



## Article

CARVALHO, L.B.<sup>1\*</sup>

ALVES, E.A.<sup>2</sup>

BIANCO, S.<sup>1</sup>

## NON-DESTRUCTIVE MODEL TO PREDICT *Commelina diffusa* LEAF AREA

*Modelo Não Destrutivo para Estimar a Área Foliar de Commelina diffusa*

**ABSTRACT** - Leaf length (L), leaf width (W), and leaf area (LA) were measured from 100 leaves aiming to determine a simple linear equation ( $Y=a*X$ ) to predict the leaf area of *Commelina diffusa*, an important weed infesting annual and perennial crops in Brazil and worldwide. Results indicate the equation  $LA=0.7*LW$  reliably estimates the leaf area of *C. diffusa*, after correlating LA with LW, and then validating that equation by analyzing four new 25-leaf samples.

**Keywords:** plant growth, biometry, non-destructive method, mathematical model, climbing dayflower.

**RESUMO** - Comprimento da folha (C), largura da folha (L) e área foliar (AF) foram medidos em 100 folhas com o objetivo de determinar uma equação linear simples ( $Y=a*X$ ) para estimar a área foliar de *Commelina diffusa*, importante planta daninha que infesta culturas anuais e perenes no Brasil e no mundo. Os resultados indicam que a equação  $AF=0,7*CL$  estima confiavelmente a área foliar de *C. diffusa*, após correlacionar AF com CL e, em seguida, proceder à validação da equação analisando quatro novas amostras de 25 folhas.

**Palavras-chave:** crescimento de plantas, biometria, método não destrutivo, modelo matemático, trapoeraba.

## INTRODUCTION

Leaf area measurement is one of the most common parameters evaluated in a greenhouse and in field ecophysiological studies (Wang and Zhang, 2012). Accurate measurements of leaf area in field experiments may be time-consuming and generally requires the use of expensive equipment (e.g. portable leaf area meters) (Souza and Amaral, 2015; Souza et al., 2015). In addition, most of the techniques used to estimate leaf area require excising leaves from plants and scanning them in the lab, interfering in physiological and phenological responses because of canopy reduction (Chabot and Hicks, 1982). Thus, the excision of leaves can interfere in the results of other experiments that share the same group of plants (Souza and Amaral, 2015). Therefore, equations derived from non-destructive models, when available, represent a free and fast method that can be used *in situ*, providing leaf area estimates with no leaf excisions (Norman and Campbell, 1989).

The use of non-destructive models to estimate the leaf area has been used to understand the ecophysiology of many crops and weeds (Souza and Amaral, 2015; Tartaglia et al., 2016, and many others). Linear models based on length

\* Corresponding author:

<[lbcarvalho@fcav.unesp.br](mailto:lbcarvalho@fcav.unesp.br)>

Received: July 29, 2016

Approved: September 16, 2016

Planta Daninha 2017; v35:e017167226

<sup>1</sup> Universidade Estadual Paulista, Jaboticabal-SP, Brasil; <sup>2</sup> Universidade do Estado de Santa Catarina, Lages-SC, Brasil.

and width leaf measurements have been considered the most simple and efficient models to estimate the leaf area of some species (Demirsoy and Lang, 2010; Carvalho et al., 2011a; Giuffrida et al., 2011; Wang and Zhang, 2012; Souza and Amaral, 2015; Souza et al., 2015). In addition, for a better practical use, researchers can choose the simple linear model ( $Y=a*X$ ), considering the product of length and width as the variable “X” (Carvalho et al., 2011b, c).

The objective of this research was to determine a simple linear equation ( $Y=a*X$ ) to predict the leaf area of *Commelina diffusa*, an important weed infesting annual and perennial crops in Brazil and worldwide, as a function of leaf length and leaf width.

## MATERIAL AND METHODS

This research was carried out in two steps. First, a general linear equation to estimate the leaf area of *C. diffusa* was determined. Next, the equation was validated.

Determining the equation, 100 leaves with no injury caused by insects, fungi or weather conditions were randomly gathered from *C. diffusa* plants in the flowering stage. Leaves were collected in a variety of ecosystems (annual and perennial crops, non-agricultural fields and urban conditions) in Lages, SC, Brazil, in March 2015, while taking into account several ecological conditions where the species grows.

