# Models for Predicting Stem Diameter from Crown Diameter of Open Grown Trees in Sondu-Nyando River Catchment, Kenya 

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#### Abstract

Information on stocks of trees on farm is scanty and in many cases lacking. Assessing the stocking density of trees on farms require models relating tree bole diameter with its crown diameter. However, bolecrown diameter models of open grown trees on farms is lacking in the Lake Victoria basin and indeed in Kenya. The focus of this study was to develop regression equations that would predict individual tree Diameter at Breast Height (DBH) from its crown diameter (Cd) for selected open grown tree species in Sondu-Nyando River catchment. Stratified random sampling was used and GPS readings, DBH and Cd, collected from 20 unequal sized sample plots, along selected agro ecological gradients. The models were developed using DBH and Cd measurements from 578 trees of five most dominant tree species (Cupressus lusitanica, Eucalyptus saligna, Grevillea robusta, Persea americana and Croton megalocarpus). The DBH - Cd models displayed good fit $\left(\mathrm{R}^{2}>0.586\right)$. Persea americana had the highest adjusted $\mathrm{R}^{2}(0.875)$ and Eucalyptus saligna the lowest $\left(\mathrm{R}^{2}=0.586\right)$. F-test showed regression coefficients were significant in all the models. Residuals were more concentrated in lower diameters, implying a negative exponential DBH distribution. The Linear, Exponential and Power models performed well with the highest $R^{2}$ (up to $0.875,0.676$ and 0.655 ). The developed models are applicable across species groups and not across species.


Key words: Bole diameter, crown diameter, exponential function, power function, species dominance, species groups

## INTRODUCTION

Population growth and human activities such as settlements, agriculture and construction are threatening forests globally. Trees on Farm (ToF) form an integral part of the farm landscape and contribute to ecological and economic functions of a farmland ecosystem. Trees on farm provide woodfuel, promote dry seasonal flow, stabilise soils, improve soil texture and fertility, and ameliorate the microenvironment making it more conducive for enhanced biodiversity of flora and fauna in farmlands. It is therefore prudent to have a reliable inventory to facilitate productive and sustainable management of on-farm tree resources.

Tree crown diameter is well correlated with tree bole diameter (Gering and May, 1995; Kigomo, 1980, 1991, 1998; Lockhart et al., 2005; Hemery et al., 2005). This relationship is particularly useful for determining stand density and stocking relationships (Dawkins, 1963; Goelz, 1996; Kigomo, 1980, 1991, 1998), and tree and stand volumes from aerial photographs (Bonnor, 1968; Gering and May, 1995). Furthermore crown diameter bears a definite relation with its bole diameter irrespective of site
and age and, in some cases, irrespective of silvicultural treatments (Dawkins, 1963; Kigomo, 1998).

If relationships between bole diameter and tree crown diameter are known, Basal Area (BA) or volume of trees on farm can be estimated from bole diameters derived from crown diameters. Just as a tree's Diameter at Breast Height (DBH) is often used as a surrogate for a tree's crown dimensions (Kigomo, 1980, 1991, 1998; Lockhart et al., 2005), a tree's crown diameter can equally be used as the surrogate for DBH . With recent advances in remote sensing technology, an easier way of inventorying these resources would be measuring tree crown diameter (Cd) from remotely acquired high resolution digital imagery. Bole diameter would then be predicted from crown diameter and the tree volume or Basal Area (BA) estimated. Such an approach would require developing models to predict DBH from crown diameter (Cd) which are lacking.

The focus of this study, therefore, is to develop models that predict individual tree bole diameter from its crown diameter for open grown trees, in parts of SonduNyando River catchments. Specifically, the objective is to determine the species composition and species


Fig. 1: Location and distribution of sample plots in the study area
dominance, and to develop regression equations that predict individual tree DBH from its crown diameter for selected open grown tree species in the study area.

## MATERIALS AND METHODS

Description of the study area: The study, undertaken in Kenya, was done in parts of Nyando and Sondu River catchments (Fig. 1). It covered Nandi South, Nandi North, Kericho, Buret, Bomet and Nyando districts, between longitudes $34^{\circ} 57^{\prime} \mathrm{W}$ and $35^{\circ} 28^{\prime} \mathrm{E}$, and latitudes $0^{\circ} 10^{\prime} \mathrm{S}$ and $0^{\circ} 57^{\prime} \mathrm{N}$. The altitude ranges from 1200 to 2400 m above sea level. The catchment receives rainfall ranging from 1200-2350 mm annually and temperatures ranging from 15 to $28^{\circ} \mathrm{C}$. According to Jaetzold and Schmidt (1983) the area comprises three main Agroecological zones namely: the Lower Marginal SugarcaneCotton zone, Wheat-Maize zone and the Tea-Dairy zone. Soils in the Sugarcane-Cotton zones are moderately deep, dark grey to black, gravely clay to clay with calcerous deeper sub-soil that are poorly drained. The upper Nyando plateau (Wheat-Maize zone) soils are well drained, moderately deep, red/reddish brown to dark red friable clay of moderate to high fertility. Soils in the Tea-Dairy zones are deep, well drained, reddish brown to brown fertile soils.

