

# Brazilian maize genotypes sensitivity to water deficit estimated through a simple crop yield model

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**Abstract** – The objective of this work was to determine the sensitivity of maize (*Zea mays*) genotypes to water deficit, using a simple agrometeorological crop yield model. Crop actual yield and agronomic data of 26 genotypes were obtained from the Maize National Assays carried out in ten locations, in four Brazilian states, from 1998 to 2006. Weather information for each experimental location and period were obtained from the closest weather station. Water deficit sensitivity index (Ky) was determined using the crop yield depletion model. Genotypes can be divided into two groups according to their resistance to water deficit. Normal resistance genotypes had Ky ranging from 0.4 to 0.5 in vegetative period, 1.4 to 1.5 in flowering, 0.3 to 0.6 in fruiting, and 0.1 to 0.3 in maturing period, whereas the higher resistance genotypes had lower values, respectively 0.2–0.4, 0.7–1.2, 0.2–0.4, and 0.1–0.2. The general Ky for the total growing season was 2.15 for sensitive genotypes and 1.56 for the resistant ones. Model performance was acceptable to evaluate crop actual yield, whose average errors estimated for each genotype ranged from -5.7% to +5.8%, and whose general mean absolute error was 960 kg ha<sup>-1</sup> (10%).

**Index Terms:** *Zea mays*, agrometeorology, drought resistance, water balance.

## Sensibilidade de genótipos brasileiros de milho ao deficit hídrico, estimada por um modelo simples de produtividade

**Resumo** – O objetivo deste trabalho foi determinar a sensibilidade de genótipos de milho (*Zea mays*) ao deficit hídrico, pelo uso de um modelo agrometeorológico simples de estimativa de produtividade. Dados de produtividade real e agronômicos de 26 genótipos foram obtidos dos Ensaios Nacionais de Milho, em dez localidades, em quatro estados brasileiros, entre 1998 e 2006. Os dados meteorológicos, para cada experimento e período, foram obtidos das estações mais próximas de cada local. O índice de sensibilidade ao deficit hídrico (Ky) dos genótipos foi determinado por meio do modelo de depleção da produtividade. Os genótipos de milho podem ser classificados em dois grupos de resistência ao deficit hídrico. Os de resistência normal tiveram Ky entre 0,4 e 0,5 no período vegetativo, 1,4 e 1,5 no florescimento, 0,3 e 0,6 na frutificação, e 0,1 e 0,3 no período de maturação, enquanto os genótipos de maior resistência tiveram, respectivamente, os seguintes valores de Ky: 0,2–0,4; 0,7–1,2; 0,2–0,4; e 0,1–0,2. Em todo o ciclo, o Ky geral foi 2,15 nos genótipos mais sensíveis, e 1,56 nos de maior resistência ao deficit hídrico. O desempenho do modelo foi aceitável para a avaliação da produtividade real, cujos erros médios estimados para cada genótipo variaram de -5,7 a +5,8%, e cujo erro absoluto médio geral foi de 960 kg ha<sup>-1</sup> (10%).

**Termos para Indexação:** *Zea mays*, agrometeorologia, resistência à seca, balanço hídrico.

## Introduction

Maize (*Zea mays* L.) is an essential crop for food security around the world (Campos et al., 2004), and becomes also very important for energetic purposes, considering that it is the main raw material for ethanol production in temperate countries of North America, Europe and Asia (Pimentel & Patzek, 2005), where automotive industry demand for maize ethanol rises every year. It is estimated that by the year 2020, the demand could increase beyond 125 billion liters of maize ethanol per year (Demirbas, 2007).

In Brazil, maize is the second most important grain crop, both in cultivated and production areas, just after soybean. According to Companhia Nacional de Abastecimento (2008), in the 2007/2008 growing season, the cultivated area was 14.8 million ha, and the total production was approximately 59 million tons. The country is the fourth world producer of maize, with an average yield of four tons per hectare. This yield is still very low, considering the crop potential, which can achieve 16 tons per hectare (Coelho et al., 2003).