Leaf length through midrib (L), leaf maximum width perpendicular to midrib (W) and leaf area (LA) were measured by using a Portable Area Meter (Licor, Mod. L1-3000, USA), and then the product of L and W (hereafter designed as LW) was calculated.

Subsequently, a linear regression analysis ( $Y=a*X$ ), assuming Y as LA and X as LW was made. In addition, the Kolmogorov-Smirnov test was performed to verify the normality of regression residuals and the Spearman-Rank test was used to analyze the correlation between LW and LA (Carvalho et al., 2011a). Complementary, measured and estimated leaf area data were plotted in boxplot graphs and compared by a paired-t test. Moreover, the Spearman-Rank test was performed to analyze the correlation between measured and estimated leaf area and the Kolmogorov-Smirnov test was applied to check the normality of residuals from the correlation test (Carvalho et al., 2011a). For all tests, a probability of error was set at 1%.

Collinearity between L and W was tested by using the variance inflation factor (VIF) (Marquardt, 1970) and the tolerance value (T) (Gill, 1986). If VIF was larger than 10 or if T was smaller than 0.1, one of the variables (L or W) should be excluded from the model (Cristofori et al., 2007; Souza et al., 2015). We verified  $VIF < 10$  (2.406) and  $T > 0.1$  (0.416) from a 100 leaf sample, indicating L and W could be both included in the model to predict the leaf area of *C. diffusa*.

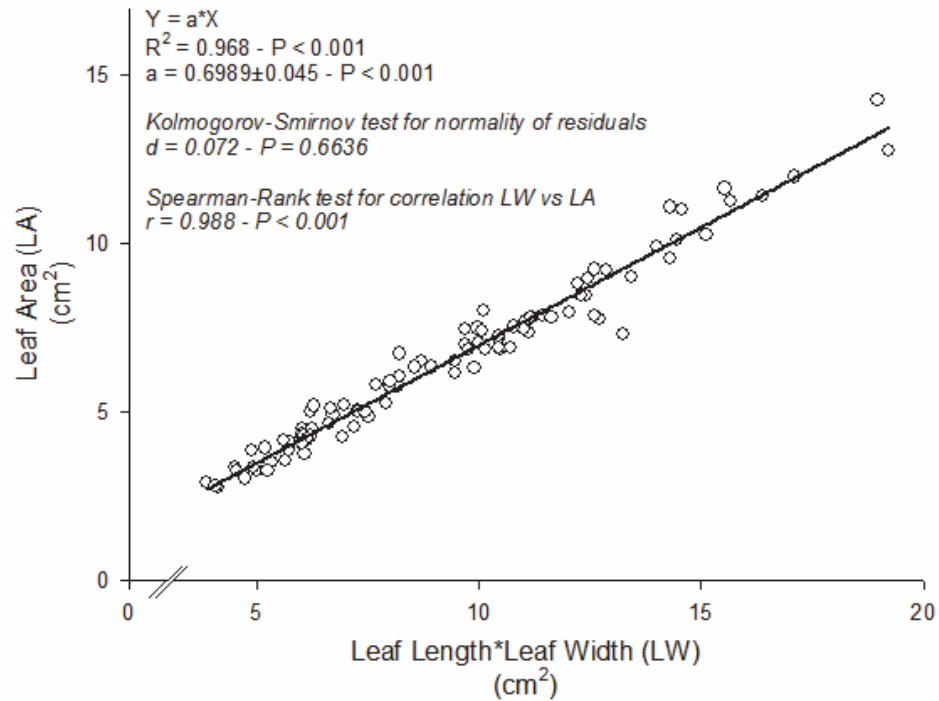
Validating the equation, four new samples of 25 leaves were gathered and characterized as described above. For each sample, the Spearman-Rank test was performed to analyze the correlation between measured and estimated leaf area and the Kolmogorov-Smirnov test was applied to verify the normality of residuals from the correlation test (Carvalho et al., 2011a). For all tests, the probability of error was set at 1%.

