to convert NPP as growth by using a size-related growth decline with function  $Senesc$  after a specific diameter at breast height threshold  $dbh_{thresh}$ :

$$Senesc(dbh) = \max(0; 3 - 2 * \frac{dbh}{dbh_{thresh}}) \quad (15)$$

Finally, TROLL can compute carbon allocation to canopy with canopy NPP fraction denoted  $f_{canopy}$  and decomposed into leaf, twig and fruit production. Carbon allocation to leaf results in a new young leaf pool, whereas other leaf pools are updated as follow:

$$\begin{aligned} \Delta LA_{young} &= \frac{2 * f_{leaves} * NPP_{ind}}{LMA} - \frac{LA_{young}}{\tau_{young}} \\ \Delta LA_{mature} &= \frac{LA_{young}}{\tau_{young}} - \frac{LA_{mature}}{\tau_{mature}} \\ \Delta LA_{old} &= \frac{LA_{mature}}{\tau_{mature}} - \frac{LA_{old}}{\tau_{old}} \end{aligned} \quad (16)$$

$\tau_{young}$ ,  $\tau_{mature}$ , and  $\tau_{old}$  are species residence times in each leaf pools (*years*). The sum of residency time thus defined the leaf lifespan  $LL = \tau_{young} + \tau_{mature} + \tau_{old}$  (*years*).  $\tau_{young}$  is set to one month and  $\tau_{mature}$  is set to a third of leaf lifespan  $LL$ . Previous implementation of TROLL model used Reich et al. [1991] allometry to infer leaf lifespan  $LL$  from species leaf mass per area  $LMA$  [Maréchaux and Chave]. But the use of the allometrie from Reich et al. [1991] with current implementation of the TROLL model resulted in an underestimation of leaf lifespan for low LMA species. Consequently in the following paragraph we suggest a new allometry. Belowground carbon allocation is not simulated inside TROLL.

## 1.6 Leaf lifespan

The underestimation of leaf lifespan for low LMA species with the allometry from Reich et al. [1991] resulted in individuals unrealistic early death from carbon starvation. We gathered data from TRY [Kattge et al., 2011], DRYAD [Chave et al., 2009] and GLOPNET [Wright et al., 2004] datasets. We used an out of the bag method applied on a random forest to select variables with highest importance to explain leaf lifespan. We thus selected leaf mass per are  $LMA$ , leaf nitrogen content  $N$  and wood specific gravity  $wsg$ . We then used a bayesian approach to test different models with growing level of complexity. The model with the best tradeoff between complexity (number of parameters), convergence, likelihood, and prediction quality (root mean square error of prediction RMSEP) was kept. We selected following model with a maximum likelihood of 13.6 and a RMSEP of 12 months:

$$LL_d \sim \mathcal{LN}(\beta_{1d} * LMA - \beta_{2d} * N * \beta_3 * wsg, \sigma) \quad (17)$$

Leaf lifespan  $LL$  follows a lognormal law with location inferred from leaf lifespan  $LMA$ , nitrogen content  $N$  and wood specific gravity  $wsg$  and a scale  $\sigma$ . Each  $\beta_{id}$  is following a normal law located on  $\beta_i$  with a scale of  $\sigma_i$ . All  $\beta_i$ ,  $\sigma_i$ , and

$\sigma$  are assumed without preselection following a gamma law.  $d$  represents the dataset random effects and encompass environmental and protocol variations. The sampling of model (17) resulted in the following allometry:

$$LL = e^{0.017*LM A - 0.103*Nmass + 1.94*ws g} \quad (18)$$

## 1.7 Tree growth

Once the increment of stem volume  $\Delta V$  calculated with equation (14), TROLL convert it into an increment of tree diameter at breast height denoted  $\Delta dbh$ . TROLL infer tree height from  $dbh$  using a Michaelis-Menten equation:

$$h = h_{lim} * \frac{dbh}{dbh + a_h} \quad (19)$$

On the other hand, we have the trunk volume  $V = C * \pi * (\frac{dbh}{2})^2 * h$ , thus:

$$\begin{aligned} \Delta V &= C * \frac{1}{2} * \pi * h * dbh * \Delta dbh + C * \pi * (\frac{dbh}{2})^2 * h \\ \Delta V &= V * \frac{\Delta dbh}{dbh} * (3 - \frac{dbh}{dbh + a_h}) \end{aligned} \quad (20)$$