Water deficit occurrences during the crop cycle are one of the most limiting factors for maize yield around the world (Kenny & Harrison, 1992; Bergamaschi et al., 2004; Ouda et al., 2008). In Brazil, Bergamaschi et al. (2007) consider the irregular distribution of rainfall during the crop cycle as the main factor to explain variability in maize yield, mainly in the state of Rio Grande do Sul, where El Niño Southern Oscillation has a great influence on rainfall patterns (Berlato et al., 2005). Bergonci et al. (2001) and Bergamaschi et al. (2004, 2006) reported an extreme sensitivity of maize plants to water deficit from flowering to the beginning of the grain-filling period, when plants had the highest water consumption, as a consequence of their maximum leaf area index, and the highest atmospheric evaporative demand. According to Bergamaschi et al. (2006), the highest maize yield reduction occurs when water deficit happens, during pollination, zygote formation and initial grain development. During these periods, the water deficit causes around 70% of the variations in grain yield.

Maize sensitivity to water stress over the whole growing season or at one of the different growth stages has been widely used in studies for the development of deficit irrigation strategies, and for determinations of the yield response factor, also known as water deficit sensitivity index ( $K_y$ ). This index is derived from the linear relationship between relative seasonal evapotranspiration deficits [ $1 - ET_a/ET_c$ ] and relative yield loss [ $1 - Y_a/Y_p$ ], and have been used as a parameter in maize yield models (Musik & Dusek, 1980; Doorenbos & Kassam, 1994; Dagdelen et al., 2006; Mengu et al., 2008).

The knowledge of  $K_y$  makes it possible to choose the best crops and genotypes for a specific location and season, according to water deficit conditions, reducing yield losses during the growing season. As maize is moderately drought-sensitive, and each of its developmental periods has a different sensitivity to water stress, the degree of yield loss will depend on the stage in which water deficit occurs, as well as on the genotype resistance. In Brazil, maize is cultivated in the spring-summer season, when weather is hot and humid, and in the fall-winter season (“safrinha”), when water deficits are more frequent. Therefore, the knowledge of  $K_y$  of maize genotypes can help growers and other decision makers to choose the best ones for their climatic conditions.

Besides, global climate change is expected to result in a long-term trend towards higher temperatures, greater evapotranspiration, and an increased incidence of droughts in specific regions. These factors coupled with an expansion of cropping in marginal production areas are generating increasingly drought-prone maize production environments, where drought-resistant genotypes should be used (Campos et al., 2004).

The objective of this study was to determine the sensitivity to water deficit in 26 Brazilian maize genotypes, by using a simple agrometeorological crop yield model.

## Materials and Methods

Maize actual yield ( $Y_a$ ) and agronomic data for 26 genotypes were obtained from the Ensaio Maize National Assays, conducted by Empresa Brasileira de Pesquisa Agropecuária (Embrapa), from 1998 to 2006, totaling 244 experiments sowed between October and December, and harvested between March and June, under rainfed conditions. The number of trials per genotype ranged from five to 17, and the genotypes used were those available in all trials and locations during the considered period. The main characteristics of each genotype used in this study are shown in Table 1. The assays were done in the following states: Paraná (Cascavel, Londrina and Ponta Grossa counties); São Paulo (Piracicaba county); Minas Gerais (Inhaúma, Lavras and Sete Lagoas counties); and Goiás (Santa Helena do Goiás and Senador Canedo counties), comprising latitudes between 16°40' and 25° South, and longitudes between 44°15' and 53°30' West.

Weather data for each location and period were obtained from the closest weather station, including data from Instituto Tecnológico Simepar, for locations in the state of Paraná; Escola Superior de Agricultura Luiz de Queiroz - Universidade de São Paulo, for Piracicaba, state of São Paulo; and from Agridtempo - Embrapa Informática Agropecuária, for locations in the states of Minas Gerais and Goiás.

Weather data considered were the following: average temperature ( $T_{avg}$ ); maximum temperature ( $T_{max}$ ); minimum temperature ( $T_{min}$ ); rainfall ( $R$ ); extraterrestrial solar radiation ( $SR_o$ ); daylight period or photoperiod ( $N$ ); and effective hours of sunshine ( $n$ ). As the effective hours of sunshine data were not available for all locations, they were

estimated for these locations using the combination of Angström-Prescott (Pereira et al., 2002) and Hargreaves equations (Allen et al., 1998):  $SR/SR_o = a + b(n/N)$  and  $SR/SR_o = 0.16(T_{max} - T_{min})^{0.5}$ , in which: SR is the global solar radiation; and a and b are, respectively, the intercept and the slope of the linear regression, defined by Glover & McCulloch (1958) as  $a = 0.29 \cos\theta$ , being  $\theta$  = latitude, and  $b = 0.52$ .

