

# Allometric model for estimating leaf area in clonal varieties of coffee (*Coffea canephora*)<sup>1</sup>

## Modelo alométrico para estimativa da área foliar de variedades clonais de café (*Coffea canephora*)

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**ABSTRACT** - The evaluation of leaf area is required in several agronomic studies given their importance to assess the plant growth. The objective of this study was to use statistical models to estimate leaf area of five clonal varieties of coffee (*Coffea canephora*) from linear dimensions (length and width maximum). Were used in the studies five varieties of *Coffea canephora* Pierre ex Froehner: Emcapa 8111, Emcapa 8121, Emcapa 8131, Emcapa 8141 and at Incaper 8142. The results obtained in this study allow us to conclude that the linear model expresses the best estimate of leaf area. Among the different independent variables adopted, the product of length and greatest width (L.W) was found to be the greatest significance and higher coefficients of determination ( $R^2$ ). The regression equation that best expresses the estimated leaf area for the five clonal varieties is  $\hat{Y}_i = 0.6723 + 0.6779 x_i$ , where  $x_i$  represents the product of the greatest length and the greatest width of the leaves.

**Key words:** *Coffea canephora*. Leaf dimension. Non-destructive method.

**RESUMO** - A mensuração da área foliar é requerida em vários estudos agrônômicos, em função de sua importância para avaliar o crescimento das plantas. O objetivo deste trabalho foi utilizar modelos estatísticos, para estimar a área foliar de cinco variedades clonais de café (*Coffea canephora*), a partir das dimensões lineares (comprimento e largura máximos) do limbo foliar. Foram utilizadas nos estudos cinco variedades de *Coffea canephora* Pierre ex Froehner: Emcapa 8111, Emcapa 8121, Emcapa 8131, Emcapa 8141 e Incaper 8142. Os resultados alcançados neste estudo permitem concluir que o modelo linear expressa melhor a estimativa de área foliar. Dentre as diferentes variáveis independentes adotadas, o retângulo circunscrito à folha (C.L) foi a que proporcionou maiores significâncias e maiores coeficientes de determinação ( $R^2$ ). A equação de regressão que melhor expressa a estimativa da área foliar para as cinco variedades clonais é:  $\hat{Y}_i = 0,6723 + 0,6779 x_i$ ; em que  $x_i$  representa o produto entre o maior comprimento e a maior largura do limbo foliar.

**Palavras-chave:** *Coffea canephora*. Dimensão foliar. Método não destrutivo.

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## INTRODUCTION

Coffee is a major source of income for the Brazilian economy, bringing many benefits to the country, among which can be highlighted a share in foreign exchange earnings, the transfer of income to other sectors of the economy, a contribution to capital formation in the agricultural sector of the country, as well as an effective capability to absorb manpower.

Knowledge of leaf area is fundamental, being one of the most important resources for assessing the growth and development of plants. By virtue of being linked to increases in dry matter, it becomes possible to estimate such physiological parameters as transpiration rate, net assimilation rate, leaf area ratio, specific leaf area and leaf area index (AMARAL *et al.*, 2009).

Destructive methods have the drawback of not being applicable when the number of replications or number of samples is limited, and when it is wanted to evaluate other characteristics besides the leaf area, or assess the interval of vegetative growth over time for any one leaf. They are also time consuming. Direct, non-destructive methods using modern equipment conserve the samples, but because of their heavy cost, such equipment is not always easy to obtain (BENINCASA, 2003).

The indirect, non-destructive method is the most suitable, mainly due to the logistical difficulties in obtaining data. This method consists in the application of dimensional analysis or allometry. Mathematical equations that relate linear measurements of the leaf blade to its actual area in order to estimate the leaf area, constitute an indirect, non-destructive method, which is very accurate and of low cost. This eliminates the need for leaf area meters or lengthy geometric reconstructions (AMARAL *et al.*, 2009; BENINCASA, 2003).

Research carried out by Antunes *et al.* (2008), Awatramani and Gopalakrishna (1965), Barros *et al.* (1973), Ferreira *et al.* (2010), and Silva Leite and Ferreira (2008), report estimating leaf area in *Coffea arabica*, however, only the articles of Antunes *et al.* (2008) and Partelli *et al.* (2006) talk of *Coffea canephora*. It should be noted that, as it is allogamous, varieties of the species *Coffea canephora* generally present different shapes of leaf blade (FONSECA *et al.*, 2006). Due to these variations in leaf morphology, differences may also occur in the equation model among varieties of the species.

