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Application of site-specific biomass models to quantify spatial distribution of stocks and historical emissions from deforestation in a tropical forest ecosystem

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Abstract Allometric equations developed for the Lama forest, located in southern Benin, West Africa, were applied to estimate carbon stocks of three vegetation types: undisturbed forest, degraded forest, and fallow. Carbon stock of the undisturbed forest was 2.7 times higher than that in the degraded forest and 3.4 times higher than that in fallow. The structure of the forest suggests that the individual species were generally concentrated in lower diameter classes. Carbon stock was positively correlated to basal area and negatively related to tree density, suggesting that trees in higher diameter classes contributed significantly to the total carbon stock. The study demonstrated that large trees constitute an important component to include in the sampling approach to achieve accurate carbon quantification in forestry. Historical emissions from deforestation that converted more than 30% of the Lama forest into cropland between the years 1946 and 1987 amounted to 260,563.17 tons of carbon per year (t $CO₂/$ year) for the biomass pool only. The study explained the

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application of biomass models and ground truth data to estimate reference carbon stock of forests.

Keywords Biomass - Reference level - Site-specific biomass model - Spatial distribution - Tropical forest ecosystem

Introduction

The concentration of greenhouse gases (GHG) continues to increase in the atmosphere as a result of human activities (IPCC [2013;](#page-7-0) Houghton [2012\)](#page-6-0). Because of the negative impact this change in chemical composition of the atmosphere has on climate change, mitigation actions are especially needed (IPCC [2006](#page-6-0), [2013;](#page-7-0) UNFCCC [2009](#page-7-0); UNEP [2014](#page-7-0)) to re-duce global warming. Carbon sequestration by forest ecosystems has been identified as one promising solution (UNFCCC [2011](#page-7-0); Wani [2014\)](#page-8-0). The international community has given the opportunity to developing countries to contribute to the global efforts to combat climate change through the implementation of REDD+ activities, including reducing emissions from deforestation and from forest degradation, conserving forest carbon stocks, sustainably managing forests and enhancing forest carbon stocks (UNFCCC [2009,](#page-7-0) [2011](#page-7-0)). One of the requirements to undertake these activities is to develop a forest reference emission level and/or forest reference level. Currently, according to the information reported to the secretariat of the United Nations Framework Convention on Climate Change (UNFCCC [2016](#page-7-0)), only few countries in Africa are engaged in the REDD+ process. One of the difficulties identified was related to the lack of data and tools such as allome-tric equations as well as to the technical capacity to develop and apply such tools.

The knowledge of the distribution of carbon stocks according to land uses and of the mitigation potential of forests is essential for efficient forest management. It contributes to the assessment of forest carbon stocks at a global scale.

Forest timber exploitation and establishment of cropland are among the main drivers of deforestation in Africa (FAO [2010;](#page-6-0) Vinya et al. [2011](#page-7-0); Ratnasingam et al. [2014\)](#page-7-0). As a result, in many areas, forests are no longer uniform ecosystems but include in different vegetation types such as natural forest, degraded forest and fallows. These last two types of vegetation offer the possibility to implement reforestation and forest management activities to reestablish the forest. The topic of assessments of forest carbon stocks has been addressed by several studies (Mohanraj et al. [2011](#page-7-0); Alvarez et al. [2012;](#page-6-0) Tang et al. [2012\)](#page-7-0) but those conducted in Africa used default data and expert judgments (Ekoungoulou et al. [2014;](#page-6-0) Liu et al. [2014\)](#page-7-0). To improve the assessment of carbon stocks and mitigation potential of African forests, the use of country-specific data and tools such as allometric equations is needed (Guendehou et al. [2012](#page-6-0); Goussanou et al. [2016\)](#page-6-0).

Hirata et al. ([2008\)](#page-6-0), Guo et al. ([2010\)](#page-6-0), Djomo et al. [\(2011](#page-6-0)), Liu et al. ([2012,](#page-7-0) [2014](#page-7-0)), Galeana-Pizaña et al. ([2014\)](#page-6-0) and Rudiyanto et al. ([2015\)](#page-7-0) have studied the distribution of carbon stocks in tropical regions using remote sensing, modelling and geographical information systems (GIS). But other studies (Wulder et al. [2008;](#page-8-0) Du et al. [2014](#page-6-0); Vicharnakorn et al. [2014;](#page-7-0) Chen et al. [2015\)](#page-6-0) reported that these approaches need also ground truth data for validation.