The physiography of the major part of the region is undulating upland and low land underlain by basement system rocks, intermediate igneous rocks and quartzite. The area is generally an agricultural zone with crops such as tea, maize, wheat and multipurpose trees and shrubs.

This is particularly evident in Nandi, Kericho and Bomet. In Nyando there are some sections of grassland, rice and sugarcane plantations. Generally trees are found within the farms, in tea plantations and on boundaries.

Sampling techniques and data collection: To derive the relationship between crown diameter (Cd) and bole diameter at breast height ( DBH ) a total of 3101 trees were measured in the study area between September and October 2007. To select the trees for measurement a stratified random sampling design was used. Topographic maps were used to identify farming areas. Accessible, unequal sized sample plots (farms) were randomly and proportionately allocated along selected transects based on ecological gradients. (You could tell the minimum and maximum size)

In each sample plot, GPS locations were recorded and complete enumeration of trees done. However, where the farm was more than 5 hectares or had dense woodlands/woodlots, a portion of it (at least 10\%) was sampled. For each tree or shrub with DBH $>1 \mathrm{~cm}$, the species name, DBH over-bark and the crown diameter (average of maximum and minimum) were measured from the vertical projection of the edge of a tree crown down to the ground (Husch et al., 1982; Gering and May, 1995; Lockhart et al., 2005).

Methods of data analysis: Species dominance (Importance Value, IV) derived by summing up the percentages of Relative density, Relative Dominance and Relative Frequency (Curtis and Mclntosh, 1950;

Asian J. Agric. Sci., 3(2): 119-126, 2011

| Table 1: The ten most dominant open grown species and their species dominance rating |  |  |  |  |  |  |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| Tree species | Frequency | No of stems <br> measured for CD | Basal <br> area cm ${ }^{2}$ | Relative <br> frequency | Relative <br> density | Relative <br> dominance | Importance <br> value (IV) |
| Cuppresus lusitanica | 12 | 176 | 32070.92 | 57.14 | 12.92 | 12.38 | 82.44 |
| Grevillea robusta | 12 | 132 | 25772.04 | 57.14 | 9.69 | 9.95 | 76.78 |
| Eucalyptus saligna | 10 | 149 | 33457.71 | 47.62 | 10.94 | 12.91 | 71.47 |
| Persea Americana | 9 | 64 | 12432.72 | 42.86 | 4.70 | 4.80 | 52.35 |
| Croton megalocarpus | 9 | 61 | 4364.22 | 42.86 | 4.48 | 1.68 | 49.02 |
| Croton macrostachyus | 7 | 49 | 10849.56 | 33.33 | 3.60 | 4.19 | 41.12 |
| Vangueria infausta | 7 | 29 | 4487.77 | 33.33 | 2.13 | 1.73 | 37.19 |
| Markhamia lutea | 7 | 32 | 3369.40 | 33.33 | 2.35 | 1.30 | 36.98 |
| Psidium guajava | 7 | 19 | 2280.50 | 33.33 | 1.40 | 0.88 | 35.61 |
| Oryris lanceolata | 5 | 53 | 6732.47 | 23.81 | 3.89 | 2.60 | 30.30 |

Kigomo et al., 1990) was determined for each species. Importance value is a useful tool in showing overall dominance of species and has been used successfully for this purpose and in comparing stocking robustness in different natural forest stands (Kigomo et al., 1990). Out of the recorded tree species, the five most dominant species were selected for further analysis. For each of the selected tree species, about a third of the data, selected randomly, was reserved for model validation while the rest were used in model calibration. Scatter graphs were plotted and models (linear, power, exponential, logarithmic and polynomial) fitted. Hoaglin and Welsch's (1978) leverage coefficient ( $\mathrm{h}_{\mathrm{i}}=1 / \mathrm{n}+(x i-$ $\left.\mu)^{2} / \mathrm{a}^{2} \mathrm{x}^{2}\right)$ and standardized residuals, $\epsilon_{\mathrm{si}},\left(\epsilon_{\mathrm{si}}=\epsilon_{\mathrm{i}} /\left(\operatorname{Se}\left(1-\mathrm{h}_{\mathrm{i}}\right)^{1 / 2}\right)\right.$ were used to identify outliers. Crown diameters with $\epsilon_{\text {si }}>$ $\mathrm{t}_{0.01(\mathrm{n}-2)}$ were excluded in the model calibration. Model coefficients $\alpha$ and $\beta$, and the coefficient of determination, $\mathrm{R}^{2}$, were determined using Least Square Method (LSM), where $\alpha=y$-intercept and $\beta=$ regression coefficient. The $F$ statistic and the significance $F$ were then computed and the results tabulated. These parameters were used to determine the best fit models which were validated using the t-test, Pearson correlation coefficient and examination of residual plots.