In estimating a statistical model for leaf area in ginger (*Zingiber officinale*), Kandiannan *et al.* (2009) concluded that the same equation can be used for the five varieties studied: Varada, Rejatha, Mahima, Maran and Himachal. A similar conclusion is arrived at by Aquino *et al.* (2011) for leaf area in the sunflower (*Helianthus annuus*) cultivars,

BR-122 and M-734. However, Araujo Santos and Prado (2005) found that response patterns when estimating leaf area were different between the mango (*Mangifera indica*) cultivars, Tommy Atkins and Haden. Schmidt *et al.* (2014), working with the Catuai Vermelho and Catuai varieties of arabica coffee (*Coffea arabica*), also found differences in response patterns between cultivars. Sezer, Oner and Mut (2009), working with seven cultivars of maize, point out that a model of leaf area estimation found for one cultivar, should not be extrapolated to cultivars not yet investigated. In research into leaf area estimation with *Coffea canephora* (ANTUNES *et al.*, 2008; PARTELLI *et al.*, 2006), statistical modelling for the different clonal varieties of this species is not addressed.

The aim of the present work was to use statistical models to estimate leaf area in five clonal varieties of coffee (*Coffea canephora*) from linear dimensions of the leaf blade (length and maximum width).

## MATERIAL AND METHODS

The work was carried out on the species *Coffea canephora* Pierre ex Froehner. Five clonal varieties, developed by the Capixaba Institute of Research, Technical Assistance and Rural Extension (FERRÃO *et al.*, 2007), were employed: Emcapa 8111 (Precoce), Emcapa 8121 (Intermediário), Emcapa 8131 (Tardio), Emcapa 8141 (Robustão capixaba) and Incaper 8142 (Conilon Vitória), all planted in 2004, and with leaves harvested in 2009. The first four varieties (Emcapa 8111, Emcapa 8121, Emcapa 8131 and Emcapa 8141), were planted in the experimental area of the Capixaba Institute of Research and Rural Extension (INCAPER) in Pacotuba, Cachoeiro do Itapamirim, in the state of Espírito Santo, Brazil (ES), at a spacing of 3.0 m x 1.20 m and 15,000 stems per hectare. The Incaper 8142 variety was planted in the experimental area of the Centre for Agricultural Sciences (CCA) of the Federal University of Espírito Santo (UFES), in the municipality of Alegre, at a spacing of 2.0 m x 1.0 m and 15,000 stems per hectare. The varieties were identified, and the leaves harvested, packed into plastic bags and transferred to the Forest Ecology Laboratory of the Centre for the Study and Diffusion of Forest Technology, Water Resources and Sustainable Agriculture (NEDTEC), CCA/UFES.

One hundred leaves from 20 plants of each variety were sampled, as suggested by Benincasa (2003). Leaves, at all stages of development and which were undamaged and showed no evidence of attack by disease or pests, were collected from each plant at the four cardinal points.

The observed leaf area (OLA) was calculated for all the leaves collected from each clonal variety, being

determined by means of a model LI-3100, LI-COR electronic area meter. For this, the meter was calibrated using a paper square of known area (100 cm<sup>2</sup>), which was then compared to the value given by the device. After determining the observed leaf area, measurements for the greatest width of the leaves (W) were taken, generally at a central position on the leaf, perpendicular to the lines of longest length. The longest length along the main rib (L) was also measured, considering the insertion point of the blade on the petiole to its apex (AMARAL *et al.*, 2009). To do this a Digimess digital caliper was used. From the data for L and W, the product of L and W (L.W) was also determined.

From the 100 leaves of each variety, 50 leaves were later randomly selected and used in determining descriptive statistics (minimum, maximum, range, mean, median and coefficient of variation), as well as to model the observed leaf area (dependent variable =  $\hat{Y}_i$ ) as a function of L, W and L.W as the independent variables ( $x_i$ ), by means of the models: linear ( $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i$ ), quadratic ( $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x + \hat{\beta}_2 x^2$ ) and power ( $\hat{Y}_i = \hat{\beta}_0 x^{\hat{\beta}_1}$ ), applying the three models to each clonal variety.

Validation of the models for leaf area estimation was based on the values estimated by the model ( $\hat{Y}_i$ ) and the observed values ( $Y_i$ ) for the five varieties. Initially, for each model, a simple linear regression of the leaf area estimated by the model (dependent variable) was fitted as a function of the observed leaf area (independent variable). The hypotheses,  $H_0: \beta_0 = 0$  versus  $H_1: \beta_0 \neq 0$  and  $H_0: \beta_1 = 1$  versus  $H_1: \beta_1 \neq 1$  were tested by Student's t-test at 5% probability. Next, the Pearson linear correlation coefficient (r) and the coefficient of determination ( $R^2$ ) were calculated between  $\hat{Y}_i$  and  $Y_i$ . For each model, the root mean square error (RMSE) was calculated by means of the expression  $RMSE = \sqrt{\sum_{i=1}^n (\hat{Y}_i - Y_i)^2 / n}$ , where:  $\hat{Y}_i$  are the estimated values for leaf area,  $Y_i$  are the observed values for leaf area and n is the number of leaves.