Forest distribution maps are available in Benin but these maps do not show the distribution of carbon stocks. These dis-tribution maps would be useful to develop a baseline in order to assess the performance of the implementation of mitiga-tion actions such as reducing emissions from deforestation and forest degradation, sustainably managing forests, con-serving and enhancing carbon stocks (UNFCCC [2011](#page-7-0)).

The objective of this study was to develop a carbon map for the Lama forest, a semi-deciduous forest in southern Be-nin using site-specific allometric equations and data. The study also intended to give examples of how the reference and the distribution of carbon stocks could be addressed at a sub-national level as a transition to national carbon mapping. Factors affecting variation of carbon stocks are also discussed.

Materials and methods

Study area

(Nagel et al. [2004\)](#page-7-0) between $6^{\circ}55'$ and $7^{\circ}00'$ Latitude North and $2^{\circ}04'$ and $2^{\circ}12'$ Longitude East. The map of the location of the study area was presented in Goussanou et al. [\(2016\)](#page-6-0). The forest covers an area of 16,250 ha including 4777 ha of natural forest entirely protected, referred to as the 'Noyau Central'. The climate is tropical moist (IPCC [2006\)](#page-6-0). Monthly average temperatures vary from 25 to 29 $^{\circ}$ C and the mean annual rainfall is 1200 mm. Monthly rainfalls exceed 100 mm except for January, February and March which are the warmest months. Two rainy seasons occur between mid-March and mid-July and between mid-September and mid-November.

The soil in the area is hydromorphic clayey vertisol (40–60% of clay) characterized by poor drainage and a pH range of $5-5.5$ in the 0-30 cm horizon (Küppers et al. [1998\)](#page-7-0). The vegetation types include an undisturbed forest, a degraded forest and fallow (Bonou et al. [2009](#page-6-0)). Land classification is based on the extent of historical deforestation activities that have affected the natural forest. Between 1946 and 1987, 9000 ha of natural forest was converted to cropland (Emerich et al. [1999](#page-6-0)). The undisturbed forest refers to the part of the study area that has remained intact while degraded forest and fallow refer to areas that were subject to less perturbations and severe disturbances respectively. Since the interruption of agricultural activities between 1986 and 1987, protection measures, including some afforestation activities through enrichment, have taken place in areas previously disturbed. Applying the default transition period of 20 years (IPCC [2006\)](#page-6-0), degraded forest and fallow, which were in transition from cropland to forest land, have been classified forest since 2009 but under categories degraded and fallow. In 1986, the areas reported by von Bothmer et al. [\(1986](#page-8-0)) were 3784 ha for undisturbed forest, 5827 ha for degraded forest, 5800 ha for fallow land and 840 ha for plantation forest. The undisturbed and degraded forests are dominated by species such as Afzelia africana (Sm.), Ceiba pentandra (L.) Gaertner, Diospyros mespiliformis (Hochst. Ex A.DC.), Dialium guineense (Wild), Mimusops andongensis Hiern. (Sapotaceae), Celtis brownii (Rendle.), Holarrhena floribunda (G. Don) Durand et Schinz, Malachanta alnifolia (Bak) Pierre, Drypetes floribunda (Müll. Arg.) Hutch and Cynometra megalophylla Harms. The fallows are characterized by open canopy forests containing dominant species such as Anogeissus leiocarpa (DC.) Guill. & Perr. Lonchocarpus sericeus (Poir.) Kunth, Albizia zygia (DC.) J.F. Macbr. and Ficus sur (cv. Forssk.). The dominance of the tree species was determined on the importance value index (Goussanou et al. [2016\)](#page-6-0). The plantation is composed of species such as Tectona grandis and Gmelina arborea.