## RESULTS AND DISCUSSION

Species composition and dominance rating: The total number of trees measured was 3101 trees belonging to 114 genera. The ten most dominant were E. saligna (647), C. lusitanica (327), G. robusta (168), C. megalocarpus (117), P. americana (72), M. lutea (86), (P. guajava (68), C. macrostachyus (92), V. infausta (95), and Rhus natalensis (99) as shown in Appendix B by their Importance Value (IV) ratings. All trees were measured for DBH but Crown diameter was only measured on open growing trees.

Out of the 3101 trees recorded, 1362 were open growing trees belong to 93 genera. Crown diameter and DBH were measured on all them. The DBH ranged from 1 to 54 cm with means ranging from 6.59-14.1 cm (Appendix A). Importance Value rating showed that the ten most dominant open growing species were:
C. lusitanica, G. robusta, E. saligna, P. americana, C. megalocarpus, C. macrostachyus, V. infausta, M. lutea, P. guajava and O. lanceolata. Only two out of the ten tree species, measured for DBH and Cd , had less than 30 individual trees ( $V$. infausta and $P$. guajava). Their species dominance ratings are shown in Table 1. The five most dominant tree species were selected for further analysis and modeling.

When the Importance values and the number of stems were tested for linear relationship, the Pearson correlation coefficient, r, was 0.886 implying that stocking (stems per ha) and species dominance are highly and linearly correlated

Model calibration and validation: In all the species, Hoaglin and Welsch (1978) leverage coefficients ( $\mathrm{h}_{\mathrm{i}}$ ) for all the data points were lower than their threshold value of $4 / n$ indicating consistency in the observations within the models. Though some of the standardized residuals $\left(\epsilon_{\mathrm{si}}\right)$ were large, they generally tended to zero, with a mean of -0.0256 cm . Since a large residual for a point with a low leverage value does not unduly influence the regression line (Sokal and Rohlf, 1981) only points with relatively high residuals, $\epsilon_{\text {si }}>\mathrm{t}_{0.01(\mathrm{n}-2)}$ were considered outliers and excluded in calibration of the models. Exclusion of notable outliers significantly improved the $\mathrm{R}^{2}$ values. For example in C. lusitanica, p -value was ( $\mathrm{p} \leq 0.0026$ ) and $\mathrm{R}^{2}$ improved by a margin of between $0.081-0.135$. The $\alpha$ and $\beta$ coefficients, $\mathrm{R}^{2}$, computed F-statistic, significance $F$ and the standard errors of the fitted models are tabulated as in Table 2.

Generally, adjusted $\mathrm{R}^{2}$ values in all the fitted models were $\geq 0.50$, with relatively high F-values of between 90 and 281, except for the exponential model on E. saligna (Table 2). Of the fitted models, the Linear, Exponential and Power models performed better with the highest $\mathrm{R}^{2}$ and F-values (Table 2 and 3). In all cases the residuals in these best fit models were randomly distributed, with the mean tending to 0 and standard error not exceeding 2.946 cm , except for $E$. saligna which was 5.862 cm . In all data sets there was more concentration of residuals in lower diameters than in higher diameters, implying a negative exponential distribution.

Asian J. Agric. Sci., 3(2): 119-126, 2011
Table 2: The models' $\alpha$, and $\beta$ coefficients, $\mathrm{R}^{2}$ and the F-statistics