The criteria used to select models that best estimate leaf area in clonal varieties of *Coffea canephora* as a function either of the longest length of the leaf blade (L), or the greatest width of the leaf blade (W), or a rectangle circumscribed by the leaf (L.W), were linear coefficient not different to zero, slope not different to one, Pearson linear correlation coefficient (r) and coefficient of determination ( $R^2$ ) closest to one, and root mean square error (RMSE) closest to zero, as per Cargnelutti Filho *et al.* (2012 a,b). Statistical analyses were carried out using Microsoft Office Excel (LEVINE *et al.*, 2012) and the Genes software (CRUZ, 2013).

After selection of the best models, the confidence interval was determined with 95% significance for the parameters  $\beta_0$  e  $\beta_1$  in the estimating equations, and verifying that  $\beta_0$  e  $\beta_1$  were contained within the same interval, a single equation was fitted that would

represent all five clonal varieties. This was done based on the 250 leaves previously used to fit the models for each variety (50 leaves per variety). Validation of the new model was done using the 250 leaves previously used for validation, i.e. 50 leaves from each variety. The validation criteria were the same used for validation of each variety.

## RESULTS AND DISCUSSION

It can be seen in Table 1, that the collected leaves displayed considerable variability in length (L), width (W), the product of length and width (L.W), and observed leaf area, as measured by the coefficient of variation (CV) and range. The largest value for CV, of 38.50%, was seen for L.W in the Vitória variety. High values for range and coefficient of variation are important in studies such as this, which seek to represent leaf area by statistical models involving regression. Levine *et al.* (2012) explain that when using regression models for estimation, the values for the independent variable it is wanted to estimate, should not extrapolate the values used in constructing the regression model.

The variety Emcapa 8111 (Precoce) presented larger leaves than the other varieties, while the varieties Emcapa 8141 (Robustão capixaba) and Incaper 8142 (Conilon Vitória) have the smallest linear dimensions. In descending order of linear dimension of the leaf blade, the clonal varieties under study can be sorted as follows: Emcapa 8111 (Precoce) > Emcapa 8121 (Intermediário) ~ Emcapa 8131 (Tardio) > Emcapa 8141 (Robustão capixaba) ~ Incaper 8142 (Conilon Vitória). These discrepancies occurred because *Coffea canephora* is a cross-fertilised species due to having a series of genetic factors S, which are associated with self-incompatibility (CONAGIN; MENDES, 1961). As a result of this variation in leaf morphology in *C. canephora* (FONSECA *et al.*, 2006), differences may also arise in the allometric model for leaf dimension among varieties of the species.

Evaluating these measurements, it can be seen that the best fit was for the measurement of L.W in all the clonal varieties under study, ensuring correlation coefficients with values from 0.9619 to 0.9857 (Table 2). In studies of leaf area with Conilon coffee, Antunes *et al.* (2008) also found a better fit for L.W; the same did not occur with Partelli *et al.* (2006), who recommend an adjustment based only on the length of the leaf blade. The results achieved in the present study are in accordance with regressions which are the most representative in estimating leaf area, and which involved the product L.W (ARAÚJO; SANTOS,

PRADO, 2005; BARROS *et al.*, 1973; CALDAS PINTO *et al.*, 2007; CARGNELUTTI FILHO *et al.*, 2012b; PEKSEN, 2007; SEDAR; DEMIRSOY, 2006; TSIALTAS; KOUNDOURAS; ZIOZIOU, 2008). In other works however, the best results involved the greatest width of the leaf blade (CARGNELUTTI FILHO *et al.*, 2012a; QUEIROGA *et al.*, 2003) or the longest length along the main rib (POSSE *et al.*, 2009).

In selecting a model, the most suitable were the linear and power models that relate L to W, since they have high values for the coefficient of determination and the statistic  $\beta^1$  different to zero (Tabela 2). It can also be noted that some quadratic equations have a  $\beta^2$  coefficient which is not significant at 5% probability. Therefore, although the quadratic model displays greater coefficients of determination, generally higher

than the other models under study for each cultivar, it should not be used for estimating the leaf area in clonal varieties of *Coffea canephora*, since fitting a polynomial model should be based on the significance of the coefficients, and not the coefficient of determination (STORCK *et al.*, 2006).