## RESULTS AND DISCUSSION

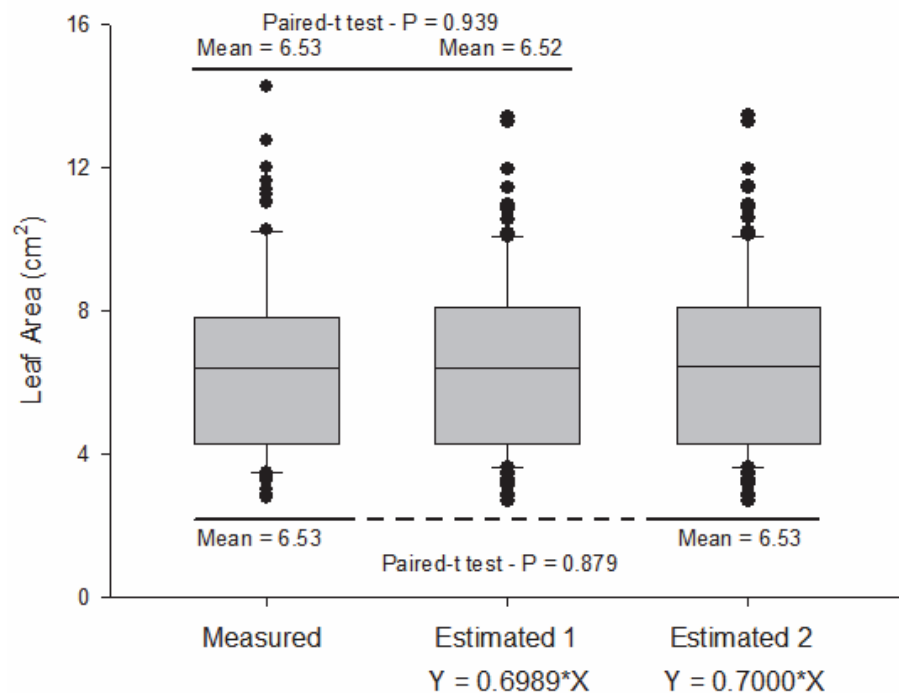
Leaf area of *C. diffusa* may be estimated as a function of LW. There was a high correlation between LW and LA ( $r=0.988$ ,  $P<0.001$ ), hence leaf area of *C. diffusa* could be calculated by a simple linear regression ( $Y=a*X$ ) (Figure 1). The same figure shows the equation parameter “a” (0.6989) and the normal distribution of residuals ( $d=0.072$ ,  $P=0.6636$ ). High correlation between LW and LA and a normal distribution of regression residuals, in addition to a high coefficient of determination, are required for an accurate model (Carvalho et al., 2011a; Souza and Amaral, 2015; Souza et al., 2015). Thus, the results indicate the equation  $LA=0.6989*LW$  ( $R^2=0.968$ ) significantly expressed the correlation between LW and LA.

For a better practical use, the approximated equation ( $Y=0.7000*X$ ) was tested to estimate leaf area. At first, there were no differences between the mean value of the measured leaf area (6.53 cm<sup>2</sup>) and the estimated leaf area (6.53 cm<sup>2</sup>) for equation  $Y=0.7000*X$ , as we observed for