Such combination resulted in the following equation, which estimates n as a function of  $T_{max}$  and  $T_{min}$ :  $n = N \{ [0.16(T_{max} - T_{min})^{0.5} - 0.29 \cos\theta] / 0.52 \}$

Doorenbos & Kassam (1994) crop yield models to estimate potential ( $Y_p$ ) and actual ( $Y_a$ ) yields were used to determine the water deficit sensitivity index ( $K_y$ ) for the 26 maize genotypes, in each one of the four crop developmental periods, and for the entire crop cycle. Potential yield refers to the crop yield obtained by the interaction between the genotype and the uncontrolled weather variables, like solar radiation, photoperiod and temperature (De Wit, 1965). Actual yield refers to the yield obtained from crop influenced by the effect of the above mentioned weather variables, and also by water deficit during the growing season (Pereira et al., 2002). Actual yield equals to  $Y_p$  when

maize experiences no water deficit, and is smaller than  $Y_p$  when water deficit occurs.

The model used for estimating  $Y_p$  is known as agroecological zone model (Doorenbos & Kassam, 1994), and is based on the assumption that the crop is under optimal growing conditions, without water, nutrients or phytosanitary stresses. The model is given by:

$$Y_p = \sum_{i=1}^m GP_i \cdot C_{LAI} \cdot C_{RESP} \cdot C_H \cdot (1 - C_w)^{-1}$$

in which: GP is the gross photosynthesis, expressed in kilogram of dry matter per hectare per day;  $C_{LAI}$  is the depletion coefficient, related to leaf area index (LAI);  $C_{RESP}$  is the depletion coefficient associated to the maintenance respiration process, which is a function of the air temperature;  $C_H$  is the crop harvest index;  $C_w$  is the coefficient to consider the water content in the harvested part of the plant; i is the day in the crop cycle; and m is the number of days of the crop cycle, from sowing to harvesting. The final result of  $Y_p$  is given in  $kg\ ha^{-1}$ .

The GP is estimated by the sum of the gross photosynthesis, obtained in the fraction of the day with clear sky ( $GP_c$ ) and in the fraction overcast ( $GP_o$ ), as

**Table 1.** Agronomic characteristics of the 26 maize Brazilian genotypes<sup>(1)</sup>.

Genotype	Type	Cycle	Degree days	Sowing period	Use	Grain color	Grain texture	Resistance to lodging	Cob height (m)	Plant height (m)	Technological level
AG 1051	HD	SS	950	E/N/L/S	G/SW/SC	Y	D	H	1.60	2.60	M/H
AG 6018	HT	VS	830	E/N	G	Y/DY	H	H	1.10	2.20	H
AL Bandeirante	V	SS	900	N/S	G/SW	DY	SH	M	1.25	2.25	L/M
AS 3466 Top	HT	S	845	N/S	G	R	H	H	1.05	2.10	M/H
AS 1533	HSm	S	839	N/S	G	R	H	H	1.00	2.10	M/H
BALU 178	HT	S	860	E/N/S	G/SW	DY	H	H	SI	2.09	M
BALU 184	HD	S	860	E/N/S	G/SW	R	H	H	SI	2.00	M
BRS 3060	HT	SS	762	E/N/T/S	G/SW	DY	SD	M	1.30	2.40	M/H
CD 3121	HS	S	856	N/S	G/SW	Y	SD	H	1.28	2.19	M/H
CO 32	HT	S	848	E/N/L/S	G	O	SH	M	1.10	2.10	M/H
DKB 333 B	- <sup>(2)</sup>	-	-	-	-	-	-	-	-	-	-
DKB 350	HT	S	860	E/N/L/S	G	DY	SH	H	1.20	2.20	H
DKB 747	HD	S	845	N/L/S	G/SW	DY	H	H	1.20	2.20	M
Farroupilha 25	HT	S	860	N	G	SI	H	H	1.18	2.20	M
P 3041	HT	S	851	N/L/S	G/SW	DY	H	M	1.25–1.35	2.30–2.50	M/H
P 3081	-	-	-	-	-	-	-	-	-	-	-
P 30F33	HS	S	-	N/L/S	G	DY	H	M	1.25–1.35	2.40–2.60	M/H
PL 6880	HT	N	-	N/S	G/SW	Y	D	M	1.35	2.62	M
SHS 4050	HD	VS	830	E/N/S	G/SG	O	H	H	1.10	2.10	M/H
SHS 5050	HT	VS	810	E/N/S	G/SG	DY	SH	M	1.10	2.00	M/H
SHS 5060	HT	S	855	E/N/L/S	G/SW	Y	SD	H	1.30	2.30	M/H
SHS 5070	HT	VS	820	E/N/S	G/SG	O	H	M	1.10	2.10	M/H
SHS 4040	HD	S	850	E/N/L/S	G/SW	O	H	H	1.30	2.40	M/H
XB 7011	HT	S	866	E/N/S	G	O	H	MH	1.15	2.05–2.25	M/H
XB 7012	HT	S	884	E/N/S	G	O	H	MH	0.95	1.85–2.00	M/H
XB 8010	HD	S	835	E/N/L/S	G	O	H	MH	0.95	2.00–2.15	L/M/H