Based on the indicators used for validation of the equations, the most suitable estimated models were the linear and power models, which used L.W as an independent variable, as these presented in the validation a linear coefficient not different to zero, linear correlation coefficients statistically equal to one, a Pearson correlation coefficient statistically different to zero, a coefficient of determination closest to one, and the lowest value for the mean square error (Table 3).

**Table 1** - Descriptive statistics for length (L), width (W), product of length and width (L.W) and observed leaf area (OLA) in 50 leaves from five clonal cultivars of *Coffea canephora* Pierre *ex* Froehner

	Minimum	Maximum	Range	Mean	Median	CV (%)
‘Precoce’						
L	10.40	23.20	12.80	16.13	16.00	17.07
W	3.50	10.30	6.80	6.63	6.65	19.81
L.W	36.40	234.84	198.44	109.58	106.27	34.59
OLA	25.53	178.00	152.47	76.14	73.83	35.42
‘Intermediário’						
L	10.00	20.90	10.90	15.52	15.10	14.90
W	3.90	8.90	5.00	6.20	6.20	18.21
L.W	46.80	186.01	139.21	97.96	94.44	30.96
OLA	32.29	129.76	97.47	67.82	64.42	30.37
‘Tardio’						
L	10.20	23.00	12.80	15.25	15.00	16.97
W	4.10	8.50	4.40	6.29	6.10	15.38
L.W	50.43	193.20	142.77	97.43	92.18	29.24
OLA	34.13	125.17	91.04	67.72	62.72	28.86
‘Robustão capixaba’						
L	9.60	19.30	9.70	14.70	14.70	14.24
W	4.30	10.10	5.80	6.12	6.10	17.23
L.W	41.28	188.87	147.59	91.56	89.67	29.20
OLA	26.89	118.52	91.63	57.70	55.91	29.62
‘Vitória’						
L	8.60	23.50	14.90	14.12	13.65	18.91
W	3.40	9.30	5.90	5.75	5.60	19.58
L.W	29.24	218.55	189.31	83.67	77.19	38.50
OLA	17.70	140.6	122.90	59.90	55.70	37.17

**Table 2** - Equations for determining leaf area ( $\hat{Y}_i$ ), using length (L), width (W) and the product of length and width (L.W) as independent variables ( $x_i$ ), and coefficient of determination ( $R^2$ ), based on 50 leaves from five clonal cultivars of *Coffea canephora* Pierre ex Froehner