Next, TROLL used the new trunk dimension ( $dbh$  and  $h$ ) to update tree crown geometry using allometric equations [Chave et al., 2005]:

$$\begin{aligned} CR &= 0.80 + 10.47 * dbh - 3.33 * dbh^2 \\ CD &= -0.48 + 0.26 * h ; CD = 0.13 + 0.17 * h \quad (h < 5 \text{ m}) \end{aligned} \quad (21)$$

Finally, TROLL computes the mean leaf density within the crown ( $LD$  in  $m^2.m^{-3}$ ) assuming a uniform distribution:

$$LD = \frac{LA_{young} + LA_{mature} + LA_{old}}{\pi * CR^2 * CD} \quad (22)$$

## 1.8 Mortality

Mortality is partitioned in three factors inside TROLL: background death  $d_b$ , treefall death  $d_t$  and negative density dependent death  $d_{NDD}$ . Because density dependent death  $d_{NDD}$  is still in development inside TROLL we did not used it, so we will not detail its computation.

Chave et al. [2009] advocated for a wood economics spectrum opposing fast growing light wood species with high risk of mortality to slow growing dense wood species with reduced risk of mortality. Hence, background mortality is derived from wood specific gravity  $ws g$  inside TROLL:

$$d_b = m * (1 - \frac{wsg}{wsg_{lim}}) + d_n \quad (23)$$

$m$  ( $events.year^{-1}$ ) is the reference background death rate for lighter wood species (pioneers).  $d_n$  represents death by carbohydrates shortage. If the number of consecutive day with  $NPP_{ind} < 0$  (12) is superior to tree leaf lifespan  $d_n$  is set to 1 and remains null in other cases.

Mortality by treefall inside TROLL depends on a specific stochastic threshold  $\theta$ :

$$\theta = h_{max} * (1 - v_T * |\zeta|) \quad (24)$$

$h_{max}$  is the maximal tree height.  $v_T$  is the variance term set to 0.3.  $|\zeta|$  is the absolute value of a random centered and scaled Gaussian. If the tree height  $h$  is superior to  $\theta$  then the tree may fall with a probability  $1 - \theta/h$  [Chave, 1999]. The treefall direction is random (drawn from a uniform law  $\mathcal{U}[0, 2\pi]$ ). All tree in the trajectory of the falling tree will be hurted through a variable denoted  $hurt$ , incremented by fallen tree height  $h$ . If a tree height is inferior than its  $hurt$  values then it may die with a probability  $1 - \frac{1}{2} \frac{h}{hurt}$ .  $hurt$  variable is reset to null at each timestep ( $month$ ).

## 1.9 Recruitment

Once the tree became fertile they will start to disperse seeds. TROLL consider tree as fertile after a specific height threshold  $h_{mature}$  [Wright et al., 2005]:

$$h_{mature} = -11.47 + 0.90 * h_{max} \quad (25)$$

But TROLL is not considering seed directly through a seedbank, instead seed might be interpreted as a seedling recruitment opportunity. The number of reproduction opportunities per mature tree is denoted  $n_s$  and set to 10 for all species. This assumption originates from a trade-off between seed number and seed size resulting in equivalent survival and recruitment probability. All  $n_s$  events are dispersed with a distance randomly drawn from a Gaussian distribution. Additionally, TROLL model consider external seedrain through  $n_{ext}$  events of seed immigration:

$$n_{ext} = N_{tot} * f_{reg} * n_{ha} \quad (26)$$

$N_{tot}$  is the external seedrain per hectare (number of reproduction opportunities).  $f_{reg}$  is the species regional frequency.  $n_{ha}$  is the simulated plot size in  $ha$ .