Sampling design and data collection

The sampling design followed the approach described by Guendehou et al. ([2012\)](#page-6-0) and Goussanou et al. ([2016\)](#page-6-0). Data on tree dimensions (ground diameter, dbh, diameter along the stem and height) and wood samples were collected between October 2013 and February 2014, in 45 plots of 50 m \times 50 m distributed across all vegetation types. The 45 plots were distributed proportional to the area of each vegetation type and this resulted in 20, 10, and 15 plots established in the undisturbed forest, degraded forest and fallow respectively. The data collected and additional data from Guendehou et al. ([2012](#page-6-0)) were used to develop species-specific and generic biomass models (Goussanou et al. [2016\)](#page-6-0). The collected samples were used to determine wood densities in the laboratory.

Computation of biomass and carbon stocks

Data from diameter at breast height (dbh) and stem height measurements were used as inputs to the twenty-three species-specific biomass models and generic model developed by previous studies (Guendehou et al. [2012](#page-6-0); Goussanou et al. [2016](#page-6-0)) to estimate stem biomass. The stocks were calculated at plot level by applying the specific models to species for which models were developed and by using the generic model for non-dominant species for which enough data was not available to develop specific models. Stem biomass stock for each plot was derived following Eq. 1 and for each vegetation type using Eq. 2. The stem biomass stocks were multiplied by the available biomass expansion factor (BEF) and the root-to-shoot ratio (IPCC [2006](#page-6-0); Mokany et al. [2006\)](#page-7-0) to derive the total aboveand below-ground biomass (Eq. 3). Total biomass per ha for each vegetation type was the ratio of total biomass to the total area of the vegetation type. Biomass for all vegetation types was then summed to derive the biomass of the whole stand.

$$
B_{\text{stem}_p} = \sum_{ij} (Bsm_i + Bgm_j) \tag{1}
$$

where $B_{\text{stem}_n} = \text{biomass stock}$ in plot p, $B_{sm_i} = \text{biomass}$ stock derived from specific model applied to dominant species i (kg), $Bgm_i =$ biomass stock derived from generic model applied to non-dominant species j (kg).

$$
Bstem_{Vegetation type \, v} = \sum_{p} Bstem_{p,v} \tag{2}
$$

where *Bstem*_{vegetation type $v =$ total stem biomass of vege-} tation type v, $Bstem_{p,v}$ = stem biomass stock in plot p belonging to vegetation ν

$$
TB_{ vegetation\ type\ v} = Bstem_{vegetation\ typev} \times BEF \times (1 + R)
$$
\n(3)

where, $TB_{vegetation\ type\ v} = total\ above\ and\ below\ ground$ biomass stock of vegetation type v (kg), $BEF = \text{biomass}$ expansion factor, 3.4 (IPCC [2006](#page-6-0)), $R =$ root-to-shoot ratio, 0.24 (IPCC [2006\)](#page-6-0).

The biomass was converted to carbon stock using the average carbon content (48.7 \pm 0.8% dry matter) derived from Guendehou et al. [\(2012](#page-6-0)).

Data analysis

The structure of the forest with respect to the distribution of tree density and basal area, according to diameter classes within and across vegetation types, was assessed by graphical observations using the statistical computing software R (R Development Core Team [2012](#page-7-0)) (Fig. [1](#page-3-0)).

The variation of biomass stock within and between vegetation types was analyzed and correlated with parameters including tree density, basal area and stem height. Density refers to the average number of trees per plot and basal area is the sum of the cross-sectional area at 1.3 m above the ground level of all trees in a plot (Bonou et al. [2009](#page-6-0)). In order to perform this analysis, all data (stem density, basal area and biomass) were distributed in five diameter classes: ≤ 15 , 15–30, 30–45, 45–50, >50 cm. Individuals for which the dbh was ≤ 15 , were considered small trees according to the National Office of Wood.

ArcGIS 10 was used to map the distribution of carbon stocks according to vegetation type using the map of the Lama forest developed by Bonou et al. ([2009\)](#page-6-0). From vector format of vegetation map, we added attribute fields ''type of vegetation", "area" and "carbon". The attribute "type of vegetation'' referred to undisturbed forest, degraded forest and fallow. The attribute "area" was the measure of each unit of vegetation type. The attribute "carbon" was obtained as a multiplication of the attribute ''area'' of the ''type of vegetation'' by the mean value of the carbon stock associated with the vegetation type concerned. These vegetation layers with all attributes were stored in the GIS for visualization. The vegetation layer was display based on the attribute "carbon". The carbon stocks were distributed in nine classes: $<$ 10, 10–15, 15–20, 20–25, 25–30, 30–35, 35–40, 40–45,[45 t C/0.25 ha (Fig. [2](#page-3-0)). The ranges were derived based on the carbon estimated at the plot level (Table [2\)](#page-5-0).