| Species | Model type and model coefficients | $\mathrm{R}^{2}$ | Adjd R ${ }^{2}$ | SE | $\mathrm{F}^{1}$ |
| :---: | :---: | :---: | :---: | :---: | :---: |
| C. lusitanica $(\mathrm{n}=119)$ |  |  |  |  |  |
|  | $\mathrm{Y}=4.0811 \mathrm{x}-2.8089$ | 0.621 | 0.618 | 4.873 | 192 |
|  | $\mathrm{Y}=2.4479 \mathrm{x}^{1.1179}$ | 0.643 | 0.640 | 0.434 | 210 |
|  | $\mathrm{Y}=2.2384 \mathrm{e}^{0.3913 \mathrm{x}}$ | 0.679 | 0.676 | 0.411 | 247 |
|  | $\mathrm{Y}=10.989 \mathrm{Ln}(\mathrm{x})-1.1937$ | 0.522 | 0.518 | 5.471 | 128 |
|  | $Y=0.4369 x^{2}+0.967 \mathrm{x}+1.6571$ | 0.641 | 0.635 | 4.761 | 104 |
|  | $Y=-0.1796 x^{3}+2.5229 x^{2}-6.0972 x+8.2797$ | 0.652 | 0.643 | 4.707 | 72 |
|  | $Y=-0.0988 x^{4}+1.3979 x^{3}-6.0378 x^{2}+12.181 x-4.3085$ | 0.662 | 0.650 | 4.660 | 56 |
| E. saligina $(\mathrm{n}=102)$ |  |  |  |  |  |
|  | $Y=2.5093 x+4.1659$ | 0.590 | 0.586 | 5.862 | 144 |
|  | $Y=3.9568 x^{0.8703}$ | 0.483 | 0.478 | 0.564 | 93 |
|  | $\mathrm{Y}=5.5965 \mathrm{e}^{0.1709 \mathrm{x}}$ | 0.373 | 0.367 | 0.621 | 59 |
|  | $\mathrm{Y}=10.894 \operatorname{Ln}(\mathrm{x})+1.2848$ | 0.556 | 0.551 | 6.103 | 125 |
|  | $Y=-0.0328 x^{2}+2.944 x+3.2131$ | 0.592 | 0.584 | 5.876 | 72 |
|  | $Y=0.0199 x^{3}-0.4872 x^{2}+5.625 x-0.6434$ | 0.605 | 0.593 | 5.813 | 50 |
|  | $\mathrm{Y}=0.0021 \mathrm{x}^{4}-0.0441 \mathrm{x}^{3}+0.1334 \mathrm{x}^{2}+3.4657 \mathrm{x}+1.5463$ | 0.606 | 0.590 | 5.833 | 37 |
| G. robusta ( $\mathrm{n}=84$ ) |  |  |  |  |  |
|  | $Y=3.776 x-0.6307$ | 0.639 | 0.634 | 4.752 | 145 |
|  | $Y=2.6988 x^{1.1516}$ | 0.659 | 0.655 | 0.443 | 158 |
|  | $\mathrm{Y}=2.8325 \mathrm{e}^{0.3568 \mathrm{x}}$ | 0.620 | 0.615 | 0.468 | 134 |
|  | $\mathrm{Y}=11.43 \mathrm{Ln}(\mathrm{x})-0.2647$ | 0.598 | 0.593 | 5.015 | 122 |
|  | $Y=-0.1977 x^{2}+5.331 x-3.1279$ | 0.646 | 0.638 | 4.731 | 74 |
|  | $Y=-0.0907 x^{3}+1.0104 x^{2}+0.6883 x+1.6997$ | 0.654 | 0.641 | 4.710 | 50 |
|  | $Y=0.0493 x^{4}-0.955 x^{3}+6.073 x^{2}-10.778 x+9.878$ | 0.663 | 0.646 | 4.676 | 39 |
| P. Americana ( $\mathrm{n}=41$ ) |  |  |  |  |  |
|  | $Y=2.5286 x+0.549$ | 0.878 | 0.875 | 2.946 | 281 |
|  | $\mathrm{Y}=2.3423 \mathrm{x}^{1.0553}$ | 0.848 | 0.844 | 0.350 | 218 |
|  | $\mathrm{Y}=2.7492 \mathrm{e}^{0.2523 x}$ | 0.772 | 0.766 | 0.429 | 132 |
|  | $\mathrm{Y}=10.049 \mathrm{Ln}(\mathrm{x})-0.4464$ | 0.871 | 0.868 | 3.026 | 264 |
|  | $Y=-0.1839 x^{2}+4.4973 x-2.7737$ | 0.905 | 0.900 | 2.640 | 180 |
|  | $Y=-0.0133 x^{3}+0.0355 x^{2}+3.5045 x-1.6940$ | 0.905 | 0.898 | 2.667 | 118 |
|  | $Y=0.0233 x^{4}-0.5023 x^{3}+3.3941 x^{2}-5.0369 \mathrm{x}+4.8367$ | 0.914 | 0.905 | 2.573 | 96 |
| C. megalocarpus ( $\mathrm{n}=41$ ) |  |  |  |  |  |
|  | $Y=2.2268 x+0.1993$ | 0.698 | 0.690 | 2.939 | 90 |
|  | $\mathrm{Y}=2.3265 \mathrm{x}^{0.9134}$ | 0.614 | 0.604 | 0.454 | 62 |
|  | $\mathrm{Y}=2.2645 \mathrm{e}^{0.2872 x}$ | 0.622 | 0.612 | 0.449 | 64 |
|  | $\mathrm{Y}=6.8396 \operatorname{Ln}(\mathrm{x})+0.6411$ | 0.642 | 0.633 | 3.198 | 70 |
|  | $Y=-0.1166 x^{2}+3.1721 x-1.1708$ | 0.704 | 0.688 | 2.949 | 45 |
|  | $Y=-0.1731 x^{3}+2.006 x^{2}-4.1894 x+5.7012$ | 0.759 | 0.740 | 2.693 | 39 |
|  | $Y=-0.004 x^{4}-0.104 x^{3}+1.6091 x^{2}-3.3286 x+5.1216$ | 0.759 | 0.733 | 2.729 | 28 |