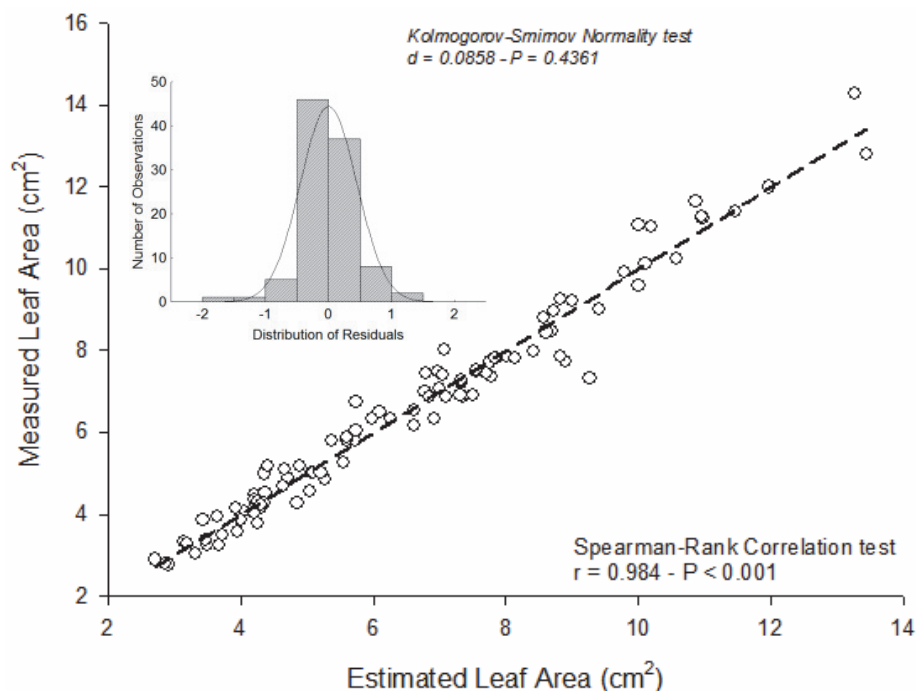
equation  $Y=0.6989*X$  (Figure 2). Next, there was a high correlation between measured and estimated leaf area by the equation  $Y=0.7000*X$  ( $r=0.984$ ,  $P<0.001$ ) and a normal distribution of residuals ( $d=0.0858$ ,  $P=0.4361$ ) (Figure 3). As discussed above, the results indicate the equation  $LA=0.7000*LW$  also significantly expressed the correlation between LW and LA, hence it could be used to predict the leaf area of *C. diffusa*.



**Figure 1** - Linear regression between leaf area and the product of leaf length and leaf width from a sample of 100 leaves of *Commelina diffusa*, and a summary of normality and correlation tests.



**Figure 2** - Boxplots of measured and estimated leaf area from a sample of 100 leaves of *Commelina diffusa*.



**Figure 3** - Linear correlation between measured leaf area and estimated leaf area (by the equation  $Y=0.7000*X$ ) from a sample of 100 leaves of *Commelina diffusa*, and a summary of normality and correlation tests.

Finally, the equation  $Y=0.7000*X$  was validated by testing the correlation between measured leaf area and estimated leaf area (Carvalho et al., 2011a; Souza and Amaral, 2015; Souza et al., 2015), from other four new samples of 25 leaves. The values of measured leaf area ranged from 6.18 cm<sup>2</sup> up to 6.67 cm<sup>2</sup> while estimated leaf area, from 6.24 cm<sup>2</sup> up to 6.79 cm<sup>2</sup> (Table 1). In all cases, there were no differences between measured and estimated leaf area. In addition, there was a high correlation between measured leaf area and estimated leaf area ( $0.978 \leq r \leq 0.991$ ,  $P < 0.001$ ) and a normal distribution of residuals ( $0.1038 \leq d \leq 0.1689$ ,  $0.4380 \leq P \leq 0.9383$ ) (Table 1). Thus, as discussed above, the results confirm that the equation  $LA=0.7000*LW$  significantly expresses the correlation between LW and LA; thus, it can be used to predict the leaf area of *C. diffusa*.

Non-destructive methods to predict leaf area are more interesting for use because there is no need to collect the plant, or parts of plants, for measurements (Bianco et al., 2011). The use of regression equations to predict plant leaf area is a simple, fast, accurate, and reliable method, allowing to monitor leaf growth and expansion from the same plant until the end of life cycle or experiment with no need to collect plant material (Gamiely et al., 1991). In addition, the simple linear regression should be preferred because it is easier and more practical to use for leaf area estimation (Duarte et al., 2009). Moreover, it can predict leaf area from the starting point

**Table 1** - Mean  $\pm$  standard error of measured leaf area and estimated leaf area from four samples of 25 leaves of *Commelina diffusa*, and a summary of the Spearman-Rank correlation test, the Kolmogorov-Smirnov normality test and collinearity analysis

Sample	Measured	Estimated <sup>(1)</sup>	Correlation test <sup>(2)</sup>		Normality test <sup>(3)</sup>	
	(cm <sup>2</sup> )	(cm <sup>2</sup> )	r	d	d	P
1	6.61 $\pm$ 0.41	6.45 $\pm$ 0.49	0.978	0.1038	0.1038	<0.001
2	6.18 $\pm$ 0.48	6.24 $\pm$ 0.48	0.988	0.1171	0.1171	<0.001
3	6.67 $\pm$ 0.58	6.65 $\pm$ 0.58	0.991	0.1051	0.1051	<0.001
4	6.65 $\pm$ 0.52	6.79 $\pm$ 0.52	0.979	0.1689	0.1689	<0.001

<sup>(1)</sup>  $Y=0.7000*X$ , where Y represents leaf area and X is the product of leaf length and leaf width. <sup>(2)</sup> Correlation test between measured and estimated leaf areas. <sup>(3)</sup> Normality test for regression residuals.