Model	$x_i$	Equation	$R^2$
‘Precoce’			
Linear: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = -65.5949 + 8.7894^{**} x_i$	0.8051
	W	$\hat{Y}_i = -50.0582 + 19.0452^{**} x_i$	0.8590
	L.W	$\hat{Y}_i = -0.4287 + 0.6986^{**} x_i$	0.9646
Quadratic: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i + \hat{\beta}_2 x_i^2$ $H_0: \beta_2 = 0$ $H_1: \beta_2 \neq 0$	L	$\hat{Y}_i = 27.9261 - 2.8166 x_i + 0.3499^{**} x_i^2$	0.8208
	W	$\hat{Y}_i = 26.9430 - 5.0418 x_i + 1.8110^{**} x_i^2$	0.8845
	L.W	$\hat{Y}_i = 6.4881 + 0.5729 x_i + 0.0005^{**} x_i^2$	0.9662
Power: $\hat{Y}_i = \hat{\beta}_0 x_i^{\hat{\beta}_1}$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = 0.3890 x_i^{1.8851^{**}}$	0.7998
	W	$\hat{Y}_i = 3.3122 x_i^{1.6427^{**}}$	0.8908
	L.W	$\hat{Y}_i = 0.7091 x_i^{0.9951^{**}}$	0.9619
‘Intermediário’			
Linear: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = -53.3395 + 7.8059^{**} x_i$	0.7684
	W	$\hat{Y}_i = -38.6435 + 17.1821^{**} x_i$	0.8858
	L.W	$\hat{Y}_i = 1.7571 + 0.6742^{**} x_i$	0.9857
Quadratic: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i + \hat{\beta}_2 x_i^2$ $H_0: \beta_2 = 0$ $H_1: \beta_2 \neq 0$	L	$\hat{Y}_i = 61.3378 - 6.9830 x_i + 0.4665^{**} x_i^2$	0.7888
	W	$\hat{Y}_i = 20.3482 - 2.0515 x_i + 1.5177^{**} x_i^2$	0.8976
	L.W	$\hat{Y}_i = 0.9447 + 0.6907 x_i - 0.0001^{ns} x_i^2$	0.9857
Power: $\hat{Y}_i = \hat{\beta}_0 x_i^{\hat{\beta}_1}$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = 0.5645 x_i^{1.7369^{**}}$	0.7475
	W	$\hat{Y}_i = 3.9895 x_i^{1.5429^{**}}$	0.8942
	L.W	$\hat{Y}_i = 0.7752 x_i^{0.9754^{**}}$	0.9851
‘Tardio’			
Linear: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = -33.8232 + 6.6342^{**} x_i$	0.7802
	W	$\hat{Y}_i = -44.2520 + 17.7366^{**} x_i$	0.7804
	L.W	$\hat{Y}_i = 1.7745 + 0.6728^{**} x_i$	0.9746
Quadratic: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i + \hat{\beta}_2 x_i^2$ $H_0: \beta_2 = 0$ $H_1: \beta_2 \neq 0$	L	$\hat{Y}_i = 14.3474 + 4.1143 x_i + 0.0792^{ns} x_i^2$	0.7816
	W	$\hat{Y}_i = 12.3817 - 0.5070 x_i + 1.4353^{ns} x_i^2$	0.7875
	L.W	$\hat{Y}_i = -1.0866 + 0.7309 x_i - 0.0003^{ns} x_i^2$	0.9746
Power: $\hat{Y}_i = \hat{\beta}_0 x_i^{\hat{\beta}_1}$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = 1.1145 x_i^{1.4981^{**}}$	0.7705
	W	$\hat{Y}_i = 3.2206 x_i^{1.6415^{**}}$	0.7967
	L.W	$\hat{Y}_i = 0.7749 x_i^{0.9749^{**}}$	0.9746
‘Robustão capixaba’			
Linear: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = -49.1127 + 7.2643^{**} x_i$	0.7918
	W	$\hat{Y}_i = -35.7804 + 19.2873^{**} x_i$	0.8881
	L.W	$\hat{Y}_i = 0.0400 + 0.6997^{**} x_i$	0.9705
Quadratic: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i + \hat{\beta}_2 x_i^2$ $H_0: \beta_2 = 0$ $H_1: \beta_2 \neq 0$	L	$\hat{Y}_i = 10.2167 - 1.0487 x_i + 0.2852^{**} x_i^2$	0.8003
	W	$\hat{Y}_i = -42.6462 + 17.4795 x_i - 0.1699^{ns} x_i^2$	0.8884
	L.W	$\hat{Y}_i = 1.0437 + 0.6077 x_i - 0.0001^{ns} x_i^2$	0.9705
Power: $\hat{Y}_i = \hat{\beta}_0 x_i^{\hat{\beta}_1}$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = 0.3858 x_i^{1.8538^{**}}$	0.8289
	W	$\hat{Y}_i = 2.7651 x_i^{1.6669^{**}}$	0.8877
	L.W	$\hat{Y}_i = 0.6644 x_i^{0.9880^{**}}$	0.9679

Continued Table 2

‘Vitória’			
Linear: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = -49.4186 + 7.7428^{**} x_i$	0.8617
	W	$\hat{Y}_i = -48. + 18.8299^{**} x_i$	0.9073
	L.W	$\hat{Y}_i = 3.0298 + 0.6796^{**} x_i$	0.9670
Quadratic: $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i + \hat{\beta}_2 x_i^2$ $H_0: \beta_2 = 0$ $H_1: \beta_2 \neq 0$	L	$\hat{Y}_i = -13.3481 + 2.7929 x_i + 0.1638^{**} x_i^2$	0.8685
	W	$\hat{Y}_i = 3.5869 + 1.2365 x_i + 1.4330^{**} x_i^2$	0.9194
	L.W	$\hat{Y}_i = -4.0887 + 0.8357 x_i - 0.0008^{**} x_i^2$	0.9702
Power: $\hat{Y}_i = \hat{\beta}_0 x_i^{\hat{\beta}_1}$ $H_0: \beta_1 = 0$ $H_1: \beta_1 \neq 0$	L	$\hat{Y}_i = 0.4896 x_i^{1.8030^{**}}$	0.8652
	W	$\hat{Y}_i = 2.5718 x_i^{1.7816^{**}}$	0.8978
	L.W	$\hat{Y}_i = 0.7709 x_i^{0.9833^{**}}$	0.9675

\*. \*\* Significant by t-test at 5% and 1% probability respectively. <sup>ns</sup> Not-significant

**Table 3** - Independent variables ( $x_i$ ) linear coefficient ( $\hat{\beta}_0$ ), slope ( $\hat{\beta}_1$ ), Pearson linear correlation coefficient ( $r$ ) and coefficient of determination ( $R^2$ ), obtained in the adjusted regression between estimated leaf area (dependent variable) and observed leaf area (independent variable); root mean square error (RMSE), calculated based on estimated and observed leaf area, in 50 leaves from five clonal cultivars of *Coffea canephora* Pierre ex Froehner