${ }^{1}$ : the corresponding significant F was 0.0000
Table 3: Selected models for the five most dominant tree species

| Species | Model | Observations | $\mathrm{R}^{2}$ | AdjdR $^{2}$ | SE | $\mathrm{F}^{1}$ | Mean residuals |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| C. lusitanica | $\mathrm{y}=2.2384 \mathrm{e} 0.3913 \mathrm{x}$ | 119 | 0.679 | 0.676 | 0.411 | 247 | 1.017 |
| E. saligna | $\mathrm{y}=2.5093 \mathrm{x}+4.1659$ | 102 | 0.590 | 0.586 | 5.862 | 144 | -0.655 |
| G. robusta | $\mathrm{y}=2.6988 \mathrm{x} 1.1516$ | 84 | 0.659 | 0.655 | 0.443 | 158 | -0.213 |
| P. Americana | $\mathrm{Y}=2.5286 \mathrm{x}+0.549$ | 41 | 0.878 | 0.875 | 2.946 | 281 | -0.146 |
| C. megalocarpus | $\mathrm{Y}=2.2268 \mathrm{x}+0.1993$ | 41 | 0.698 | 0.690 | 2.939 | 90 | 0.013 |
| Mean |  |  |  |  |  | 0.0034 |  |

${ }^{1}$ : the corresponding significant F was 0.0000

Table 4: Validation Residual Statistics

| Species | Mean residuals | SD of residuals | Correlation coefficient, r | p-value | Observations, n | Distribution of residuals |
| :--- | :---: | :---: | :---: | :---: | :---: | :---: |
| C. lusitanica | 0.763 | 7.118 | 0.720 | 0.704 | 45 | Randomly distributed |
| E. saligna | 0.105 | 5.548 | 0.631 | 0.942 | 36 | Randomly distributed |
| G. robusta | 0.864 | 5.408 | 0.700 | 0.632 | 37 | Randomly distributed |
| P. Americana | 0.662 | 4.449 | 0.869 | 0.327 | 19 | Randomly distributed |
| C. megalocarpus | -0.911 | 2.408 | 0.913 | 0.657 | 17 | Randomly distributed |

The best models for each species are shown in Table 3. Comparatively these were the models with the highest adjusted $\mathrm{R}^{2}$, least standard error, highest F -value, least dispersion of data points, lowest magnitude of
residuals, and best random distribution of the residuals. For example, in C. lusitanica, though both the linear and exponential models performed quite well, the exponential model was preferred because deviation of the residuals


Fig. 2: Residual plots for C. Iusitanica generated by the exponential model using validation data
was uniformly high for the linear model while they were lower in the exponential model and increasing with increase in crown diameter (Fig. 2). Though polynomial models yielded high $\mathrm{R}^{2}$ values, the F -values were generally low. The F-statistic decreased as number of variables increased due to widened dispersion range of data points as was evident from the residual plots.

When the species selected models were fitted on data reserved for validation, the t-tests, p-values (Table 4) revealed no significant difference between the measured DBH and Model generated DBH values. Similarly the Pearson correlation coefficients, ranging from 0.6310.913 , showed strong correlations between the observed and predicted DBH values.

Validity of the selected models was further supported by the residual plots, which were randomly distributed around their means. The deviation means tended to zero (ranging from 0.105 to -0.911 cm ) with a Standard Deviation (SD) ranging between 2.41 and 7.12 cm .

Generally the deviations were smaller for smaller diameters except those for E. saligna, which were uniformly higher, compared to the others. The observed high residual deviations in E. saligna may be due to
measurement errors. Open growing E. saligna trees had crowns characterised by some unilaterally long branches that reduced the accuracy of the mean crown diameter.

These results imply that simple regression models resulted with the best DBH - Cd models and were best described by the Linear, Exponential and Power models. Hemery et al. (2005) had concluded that the DBH-Cd relationship is close to linear and it provided the best fit model (Lockhart et al., 2005). However, Avsar and Ayyildiz (2005) settled on the power model to describe crown diameter-DBH relationships. Height was not added to the models because it was thought to provide minor improvements to the models (Samantha et al., (2000). While the DBH- Cd relationship would be sigmoid for forest grown trees (Dawkins, 1963) it is expected to be linear for open grown tree species. Polynomial models describe height-DBH relationships (Avsar and Ayyildiz, 2005) better than DBH - Cd relationships and hence generally have low F-values.

When measured DBH values were compared with values generated using each of the calibrated models for the species, F-tests revealed no significant differences in C. lusitanica $(\mathrm{p}=0.803), P$. americana $(\mathrm{p}=0.999)$ and $C$. megalocarpus ( $\mathrm{p}=0.994$ ). Thus, although the selected models are the best fits, other calibrated models are equally good and can sufficiently estimate DBH from Cd. However, model generated data for E. saligna ( $\mathrm{p}=$ 0.0301 ) and $G$. robusta ( $\mathrm{p}=0.0015$ ) differed significantly from the observed ones implying that not all the species calibrated models could be used on these species.