<sup>(1)</sup>Type: V, variety; HD, double hybrid; HT, triple hybrid; HS, simple hybrid; HSm, modified simple hybrid. Cycle: VS, very short; S, short; SS, semi short; N, normal. Sowing period: E, summer early; N, summer normal; L, summer late; S, fall-winter ("safrinha"). Use: G, grain; SW, silage of whole plant; SG, silage of humid grain; SC, sweet corn. Grain color: DY, dark yellow; O, orange; R, red; Y, yellow. Grain texture: H, hard; SH, semi-hard; D, dent; SD, semi-dent. Resistance to lodging: H, high; M, medium; MH, medium to high. Technological level: H, high; M, medium; L, low. <sup>(2)</sup>Without information.

follows:  $GP = GP_C + GP_O$ , with:  $GP_C = (107.2 + 0.36SRo) cTc (1 - n/N)$  and  $GP_O = (31.7 + 0.219SRo) cTo (n/N)$ , in which:  $cTc$  and  $cTo$  are coefficients associated to the efficiency of the photosynthetic process, regarding the type of crop and its metabolism to atmospheric  $CO_2$  fixation. Both coefficients are temperature-dependent and are calculated by the following quadratic equations for C4 plants (Barbieri & Tuon, 1992; Pereira et al. 2002):  $cTc = -4.16 + 0.4325T_{avg} - 0.00725T_{avg}^2$  and  $cTo = -1.064 + 0.173T_{avg} - 0.0029T_{avg}^2$ .

The other coefficients of the agroecological zone model were determined following Barbieri & Tuon (1992), Doorenbos & Kassam (1994) and Pereira et al. (2002). The leaf area index coefficient ( $C_{LAI}$ ) was estimated by a quadratic equation, as a function of the maximum LAI which varied among genotypes, ranging from 0.36 to 0.56 in the present study. The respiration coefficient ( $C_{RESP}$ ) was considered to be 0.5, when average temperature was  $>20^\circ C$  during the cycle, and 0.6 when  $\leq 20^\circ C$ . The harvest ( $C_H$ ) and water content ( $C_W$ ) coefficients for maize crop were 0.40 and 0.13, respectively.

The  $Y_p$  data estimated with the equation of the agroecological zone model, for each one of the 244 experiments, were used together with water balance data to estimate  $Y_a$ , using the linear crop-water production function of Doorenbos & Kassam (1994):

$$Y_a = Y_p \prod_{i=1}^m \left[ 1 - Ky_i \left( 1 - \frac{ETa_i}{ETc_i} \right) \right],$$

in which:  $Ky$  is the crop sensitivity index to water deficit, also known as yield response factor, which is crop-specific and vary over the growing season according to growth stage;  $ETa$  is the actual crop evapotranspiration; and  $ETc$  is the maximum crop evapotranspiration.  $ETc$  was calculated by the product between potential evapotranspiration (ETP), estimated by Thornthwaite (1948) method, and crop coefficient ( $Kc$ ). Actual crop evapotranspiration is an output of the crop water balance, calculated by the Thornthwaite & Mather (1955) model, using the spreadsheet elaborated by Rolim et al. (1998). The standard  $Kc$  (0.40 for establishment, 0.80 for vegetative growth, 1.10 for flowering, 0.90 for yield formation and 0.55 for ripening) and  $Ky$  (0.0 for establishment, 0.4 for vegetative growth, 1.5 for flowering, 0.5 for yield formation and 0.2 for ripening) values, used to calculate respectively  $ETc$  and  $Y_a$ , were applied to generate the first round

of  $Y_a$  values. After that, the calibration of the model was done through  $Ky$  manipulation to obtain the best fit between the observed and the estimated  $Y_a$ , for each one of the genotypes. The degree of resistance to water deficit was measured by the  $Ky$  values. Smaller  $Ky$  values represent a greater resistance and vice-versa.