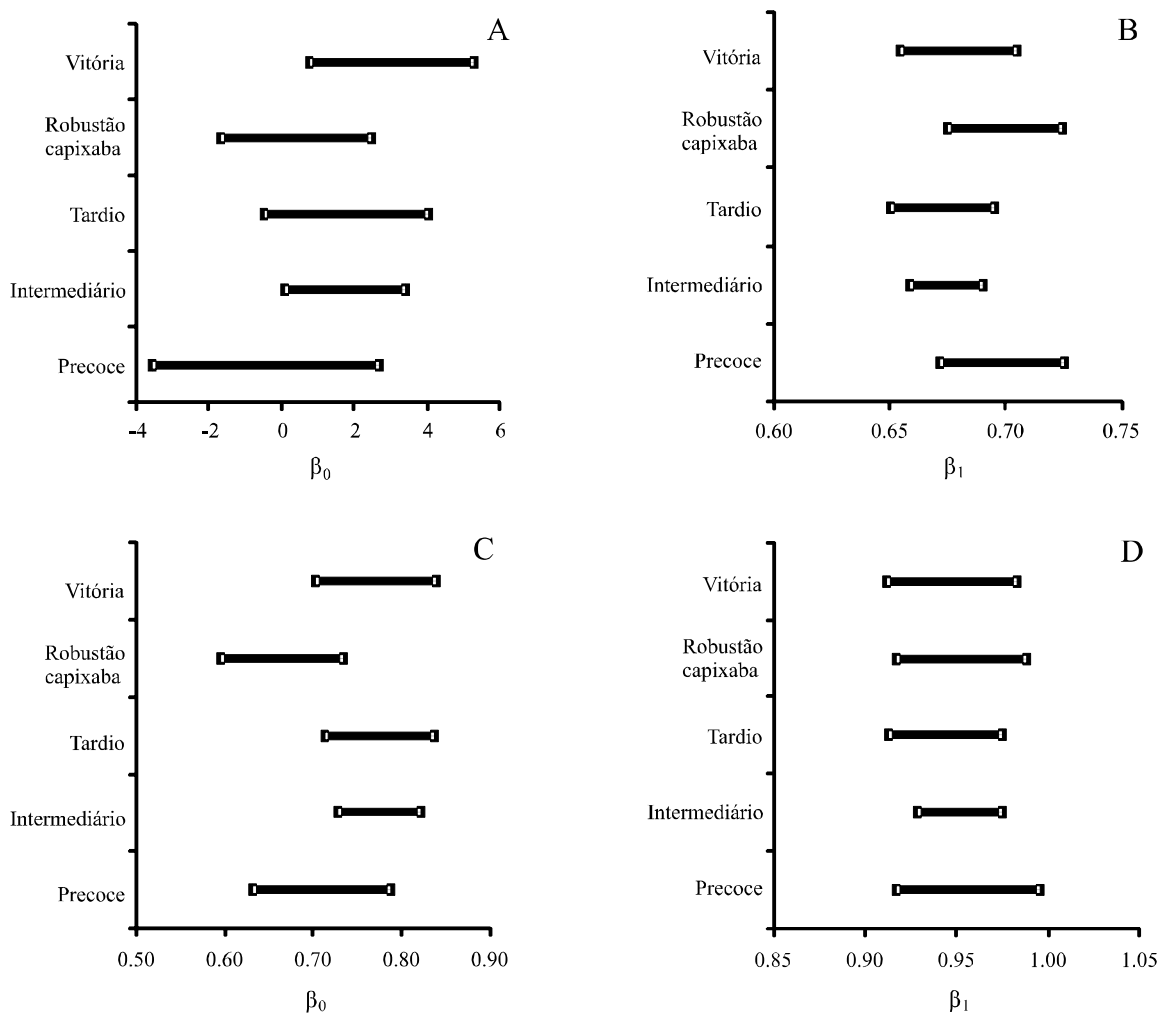
Model	$x_i$	$\hat{\beta}_0^{(1)}$	$\hat{\beta}_1^{(2)}$	$r^{(3)}$	$R^2$	RMSE
‘Precoce’						
Linear	L	10.0533*	0.8865*	0.9351*	0.8744	9.4900
Linear	W	10.2008*	0.8385*	0.9383*	0.8804	9.8071
Linear	L.W	-1.3435 <sup>ns</sup>	1.0135 <sup>ns</sup>	0.9954*	0.9908	2.6293
Power	L	7.0367 <sup>ns</sup>	0.9144 <sup>ns</sup>	0.9415*	0.8864	9.0292
Power	W	10.9201*	0.8254*	0.9439*	0.8910	9.6410
Power	L.W	-0.5150 <sup>ns</sup>	0.9999 <sup>ns</sup>	0.9954*	0.9908	2.6153
‘Intermediário’						
Linear	L	20.6691*	0.7488*	0.9103*	0.8285	10.4440
Linear	W	6.1718*	0.8666*	0.9655*	0.9321	7.3320
Linear	L.W	1.7666 <sup>ns</sup>	0.9811 <sup>ns</sup>	0.9948*	0.9897	2.4769
Power	L	20.6757*	0.7371*	0.9235*	0.8528	9.8126
Power	W	7.0470*	0.8520*	0.9674*	0.9358	7.3899
Power	L.W	1.7506 <sup>ns</sup>	0.9804 <sup>ns</sup>	0.9948*	0.9896	2.4786
‘Tardio’						
Linear	L	14.5269*	0.8018*	0.9092*	0.8267	9.2986
Linear	W	12.5463*	0.7729*	0.9243*	0.8544	9.6999
Linear	L.W	0.4921 <sup>ns</sup>	0.9863 <sup>ns</sup>	0.9864*	0.9731	3.7068
Power	L	13.7859*	0.7495*	0.9252*	0.8560	9.3772
Power	W	13.7859*	0.7495*	0.9252*	0.8560	10.0222
Power	L.W	0.4226 <sup>ns</sup>	0.9856 <sup>ns</sup>	0.9866*	0.9734	3.7014
‘Robustão capixaba’						
Linear	L	10.6893*	0.7723*	0.9119*	0.8315	8.0786
Linear	W	18.3060*	1.1178*	0.9482*	0.8991	10.0387
Linear	L.W	2.1668 <sup>ns</sup>	1.0586*	0.9869*	0.9740	3.4630