Results

Forest structure

There were no significant differences with respect to species richness across vegetation types. Thirty-eight, 37 and

Fig. 1 Distribution of tree density (a) basal area (b) and total biomass (c) according to diameter classes across vegetation types

Fig. 2 Map of carbon stocks in Lama Forest Reserve

36 species were identified in undisturbed forest, degraded forest and fallow respectively (Table [1](#page-4-0)). Low values of Shannon diversity index indicated less diverse species communities across vegetation types while Pielou evenness values revealed that species were somewhat evenly distributed in the vegetation types. Large differences were not observed with respect to Shannon diversity and species evenness (Table [1\)](#page-4-0).

In each vegetation type, the lowest tree density was found in higher diameter classes, suggesting that more individuals were detected in lower diameter classes. There was a relatively good representation of trees for diameter classes less than 30 cm. The density is higher in undisturbed forest $(542 \text{ stem ha}^{-1})$ than in fallow $(349 \text{ stem ha}^{-1})$ and in degraded forest $(340 \text{ stem ha}^{-1})$ (Table [1](#page-4-0) , Fig. 1). Nearly 50% of trees measured in all

Parameters	Undisturbed forest (mean \pm SE)	Degraded forest (mean \pm SE)	Fallows (mean \pm SE)	
Species richness (S, species)	38	37	36	
Tree density (tree/ha)	542	340	349	
Shannon diversity (H, bits)	3.11	4.03	3.58	
Pielou evenness (Eq)	0.59	0.77	0.69	
Basal area $(G, m^2/ha)$	18.60 ± 1.31	11.53 ± 0.88	9.27 ± 0.89	

Table 1 Vegetation type characteristics

SE standard error

diameter classes were located in the undisturbed forest. Large variations of density and basal area among vegetation type were observed.

Basal area varied significantly between vegetation types ranging from 9.27 m^2 ha⁻¹ (fallow) to 18.60 m^2 ha⁻¹ (undisturbed forest) (Table 1). In fallow and degraded forest, diameter classes between 15 and 30 cm contained higher values of basal area which decreased in high diameter classes (Fig. [1\)](#page-3-0). In undisturbed forest the increase in basal area from lower to higher diameter classes was observed.

In summary, tree density and basal area were the parameters which affected the most the distribution of biomass and carbon stocks in the forest (Table 1).

Biomass and carbon stocks

In general, in all vegetation types the lowest biomass was found in lower diameter classes. In undisturbed forest, the distribution of biomass according to dbh classes showed an increasing trend, suggesting that the higher diameter classes, the higher the biomass and that large proportions of biomass were located in larger trees (Fig. [1\)](#page-3-0). Across all dbh classes, more than 50% of the total biomass in the forest was found in the undisturbed forest (Fig. [1\)](#page-3-0). Carbon stock in all plots in the undisturbed forest was higher in comparison to that in the degraded forest and fallow (Tables [2](#page-5-0) , [3\)](#page-5-0). Carbon stock in the degraded forest was higher in the middle diameter classes and decreased slightly for higher diameter classes. With regard to the fallow area, the carbon stock was almost constant for $dbh > 10$ cm. Diameter classes between 15 and 50 cm contributed the most to biomass storage.

The plot that contained the highest biomass (257.74 t dm) was in the undisturbed forest and the one with the lowest (17.57 t dm) was in the fallow (Table [2\)](#page-5-0). The observed order of magnitude of the average total biomass per plot was: undisturbed forest \geq degraded forest \geq fallow (Table [2](#page-5-0)).