The process of crop yield model calibration was used to determine the  $Ky$  values for the different growth periods of each genotype. The calibration of  $Ky$  values aimed to obtain the smallest mean absolute error (MAE) between the observed and the estimated  $Y_a$ , by an interactive process. This procedure was done in a programmed Microsoft Excel spreadsheet, in which other statistical indices were also calculated as: correlation coefficient ( $r$ ); agreement index ( $d$ ); and performance index ( $c$ ). The correlation coefficient ( $r$ ) is a measure of precision, whereas the agreement index ( $d$ ) is a measure of accuracy (Willmott et al., 1985). In the present study, both  $r$  and  $d$  indexes ranged from 0 to 1, where 0 means no correlation or agreement, and 1 means perfect correlation or agreement. The index  $d$  is calculated by the equation:  $d = 1 - [\sum(Pi - Oi)^2 / \sum(|Pi - O| + |Oi - O|)^2]$ , in which:  $Pi$  is the estimated  $Y_a$ ;  $Oi$  is the observed  $Y_a$ ; and  $O$  is the average of the observed  $Y_a$ . The index  $c$  also ranges from 0 to 1, and multiplies precision ( $r$ ) and accuracy ( $d$ ), as proposed by Camargo & Sentelhas (1997).

The mean bias error (MBE), which gives the direction of the predominant error, and the mean absolute error (MAE), which gives the magnitude of the error, were also determined between the observed and the estimated  $Y_a$ .

## Results and Discussion

The yield model calibration process resulted in different values of  $Ky$  for the studied genotypes (Table 2). The majority of the genotypes (18) was considered as of normally resistant to water deficit, since their  $Ky$  values did not differ substantially from those showed by Doorenbos & Kassam (1994). The normal-resistance genotypes had  $Ky$  ranging from 0.4 to 0.5 for the vegetative growth period, 1.4 to 1.5 for flowering, 0.3 to 0.6 for the yield formation period, and 0.1 to 0.3 for ripening, and the higher-resistance genotypes had lower values, respectively: 0.2–0.4, 0.7–1.2, 0.2–0.4, and 0.1–0.2. The greatest difference between the two groups was observed for the flowering

period, the most sensitive to water deficit (Bergonci et al., 2001; Bergamaschi et al., 2004, 2006, 2007).

The  $K_y$  values of the two genotype groups, for the entire growing season, are shown in Figure 1. The slope of the line represents the yield response factor ( $K_y$ ), as proposed by Doorenbos & Kassam (1994). For normal resistance genotypes, general  $K_y$  was 2.15, whereas for high resistance genotypes it was 1.56, both higher than the 1.25 value reported by Doorenbos & Kassam (1994) for the total growing period. These values were also higher than the ones determined by Dagdelen et al. (2006) and Mengü & Özgürel (2008), in Turkey, which ranged from 0.99 to 1.04. However, values obtained in the present study were close to those observed by Igbadun et al. (2006) in Tanzania (1.90), and by Payero et al. (2008) in Nebraska, USA (from 1.54 to 1.74). According to these authors, even maize being a moderate-resistant crop, it has a very high sensitivity to water stress during flowering period, which is reinforced by the results of our study