The possibility of using species group models was explored through the completely randomised design concept. Using the selected models DBH values were generated across the species and ANOVA carried out. Generally, the selected models for C. lusitanica, E. saligna and G. robusta yielded predicted DBH values which were statistically the same, across the three species

Table 5: p-values when selected models were applied across species

| Species | Model | C. lusitanica | E. saligna | G. robusta | P. america | C. megalocarpus |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| C. lusitanica | $\mathrm{Y}=2.2384 \mathrm{e} 0.3913 \mathrm{x}$ | 0.437014 | 0.124579 | 0.263135 | 0.014346 | 0.059416 |
| E. saligna | $\mathrm{Y}=2.5093 \mathrm{x}+4.1659$ | 0.011366 | 0.999897 | 0.817442 | 0.049985 | $5.08 \mathrm{E}-05$ |
| G. robusta | $\mathrm{Y}=2.6988 \mathrm{x} 1.1516$ | 0.754911 | 0.739755 | 0.391487 | 0.126665 | 0.029022 |
| P. Americana | $\mathrm{Y}=2.5286 \mathrm{x}+0.549$ | 0.061845 | 0.002188 | 0.000797 | 0.999957 | 0.258092 |
| C. megalocarpus | $\mathrm{Y}=2.2268 \mathrm{x}+0.1993$ | 0.000439 | 0.000439 | 0.000001 | 0.339039 | 0.999863 |


| Category | Model | $\mathrm{R}^{2}$ | Adjusted R ${ }^{2}$ | SE | F |
| :---: | :---: | :---: | :---: | :---: | :---: |
| Group 1 ( $\mathrm{n}=305$ ) |  |  |  |  |  |
|  | $\mathrm{Y}=3.1256 \mathrm{x}+1.1254$ | 0.593086 | 0.591743 | 5.414949 | 441.6 |
|  | $\mathrm{Y}=2.9393 \mathrm{x} 1.0441$ | 0.586071 | 0.584705 | 0.494045 | 429.01 |
|  | $Y=3.7742 \mathrm{e} 0.2566 \mathrm{x}$ | 0.488671 | 0.486983 | 0.549103 | 289.57 |
|  | $\mathrm{Y}=11.285 \operatorname{Ln}(\mathrm{x})-0.3336$ | 0.560277 | 0.558826 | 5.629018 | 386.07 |
| Group $2(\mathrm{n}=82)$ |  |  |  |  |  |
|  | $\mathrm{Y}=2.4956 \mathrm{x}+0.023$ | 0.828798 | 0.826658 | 3.007039 | 387.28 |
|  | $y=2.2739 \times 1.016$ | 0.754454 | 0.751384 | 0.410505 | 245.80 |
|  | $y=2.5113 \mathrm{e} 0.2654 \mathrm{x}$ | 0.721455 | 0.717974 | 0.437219 | 207.21 |
|  | $\mathrm{y}=9.0315 \operatorname{Ln}(\mathrm{x})-0.3592$ | 0.774621 | 0.771804 | 3.450177 | 274.96 |

(Table 5) at a 0.05 level of significance. Similarly, models selected for $P$. americana and $C$. megalocarpus generated DBH values that were statistically the same. This implies that the selected species can be categorised into two groups and models that can work across species calibrated.

The C. lusitanica, E. saligna, G. robusta data sets were combined into Group 1 and P. americana and C. megalocarpus into Group 2 and species group models calibrated. The Linear models fitted best in the data sets with the highest $R^{2}$ and $F$ values (Table 6). In both cases the residuals were randomly distributed around zero. Group 1 model had a mean deviation of 0.60 with standard deviation of 6.13 cm while those of Group 2 model were 0.78 and 4.38 cm respectively. In both data sets there were more residuals in lower diameters than in higher diameters. Once again, pointing to a negative exponential diameter distribution.

In addition, both group model equations displayed high correlation coefficient, 0.706 and 0.833 respectively. In both Group 1 and 2, t-test showed no significant differences ( p -values of $0.531,0.637$ ) between predicted and measured DBH values.

## CONCLUSION AND RECOMMENDATION

Out of a total of 127 tree species that were assessed for crown and stem diameters in the study area the most dominant tree species were C. lusitanica, E. saligna, $G$. robusta, P. americana and C. megalocarpus.

Generally, the developed models fitted well (adjusted $R^{2} \geq 0.50, F$ values of between 90 and 281). Of the fitted models, the Linear, Exponential and Power models performed better showing the highest $\mathrm{R}^{2}$ (up to 0.875 , $0.676,0.655$ ) and $F$ values ( 281,247158 ). Five out of the thirty-five calibrated models were selected based on adjusted $\mathrm{R}^{2}$, standard error, F statistic, dispersion of data points, magnitude of residuals, and random distribution of the residuals, and validated as best for predicting stem diameter from crown diameter . In addition, group models showed better fit by having high $\mathrm{R}^{2}$ values ( 0.591 and 0.826 ) and tested well on validation, revealing that common models can work well for a group of species.

It should be noted that the models developed by this study were based on data collected in Sondu-Nyando Catchment region and also covered a limited range of stem and crown diameters. The models should therefore be used with caution outside this region. Further studies need to be done to test applicability of these models across similar Agro-ecological zones and to relate the growth rates/patterns in both stem and crown diameters of open grown tree species to the fitted models.