In each vegetation type, there was large variation of biomass stock across plots (Table [2\)](#page-5-0). The estimated coefficient of variation (CV) was 27% for undisturbed forest,

32% for degraded forest and 48% for fallow. The biomass per ha in the undisturbed forest was 2.7 times and 3.4 times higher than stocks estimated in the degraded forest and fallow respectively (Tables [2](#page-5-0), [3\)](#page-5-0).

Emissions from historical deforestation

Deforestation activities that took place in the Lama forest between 1946 and 1987 converted 9000 ha of natural forest into cropland (Emerich et al. [1999](#page-6-0)). Assuming that all the biomass was entirely removed during the conversion and considering the carbon stock per ha in Table [3,](#page-5-0) the emissions from historical deforestation amounted to 260 563.17 t CO_2 /year. Enough data was not available to quantify the emissions from other carbon pools including dead organic matter and soil.

Discussion

Forest structure

The low values of tree density observed in the degraded forest and fallow could be interpreted as the result of historical anthropogenic activities, including harvesting and agriculture that modified the structure of the forest. Emerich et al. ([1999\)](#page-6-0) reported that nearly 9000 ha of natural forest were converted into cropland. Harvesting was also reported by Lokonon ([2008\)](#page-7-0). The predominance of trees in lower diameter classes, i.e. younger trees (Fig. [1](#page-3-0)a) is very interesting for the survival of the forest. This could be explained as a positive effect of the protection measures implemented over several years which enable the regeneration of the forest. The higher potential of regeneration in the undisturbed forest was in line with (Jayakumar and Nair [2013;](#page-7-0) Kimaro and Lulandala [2013](#page-7-0)), suggesting that disturbed forests take time to regenerate in the absence of management. Mean values of tree density obtained in this study were 155, 330 and 188% higher than the values reported by Emrich et al. [\(1999](#page-6-0)), Bonou et al. ([2009\)](#page-6-0), and Vitoule ([2012\)](#page-8-0) respectively. This may be explained by the diameter size (dbh \geq 5 cm) considered in our study,

Vegetation type	Np Nt		Stem biomass stock at plot level (t dm)/0.25 ha		Total above and below ground biomass stock at plot level (t dm)/0.25 ha			Total above and below ground carbon stock at plot level $(t)/0.25$ ha			
			Range	Mean	SE	Range	Mean	SE	Range	Mean	SЕ
Undisturbed forest	20	2711	$20.55 - 61.13$	39.42	2.37	86.62–257.74	166.19	9.97	42.19–125.52	80.93	4.86
Degraded forest	10	851	7.45–20.42	14.84	1.52	31.43-86.11	62.59	6.41	15.30 - 41.93	30.48	3.12
Fallow	15.	1312.	$4.17 - 22.21$	11.79	1.46	17.57–93.62	49.71	6.17	8.56–45.59	24.21	3

Table 2 Distribution of stem biomass (t dm) and total above and below ground biomass (t dm) across plots

 Np number of plots, Nt number of sampled trees, t dm tons dry matter, SE standard error

Area of a plot $= 0.25$ ha

Table 3 Distribution of total biomass and carbon stock across vegetation types

Vegetation type	Sum biomass stock from sampled plots (t dm)	Biomass stock per ha (t dm) \pm SE	Carbon stock per ha (t C) \pm SE	Area (ha)	Total biomass stock (t dm)	Total carbon stock $(t C)$
Undisturbed forest	3323.74	664.75 ± 39.8	323.73 ± 19.42	2076.73	1.380,506.27	672,306.55
Degraded forest	625.85	250.34 ± 25.64	121.92 ± 12.49	1075.67	269,283.23	131,145.69
Fallow	745.62	198.83 ± 24.67	96.83 ± 12.01	1624.6	323,019.22	157,310.36

whereas dbh > 10 cm was considered for the other studies. Data collected in this study has revealed that species richness and diversity have been reestablished following protective measures, including afforestation activities, indicating a homogenous repartition of species in the Lama forest. The basal area in this study was higher than those previously found by Bonou et al. ([2009\)](#page-6-0) and Vitoule ([2012\)](#page-8-0) due to probable differences in sampling, in particular in this study trees in lower diameter classes. The combined effect of high tree density observed in lower diameter classes and presence of large trees in undisturbed forest explains the high basal area detected in undisturbed forest.