Continued Table 3

Power	L	12.1614*	0.7411*	0.9176*	0.8383	8.1718
Power	W	4.2683 <sup>ns</sup>	0.9347 <sup>ns</sup>	0.9402*	0.8839	6.4731
Power	L.W	2.5710 <sup>ns</sup>	0.9402 <sup>ns</sup>	0.9870*	0.9741	3.1829
‘Vitória’						
Linear	L	8.5769*	0.8763*	0.9528*	0.9079	6.91
Linear	W	8.7203*	0.8398*	0.9482*	0.8991	7.28
Linear	L.W	1.1475 <sup>ns</sup>	0.9816 <sup>ns</sup>	0.9900*	0.9801	3.15
Power	L	4.6064 <sup>ns</sup>	0.9331 <sup>ns</sup>	0.9574*	0.9165	6.48
Power	W	6.5796*	0.8675*	0.9586*	0.9189	6.61
Power	L.W	-0.7710 <sup>ns</sup>	1.0126 <sup>ns</sup>	0.9901*	0.9805	3.20

<sup>(1)</sup> \* Linear coefficient different to zero by t-test at 5% probability. <sup>ns</sup> Not-significant; <sup>(2)</sup> \* Slope different to one by t-test at 5% probability. <sup>ns</sup> Not-significant; <sup>(3)</sup> \* Correlation coefficient different to zero by t-test at 5% probability. <sup>ns</sup> Not-significant

**Figure 1** - Confidence interval with 95% significance, for the parameters  $\beta_0$  (A) and  $\beta_1$  (B) in the linear model ( $\hat{Y}_i = \hat{\beta}_0 + \hat{\beta}_1 x_i$ ), and  $\beta_0$  (C) and  $\beta_1$  (D) in the power model ( $\hat{Y}_i = \hat{\beta}_0 x_i^{\hat{\beta}_1}$ ), of the observed leaf area for the product of length and width, based on 50 leaves from five clonal cultivars of *Coffea canephora* Pierre *ex* Froehner



The equations for the linear model adjusted for L.W, displayed linear coefficients and also slopes for the different clonal varieties that were very close. The same occurred with the equations for the power model (Table 2). The possibility was therefore studied of adjusting those linear and power models that would represent all five clonal varieties under study. In this way, the confidence interval was determined for the coefficients of the equations, as shown in Figure 1. It can be seen that the true values of the coefficients are contained in the intervals, demonstrating the similarity in behaviour of the clonal varieties. It was thus decided to adjust the linear and power models irrespective of cultivar (Table 4). Both models showed a good fit, with high coefficients of determination.

Figure 2 illustrates validation of the linear and power models. From the criteria adopted, it can be seen that the best fit was to the linear model, with a root mean square error (RMSE) slightly lower than the power model. Under the different conditions being studied, the

dispersion diagrams between the observed leaf area and that estimated by the linear and power models clearly show that a statistical model of simple linear structure can be used to estimate the leaf area in clonal varieties of *C. canephora*.