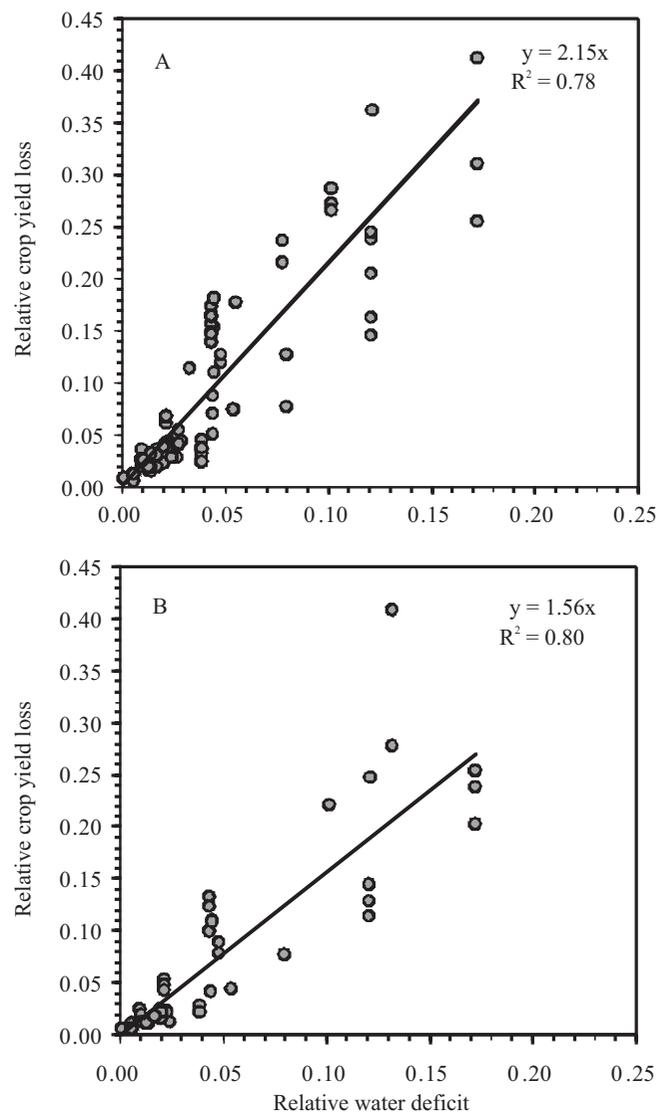
Genotypes with higher resistance to water stress, AG 1051, AG 6018, AS 3466 Top, CD 3121, Farroupilha 25, P 3081, P 30F33, and SHS 5050, are those that should be recommended for regions or seasons in which there is a higher risk of water deficit

**Table 2.** Water deficit sensitivity index ( $K_y$ ) for the different developmental stages of 26 maize Brazilian genotypes.

Genotype	Vegetative growth	Flowering	Yield formation	Ripening
Normal resistance				
AL Bandeirante	0.5	1.5	0.6	0.3
AS 1533	0.4	1.4	0.3	0.1
BALU 184	0.3	1.4	0.5	0.2
BALU 178	0.4	1.5	0.5	0.2
BRS 3060	0.4	1.3	0.5	0.2
CO 32	0.4	1.5	0.5	0.2
DKB 333B	0.4	1.5	0.5	0.2
DKB 350	0.4	1.4	0.3	0.2
DKB 747	0.5	1.4	0.4	0.2
P 3041	0.4	1.5	0.5	0.2
PL 6880	0.4	1.5	0.3	0.2
SHS 4050	0.4	1.5	0.5	0.2
SHS 5060	0.4	1.5	0.5	0.2
SHS 5070	0.4	1.5	0.5	0.2
SHS 4040	0.4	1.5	0.5	0.2
XB 7011	0.4	1.5	0.5	0.2
XB 7012	0.4	1.5	0.5	0.2
XB 8010	0.4	1.5	0.5	0.2
High resistance				
AG 1051	0.3	1.2	0.4	0.2
AG 6018	0.3	1.1	0.3	0.1
AS 3466 Top	0.2	0.9	0.3	0.1
CD 3121	0.3	0.9	0.3	0.1
Farroupilha 25	0.3	1.2	0.3	0.2
P 3081	0.2	0.7	0.2	0.1
P 30F33	0.4	1.0	0.2	0.1
SHS 5050	0.3	0.9	0.3	0.1

during the growing season, like during the fall-winter season (“safrinha”) in Southern Brazil. Nevertheless, the genotypes which had normal resistance to water stress, like DKB 333B, should be recommended for regions with lower risk of water deficits, under rainfed conditions, or for drier regions or seasons with irrigation, mainly during the flowering period. Such recommendations are very important for growers and other decision makers, but normally they are not available, since seed companies do not provide  $K_y$  values.