Finally, a bank of seedlings to be recruited is defined for each pixel. If the ground-level light reaches a species light compensation point  $LCP$  the species will be recruited:

$$LCP = \frac{R_{leaf}}{\phi} \quad (27)$$

$R_{leaf}$  is the leaf respiration for maintenance (see (10)).  $\phi$  is the quantum yield ( $\mu mol C \cdot \mu mol \text{ photon}^{-1}$ ) set to 0.06. If several species reach their  $LCP$ , one is picked at random. Seedlings are recruited with following initial geometry:

$$\begin{aligned} dbh &= \frac{a_h}{h_{max}-1} \\ h &= 1 \text{ m} \\ CR &= 0.5 \text{ m} \\ CD &= 0.3 \text{ m} \\ LD &= 0.8 \text{ m}^2 \cdot^{-3} \end{aligned} \quad (28)$$

## 2 Sensitivity analysis

Maréchaux and Chave already assessed TROLL model sensitivity to several parameters ( $k$  see (2),  $\phi$  see (27),  $g1$  see (6),  $f_{wood}$  see (14),  $f_{canopy}$  see (16) and  $m$  see (23)) which they assumed having a key role in model functioning.

On the other hand, we decided to use TROLL to study resistance and resilience of ecosystem face to disturbance, highlighting the role of biodiversit. Consequently we particularly needed to assess the importance of functional traits to further better control and evaluate functional diversities. We also needed to assess the sensitivity of TROLL model to the seed rain constant ( $n_{ext}$ , see (26)) because we assume it is one of the main factor of tree recruitments after disturbance in simulations.

### 2.1 Functional traits

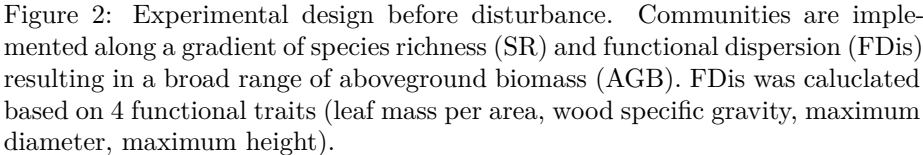
TROLL model currenty uses leaf mass per area ( $LMA$  in  $g \cdot m^{-2}$ ), leaf nitrogen content per dry mass ( $N_m$  in  $mg \cdot g^{-1}$ ), leaf phosphorus content per dry mass ( $P_m$  in  $mg \cdot g^{-1}$ ), wood specific gravity ( $wsg$  in  $g \cdot cm^{-3}$ ), diameter at breast height threshold ( $dbh_{thresh}$  in  $m$ ), asymptotic height ( $h_{lim}$  in  $m$ ), and parameter of the tree-height-dbh allometry ( $a_h$  in  $m$ ). To assess the sensitivity of TROLL model to species fonctionnal traits, we performed a sensitivity analysis by fixing species trait values to their mean. Each trait was tested independently. We reduce to a common mean traits with a Perason's correlation value  $r \geq 0.8$  ( $h_{max}$  and  $a_h$  with a correlation of  $r = 0.98$ ).

## 2.2 Seed rain

To assess the sensitivity of TROLL model to seed rain, we performed a sensitivity analysis by fixing simulations seed rain constant to 2, 20, 200 and 2000 seeds per hectare (default value being 200 seeds per hectare).

Simulations were conducted on Intel Xeon(R) with 32 CPUs of 2.00GHz and 188.9 GB of memory. We assumed maturity of the forest after 500 years of regeneration (Maréchaux & Chave) and computed simulation 100 years after a disturbance event with 40% loss of basal area. Due to computer limitations we did not run replicate (besides it should be necessary to reduce simulation stochasticity). To assess ecosystem outputs sensitivity to studied parameters, we compared it to 100 replicates of control simulations with all parameters set to default values. Ecosystem outputs outside of the range of the control replicates values are significantly influenced by the studied parameter.







## **3 Disturbance**

### **3.1 Model description**

### **3.2 Design of experiment**

### **3.3 Outputs analysis ?**

#### **3.3.1 Resistance and resilience metrics**

#### **3.3.2 Biodiversity partitioning**

## **4 Selective logging**

### **4.1 Model description**

#### **4.1.1 Designation**

#### **4.1.2 Selection**

#### **4.1.3 Rotten trees**

#### **4.1.4 Felling**

#### **4.1.5 Tracks**

#### **4.1.6 Gap damages**

### **4.2 Design of experiment**

### **4.3 Outputs analysis ?**

#### **4.3.1 Resistance and resilience metrics**

#### **4.3.2 Biodiversity partitioning**

## **5 Results**

### **5.1 Sensitivity**

### **5.2 Disturbance**

### **5.3 Silviculture**

## **6 Discussion**

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