0,0 (X,Y), considering the y-intercept is equal to 0. It is important because, if y-intercept is not 0 (generally negative), one may consider a possibility of negative values for leaf area. Thus, the models predicting y-intercept different from 0 do not adequately represent the biological behavior of the plant.

In a nutshell, leaf area (LA) of *C. diffusa* can be calculated as a function of the product of leaf length and leaf width (LW). The equation  $LA=0.7*LW$  reliably estimates the leaf area of *C. diffusa* in a simple and efficient manner. Leaf length and leaf width can be easily measured with a ruler, hence model is an important tool for ecophysiological studies of *C. diffusa* under field or greenhouse conditions. In addition, the use of that equation would enable researches to make non-destructive and repeat measurements in the same leaf, with no use of expensive electronic equipment.

## ACKNOWLEDGMENTS

The authors are thankful to Conselho Nacional de Desenvolvimento Científico e Tecnológico (CNPq) for Research Productivity Scholarship of LBC (Proc. CNPq #304855/2015-4) and Marcelo Claro de Souza for his support with statistics.

## REFERENCES

- Bianco S. et al. Determination of alfalfa leaf area by non-destructive method. **Comm Plant Sci.** 2011;1:17-20.
- Carvalho L.B. et al. Determination of *Merremia cissoides* leaf area based on linear measures of the leaflets. **Acta Sci Agron.** 2011a;33:473-6.
- Carvalho L.B. et al. Estimativa da área foliar de plantas daninhas de ambiente aquático: *Pistia stratiotes*. **Planta Daninha.** 2011b;29:65-8.
- Carvalho L.B. et al. *Synedrellopsis grisebachii* foliar area estimate using a non-destructive method. **Planta Daninha.** 2011c;29:1023-7.
- Chabot B.F., Hicks D.J. The ecology of leaf life spans. **Ann Rev Ecol Syst.** 1982;13:229-59.
- Cristofori V. et al. A simple model for estimating leaf area of hazelnut from linear measurements. **Sci Hortic.** 2007;113:221-5.
- Demirsoy H., Lang G.A. Validation of a leaf area estimation model for sweet cherry. **Spanish J Agric Res.** 2010;8:830-2.
- Duarte D.J. et al. Estimativa da área foliar de *Euphorbia heterophylla*. **Planta Daninha.** 2009;27:527-31.
- Gamiely S. et al. A rapid and nondestructive method for estimating leaf area of onions. **HortScience.** 1991;26:206.
- Gill J.L. Outliers residuals and influence in multiple regression. **J Anim Breed Genet.** 1986;103:161-75.
- Giuffrida F. et al. A simple model for nondestructive leaf area estimation in bedding plants. **Photosynthetica.** 2011;49:380-8.
- Marquardt D.W. Generalized inverse ridge regression biased linear estimation and nonlinear estimation. **Technometrics.** 1970;12:591-612.
- Norman J.M., Campbell G.S. Canopy structure measurement by gap fraction analysis using commercial instrumentation. In: Pearcy R.W. et al., editors. **Canopy structure plant physiological ecology: field methods and instrumentation.** London: Chapman and Hall, 1989. p.301-25.
- Souza M.C., Amaral C.L. Non-destructive linearmodel for leaf area estimation in *Vernonia ferruginea* Less. **Braz J Biol.** 2015;75:152-6.
- Souza M.C. et al. Non-destructive model to estimate the leaf area of multiple Vochysiaceae species. **Braz J Bot.** 2015;38:903-9.
- Tartaglia F.L. et al. Non-destructive models for leaf area determination in canola. **Rev Bras Eng Agríc Amb.** 2016;20:551-6.
- Wang Z., Zhang L. Leaf shape alters the coefficients of leaf area estimation models for *Saussurea stoliczkai* in central Tibet. **Photosynthetica.** 2012;50:337-42.