The average potential and actual yield estimates, obtained with the calibrated crop yield model for



**Figure 1.** Relationship between relative crop yield loss ( $1-Y_a/Y_p$ ) and relative water deficit ( $1-ET_a/ET_c$ ), for determining the general  $K_y$  value for normal (A) and high (B) resistance to water deficit maize genotypes.

each one of the 26 genotypes, are shown in Table 3. The potential yields for the assessed locations and periods ranged from 7,951 kg ha<sup>-1</sup> for SHS 4050 to 11,156 kg ha<sup>-1</sup> for AG 1051, but with higher values for individual trials, in which potential yield achieved more than 12,500 kg ha<sup>-1</sup>, as observed in Londrina and Senador Canedo for AG 1051 in 2001/2002, and in Cascavel for DKB 747 in 2002/2003. The estimated actual yields were very similar to observed data, with underestimations in 16, and overestimations in 10 genotypes, with the MBE ranging from -5.7 to +5.8%. The MAE between observed and estimated Ya ranged from 298 to 1,477 kg ha<sup>-1</sup>, which represents, in percentage, errors between 3.9 and 15%, considered acceptable for yield modeling. These errors were similar to those found by Soler et al. (2007), who used the DSSAT CERES-MAIZE model to estimate actual yields of rainfed and irrigated maize genotypes, in the state of São Paulo, Brazil (-10.7 to 11.3%).

It is important to emphasize that the models used in this study accounted only for the effect of weather variables, like solar radiation, photoperiod, temperature and rainfall. Therefore, other factors as the occurrence of pests, diseases, and nutritional deficiency, in the 244 field trials, were not

considered, which could explain part of the errors observed.

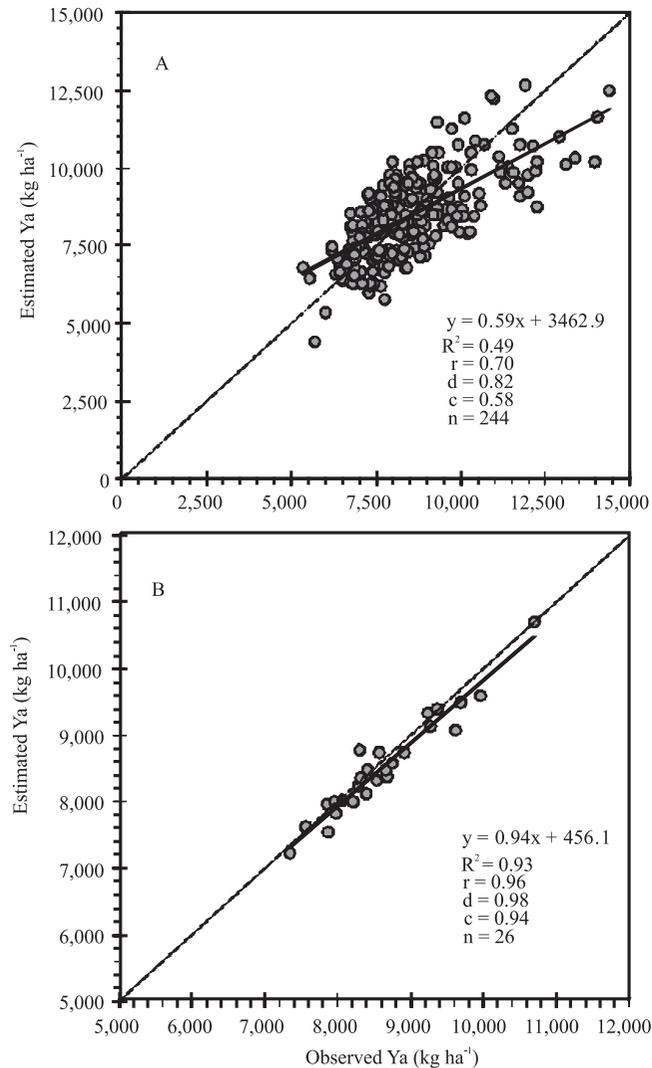
The model statistics to estimate Ya for each genotype, in terms of their precision (r), accuracy (d) and performance (c) are shown in Table 3. For some genotypes, like BALU 184, SHS 4040 and P 30F33, the model provided good results, with c index above 0.7. Nevertheless, for the genotypes BRS 3060, DKB 350, SHS 4050, SHS 5050, SHS 5060, and SHS 5070, the performance of the model was poor, with c index below 0.3. When all the 244 field trials were considered together to evaluate the performance of the model (Figure 2 A), a general c index of 0.58 was found, which is considered acceptable for modeling purposes (Camargo & Sentelhas, 1997). For this analysis, the MAE was 960 kg ha<sup>-1</sup>.