## ACKNOWLEDGMENT

The authors are grateful to Lake Victoria Environmental Management Programme (LVEMP) for funding the data collection phase of this study. Special thanks to Mrs. Beatrice Mbula and Mr. George Karanu for assisting in data collection and in species identification, and to Dr. Balozi for reading the manuscript and making very useful comments.

## Appendices:

Appendix A: Description statistics of data used in model development and validation

| Species | Operation | Variable | Observations | Mean | SE | SD | Skewness | Minimum | Maximum |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| C. lusitanica | Calibration | DBH(cm) | 119 | 9.98 | 0.72 | 7.88 | 1.37 | 2.5 | 33 |
|  |  | CD (m) | 119 | 3.13 | 0.14 | 1.52 | 0.57 | 0.9 | 7.3 |
|  | Validation | DBH | 45 | 11.54 | 1.44 | 9.65 | 1.47 | 2.5 | 38 |
|  |  | CD (m) | 45 | 3.35 | 0.26 | 1.76 | 0.71 | 1 | 8 |
| E. saligna | Calibration | DBH(cm) | 102 | 14.07 | 0.90 | 9.11 | 1.21 | 1 | 54 |
|  |  | CD (m) | 102 | 3.95 | 0.28 | 2.79 | 1.97 | 0.8 | 16 |
|  | Validation | DBH(cm) | 36 | 11.31 | 1.21 | 7.25 | 0.10 | 1.5 | 23.5 |
|  |  | CD (m) | 36 | 2.81 | 0.31 | 1.86 | 1.92 | 1 | 10 |
| G. robusta | Calibration | DBH(cm) | 84 | 13.00 | 0.86 | 7.86 | 0.36 | 2 | 32 |
|  |  | CD (m) | 84 | 3.61 | 0.18 | 1.66 | 0.40 | 0.5 | 8.4 |
|  | Validation | DBH(cm) | 37 | 13.28 | 1.43 | 8.68 | 0.23 | 1.2 | 29 |
|  |  | CD (m) | 37 | 3.70 | 0.29 | 1.77 | -0.01 | 0.5 | 8 |
| P. Americana | Calibration | DBH(cm) | 41 | 11.21 | 1.30 | 8.33 | 0.46 | 1.8 | 30.5 |
|  |  | CD (m) | 41 | 4.22 | 0.48 | 3.09 | 0.77 | 0.8 | 10 |
|  | Validation | DBH(cm) | 19 | 13.92 | 1.83 | 7.97 | 0.66 | 2.5 | 33 |
|  |  | CD (m) | 19 | 4.40 | 0.44 | 1.93 | 0.04 | 1.4 | 8 |
| C. megalocarpus | Calibration | DBH(cm) | 41 | 7.17 | 0.82 | 5.28 | 1.05 | 1.8 | 20 |
|  |  | CD (m) | 41 | 3.13 | 0.31 | 1.98 | 0.98 | 1 | 8 |
|  | Validation | DBH(cm) | 17 | 6.59 | 1.40 | 5.76 | 1.86 | 2.1 | 22 |
|  |  | CD (m) | 17 | 3.28 | 0.66 | 2.73 | 2.22 | 1 | 12 |