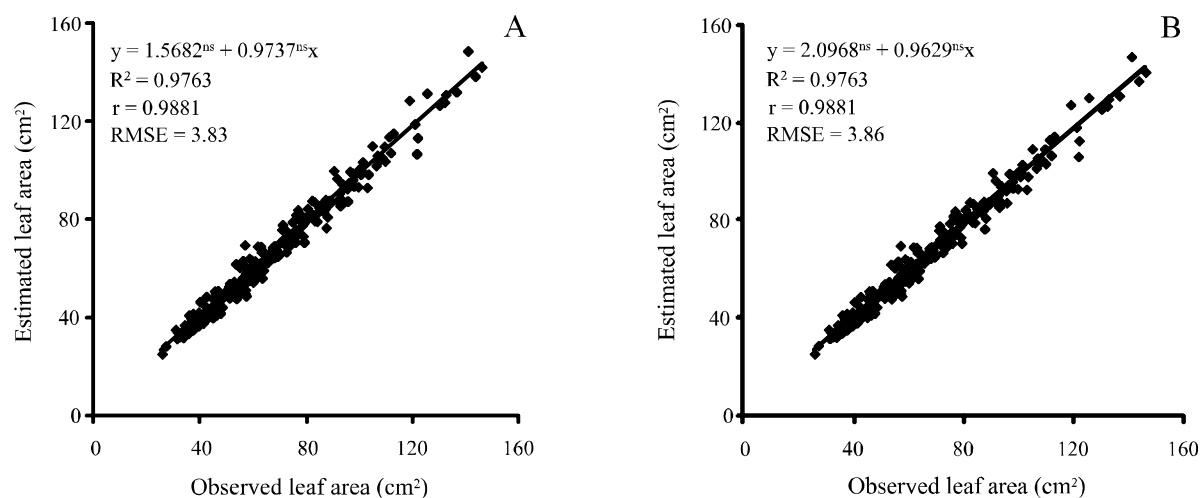
In this study, the regression equation that best represented an estimation of the leaf area for *C. canephora* was the linear model  $\hat{Y}_i = 0.6723 + 0.6779x_i$ , where  $x_i$  is the product of the longest length along the main rib and the greatest width of the leaf blade (L.W). Establishing this relationship involved destructive analysis of the leaves. It should be noted that the removal or destruction of the leaves is necessary only to determine allometric relationships. Once this mathematical expression has been established, the leaf area of clonal varieties of *C. canephora* in other studies can be estimated without detaching the leaves, using only a ruler or a pocket tape measure to get the longest length and greatest width of the leaf blade. Antunes *et al.* (2008), when studying the Conilon 513 and CC 3580

**Table 4** - Equations for determining leaf area ( $\hat{Y}_i$ ), using the product of the length and width (L.W) as the independent variable (x) and coefficient of determination ( $R^2$ ), based on 250 leaves from five clonal varieties of *Coffea canephora* Pierre *ex* Froehner

x	Equation	$R^2$
	Linear: $\hat{Y}_i = \beta_0 + \beta_1 x_i$ $H_0: \beta_1 = 0$ vs $H_a: \beta_1 \neq 0$	
L.W	$\hat{Y}_i = 0.6723 + 0.6779^{**} x_i$	0.9592
	Power: $\hat{Y}_i = \beta_0 x^{\beta_1}$ $H_0: \beta_1 = 0$ vs $H_a: \beta_1 \neq 0$	
L.W	$\hat{Y}_i = 0.7405 x_i^{0.9825^{**}}$	0.9559

\*\* Significant by t-test at 1% probability

**Figure 2** - Linear relationship between the estimated and observed (validation) values for leaf area in *Coffea canephora* Pierre *ex* Froehner, from 250 leaves from five clonal varieties. A = linear model; B = power model ( $H_0: \beta_0 = 0$  vs  $\beta_0 \neq 0$ ;  $H_0: \beta_1 = 1$  vs  $\beta_1 \neq 1$ ;  $R^2$  = coefficient of determination;  $r$  = Pearson correlation coefficient; RMSE = root mean square error)





varieties of *Coffea canephora*, found a power model to be the best fit. However, it should be remembered that adjustment of the equation had been made with the concurrent use of four leaves from cultivars of *Coffea arabica*.

## CONCLUSION

Determination of leaf area in the clonal varieties of *Coffea canephora*, Precoce, Intermediário, Tardio, Robustão capixaba and Vitória, is best represented by a simple linear model, with the equation  $\hat{Y}=0.6723+0.6779x$ , where x represents the product of the longest length and the greatest width of the leaf blade.

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