Biomass and carbon stocks

The biomass of the three forest types (undisturbed forest, degraded forest and fallow) fall within the range (50–749 t dm ha⁻¹) reported in other studies conducted in tropical forests (Clark et al. [2001](#page-6-0), Cummings et al. [2002](#page-6-0); Sierra et al. [2007](#page-7-0); Lewis et al. [2009;](#page-7-0) Djuikouo et al. [2010;](#page-6-0) Djomo et al. [2011](#page-6-0); Lewis et al. [2013\)](#page-7-0). The above- ground biomass reported by IPCC [\(2006](#page-6-0)) for tropical moist deciduous forest in Africa was 260 t dm ha^{-1} (IPCC range 160–430). The above-ground biomass for undisturbed forest (536.10 t dm ha^{-1}) from Table 3 using the root-to-shoot ratio (0.24) of IPCC [\(2006](#page-6-0)) was 33% higher than the upper limit of the IPCC range. The above-ground biomass for degraded forest and fallow (201.89 and 160.35) were within the IPCC range. The higher biomass in the undisturbed forest may be attributed to the fact that this forest is semi-deciduous while IPCC values were applicable to deciduous forests. Lower biomass stocks found in the degraded forest and fallow were apparently a direct consequence of historic deforestation and degradation activities implemented between 1946 and 1987 affecting tree density. Variation of biomass due to historical disturbances has been demonstrated by others (Chazdon [2003;](#page-6-0) Mani and Parthasarathy [2009](#page-7-0); Omeja et al. [2012](#page-7-0); Lindner and Sattler [2012](#page-7-0); Her-nández-Stefanoni et al. [2014](#page-6-0); Lin et al. [2015](#page-7-0); Osazuwa-Peters et al. [2015](#page-7-0)) who reported higher biomass in preserved areas than on former clear-cut sites in tropical regions The higher biomass in undisturbed forest could be explained by higher tree density and also the presence of trees with high potential of carbon storage, including Afzelia africana, Cassipourea congoensis, Ceiba pentandra, Dialium guineense, Diospyros abyssinica and Diospyros mespiliformis, already reported by Guendehou et al. [\(2012](#page-6-0)) and Goussanou et al. [\(2016](#page-6-0)). The proportion of higher biomass found in higher diameter classes confirmed that large trees contribute significantly to carbon storage and should not be excluded from sampling for forest carbon estimation. This finding was consistent with results from Alves et al. ([2010\)](#page-6-0) and Lindner [\(2010](#page-7-0)).

Emissions from historical deforestation

Countries such as Brazil, Colombia and Guyana have submitted emissions associated with deforestation in the context of REDD+ and have gone through the technical assessment process of the UNFCCC secretariat (UNFCCC [2016](#page-7-0)). The emissions associated with deforestation reported in this study $(260, 563.17 \text{ t } CO_2$ /year) were lower than those reported by Brazil $(907,959,466 \text{ t } CO_2\text{/year})$, Colombia $(51,599,618.7 \text{ t } CO_2$ /year) and Guyana

 $(46.301.251 \text{ t CO}$ ₂/year). The differences may be explained by national circumstances such as the area deforested, the period of the historical deforestation and the forest types. Under REDD+ few countries in Africa have started the preparation of the forest reference emission levels and published data are not at the moment available to make a comparison with our study.

Conclusions

This study is an example of the application of biomass models to derive forest carbon stocks, their spatial distribution and historical emissions associated with deforestation. From the distribution of biomass according to diameter classes, the study confirmed that trees in higher diameter classes should not be ignored when developing a sampling approach to estimate carbon stocks in forest ecosystems. The approach applied in this study could be used as a basis for establishing forest reference emission levels (FREL) or forest reference levels (FRL) in the context of $REDD+$. In order to quantify emissions from deforestation and to develop a national FREL/FRL, historical data on changes in forest area as well as biomass models for other ecosystems would be required. National FREL/FRL also requires the inclusion of other REDD+ activities (reducing emissions from forest degradation, conservation of forest carbon stocks, sustainable management of forests, and enhancement of forest carbon stocks) and carbon pools including dead organic matter and soil.

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