$\overline{\text { DBH: diameter at breast height; CD: crown diameter }}$

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| S. No. | Tree species | Stems no. | IV | S. No. | Tree species | Stems no. | IV |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| 1 | Eucalyptus saligna | 647 | 107.479 | 54 | Ekebergia capensis | 3 | 9.628 |
| 2 | Cuppresus lusitanica | 327 | 91.692 | 55 | Citrus sinensis | 2 | 9.598 |
| 3 | Grevillea robusta | 168 | 84.188 | 56 | Calliandra calothysus | 70 | 7.203 |
| 4 | Croton megalocarpus | 117 | 53.194 | 57 | Delonix regia | 9 | 6.143 |
| 5 | Persea Americana | 72 | 53.153 | 58 | Acacia schimperi | 32 | 5.849 |
| 6 | Markhamia lutea | 86 | 51.603 | 59 | Prosopsis juliflora | 5 | 5.662 |
| 7 | Psidium guajava | 68 | 51.470 | 60 | Tipuana tipu | 3 | 5.641 |
| 8 | Croton macrostachyus | 92 | 45.320 | 61 | Ficus thonningii | 5 | 5.562 |
| 9 | Vangueria infausta | 95 | 42.967 | 62 | Faurea saligna | 1 | 5.406 |
| 10 | Rhus natalensis | 99 | 35.230 | 63 | Calodendrum capense | 4 | 5.306 |
| 11 | Acacia lahai | 102 | 33.392 | 64 | Annona cherimola | 3 | 5.236 |
| 12 | Casimiroa edulis | 7 | 29.087 | 65 | Plectranthus barbatus | 12 | 5.154 |
| 13 | Sesbania sesban | 150 | 28.958 | 66 | Bersama abyssinica | 4 | 5.141 |
| 14 | Osyris lanceolata | 65 | 27.891 | 67 | Celtis Africana | 3 | 5.026 |
| 15 | Eucalyptus camadulensis | 167 | 27.043 | 68 | Piliostigma thonningii | 3 | 5.005 |
| 16 | Rhus vulgaris | 54 | 26.643 | 69 | Grewia bicolor | 3 | 4.948 |
| 17 | Erythrina abyssinica | 17 | 25.884 | 70 | Combretum collinum sub sp bind | derianum | 34.937 |
| 18 | Prunus Africana | 18 | 25.296 | 71 | Vepris nobilis | 5 | 4.930 |
| 19 | Carica papaya | 11 | 24.762 | 72 | Polyscias kikuyuensis | 1 | 4.927 |
| 20 | Eriobotrya japonica | 13 | 24.749 | 73 | Caesalpinia decapetala | 5 | 4.923 |
| 21 | Mangifera indica | 13 | 24.564 | 74 | Azadirachta indica | 1 | 4.909 |
| 22 | Acacia mearnsii | 55 | 22.479 | 75 | Hagenia abyssinica | 2 | 4.900 |
| 23 | Bridelia micrantha | 42 | 22.254 | 76 | Lophostemon confertus | 1 | 4.884 |
| 24 | Acacia melanoxylon | 21 | 20.708 | 77 | Fagara macrophylla | 3 | 4.875 |
| 25 | Trichilia emetica | 37 | 20.584 | 78 | Casuarina equisetifolia | 1 | 4.869 |
| 26 | Syzygium quineensis | 20 | 20.125 | 79 | Grewia tembensis | 2 | 4.868 |
| 27 | Spathodea campanulata | 8 | 19.943 | 80 | Euphorbia candelabrum | 3 | 4.867 |
| 28 | Albizia gummifera | 8 | 19.525 | 81 | Olea europaea sub sp europaea | 2 | 4.864 |
| 29 | Ricinus communis | 6 | 19.274 | 82 | Trimerea grandifolia | 3 | 4.862 |
| 30 | Thevetia peruviana | 51 | 16.458 | 83 | Euphorbia tirucalli | 3 | 4.859 |
| 31 | Lantana camara | 61 | 16.295 | 84 | Manihot glaziovii | 1 | 4.852 |
| 32 | Cassia siamea | 35 | 15.908 | 85 | Sapium ellipticum | 1 | 4.846 |
| 33 | Balanites aegyptica | 6 | 15.574 | 86 | Annona squamosa | 2 | 4.845 |
| 34 | Ficus pennsylvanica | 7 | 15.430 | 87 | Schinus molle | 1 | 4.838 |
| 35 | Jacaranda mimosifolia | 7 | 15.187 | 88 | Ficus benjamina | 1 | 4.832 |
| 36 | Flacourtia indica | 6 | 14.901 | 89 | Citrus limon | 2 | 4.831 |
| 37 | Makaranga kilimandscharica | 7 | 14.678 | 90 | Keetia gueinzii | 2 | 4.827 |
| 38 | Melia azedarach | 5 | 14.667 | 91 | Terminalia mantaly | 1 | 4.819 |
| 39 | Podocarpus fulcatus | 3 | 14.658 | 92 | Acacia siemberiana | 1 | 4.819 |
| 40 | Ekebergia rueppeliana | 6 | 14.654 | 93 | Pavetta gardeniifolia | 1 | 4.815 |
| 41 | Acacia xanthophloea | 3 | 14.607 | 94 | Maesopsis eminii | 1 | 4.811 |
| 42 | Acacia Senegal | 3 | 14.591 | 95 | Gliricidia sepium | 1 | 4.807 |
| 43 | Entada abyssinica | 20 | 14.484 | 96 | Acacia hockii | 1 | 4.807 |
| 44 | Fagaropsis angolensis | 4 | 14.434 | 97 | Pistacia aethiopica | 1 | 4.804 |
| 45 | Combretum molle | 12 | 12.216 | 98 | Acacia nilotica | 1 | 4.800 |
| 46 | Ficus sycomorus | 15 | 12.173 | 99 | Acacia elatior | 1 | 4.799 |
| 47 | Euclea divinorum | 5 | 10.364 | 100 | Ficus sur | 1 | 4.798 |
| 48 | Warburgia ugandensis | 7 | 10.213 | 101 | Morus alba | 1 | 4.797 |
| 49 | Terminalia brownie | 9 | 9.883 | 102 | Vitex keniensis | 1 | 4.797 |
| 50 | Hakea saligna | 5 | 9.806 | 103 | Gnidia subcordata | 1 | 4.797 |
| 51 | Nuxia congesta | 3 | 9.742 | 104 | Eleocharis cellulose | 1 | 4.795 |
| 52 | Olea europaea sub sp Africana | 3 | 9.723 | 105 | Phoenix dactylifera | 1 | 4.795 |
| 53 | Bauhinia variegate | 3 | 9.682 | 106 | Others (7 species) | 8 | $\approx 4.8$ each |

Grand total no. of stems $=3101$

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