Figure 2 B shows the relationship between the observed and the estimated Ya, considering the average Ya for each genotype. Under this approach, the performance of the model was improved, showing that, in general, it has potential to be used as a tool for yield estimation and forecasts. The same conclusion was found by Rolim et al (2001), when comparing the model used in this study with DSSAT model to estimate sunflower actual yield in the states of São Paulo and Paraná.

**Table 3.** Statistics of the comparison between the observed and the estimated maize yield for the evaluated 26 Brazilian genotypes<sup>(1)</sup>.

Genotype	Yp (estimated)	Ya (estimated)	Ya (observed)	MBE (%)	MAE (kg ha <sup>-1</sup> )	r	d	c	n
AG 1051	11,156	10,701	10,694	0.1	1,235	0.76	0.84	0.63	7
AG 6018	10,440	9,581	9,953	-3.7	1,022	0.74	0.86	0.64	9
AL Bandeirante	8,483	7,957	7,850	1.4	1,048	0.66	0.75	0.50	7
AS 1533	9,294	8,378	8,673	-3.4	931	0.65	0.77	0.50	9
AS 3466 Top	8,717	8,003	8,204	-2.4	696	0.76	0.66	0.50	5
BALU 178	8,622	7,991	7,962	0.4	921	0.63	0.77	0.49	9
BALU 184	9,110	8,479	8,651	-2.0	855	0.81	0.88	0.71	10
BRS 3060	8,990	8,234	8,272	-0.5	1,252	0.43	0.66	0.28	12
CD 3121	9,038	8,323	8,541	-2.5	922	0.64	0.78	0.50	14
CO 32	9,465	8,729	8,573	1.8	829	0.65	0.79	0.51	12
DKB 333B	9,682	9,069	9,617	-5.7	1,389	0.65	0.65	0.42	5
DKB 350	9,898	9,483	9,693	-2.2	1,447	0.47	0.60	0.28	5
DKB 747	10,094	9,326	9,232	1.0	1,242	0.73	0.84	0.61	9
Farrroupilha 25	9,692	9,132	9,280	-1.6	1,329	0.64	0.77	0.49	8
P 3041	10,295	9,395	9,364	0.3	523	0.70	0.84	0.59	8
P 3081	8,797	7,815	7,969	-1.9	592	0.67	0.79	0.53	6
P 30F33	9,396	8,731	8,904	-1.9	971	0.91	0.88	0.80	9
PL 6880	8,286	7,544	7,871	-4.2	944	0.58	0.61	0.35	11
SHS 4040	8,228	7,621	7,567	0.7	298	0.83	0.89	0.74	6
SHS 4050	7,951	7,224	7,344	-1.6	679	0.37	0.60	0.22	9
SHS 5050	8,783	8,118	8,380	-3.1	689	0.27	0.55	0.15	10
SHS 5060	9,689	8,781	8,296	5.8	1,297	0.13	0.41	0.05	10
SHS 5070	8,851	8,012	8,068	-0.7	1,086	0.33	0.56	0.18	11
XB 7011	9,092	8,478	8,402	0.9	1,105	0.59	0.76	0.45	12
XB 7012	9,180	8,577	8,743	-1.9	974	0.76	0.84	0.63	17
XB 8010	8,823	8,349	8,319	0.4	720	0.70	0.83	0.59	14

<sup>(1)</sup>Yp, potential yield; Ya, actual yield; MBE, mean bias error; MAE, mean absolute error; r, correlation coefficient; d, agreement index; c, performance index; n, number of experiments considered from 1998 to 2006.



**Figure 2.** Relationship between the observed and the estimated actual maize yield ( $Y_a$ ) for the 26 Brazilian genotypes, considering the 244 experiments (A) and an average yield by genotypes (B).

### Conclusions

1. The evaluated maize genotypes can be divided into two groups according to their sensitivity to water deficit, one with normal resistance to water stress and another with higher resistance.

2. The sensitivity of maize genotypes to water deficit is higher during flowering, followed by vegetative growth and yield formation periods. During ripening, genotypes are less sensitive to water stress.

3. The calibrated yield models used result in acceptable estimates of crop actual yield, and have potential to be used as yield forecaster, for crop zoning, and for best sowing dates determination.

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