# GGE BIPLOT ANALYSIS TO RECOMMEND COWPEA CULTIVARS FOR GREEN GRAIN PRODUCTION<sup>1</sup>

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**ABSTRACT** – Genotypes can respond differently to environments; thus, studies on adaptability and production stability are important to assist breeders in the identification and recommendation of cultivars. The objective of this work was to determine the adaptability and production stability of cowpea genotypes focused on subsidize recommendations of cultivars for green grain production in the state of Ceará, Brazil. Five assays were conducted in different locations in two climatic regions of the state of Ceará: a tropical mild hot semiarid region encompassing the municipalities of Acaraú, Pentecoste, and Crato, and a tropical hot semiarid region encompassing the municipalities of Mauriti and Madalena. Twenty cowpea genotypes—12 elite lines and 8 cultivars—were evaluated for cultivation value and use, using a randomized block design, with four replications. The results were subjected to analyses of variance and adaptability and green grain yield stability analyses by GGE biplot multivariate analysis. The effects of genotypes, environments, and G×E were significant, denoting different responses of genotypes in different locations. The results of the adaptability and stability analyses by the GGE biplot method showed that the two principal components explained 72.17% of the total variation, allowing reliable bidimensional projections. The municipality of Crato was the ideal location for tests and the lines MNC05-847B-123 and MNC00-595F-27 showed good production, adaptation, and stability, and can be recommended for green grain production in the state of Ceará, Brazil.

Keywords: Vigna unguiculata. Genotype × environment interaction. Grain yield. Cultivation value and use.

## PROJEÇÃO GGE BIPLOT NA RECOMENDAÇÃO DE CULTIVARES DE FEIJÃO-CAUPI PARA PRODUÇÃO DE GRÃOS VERDES

RESUMO - Genótipos podem responder aos ambientes de forma diferente; por isso, o estudo de adaptabilidade e estabilidade produtiva é importante para auxiliar melhorista na identificação e recomendação de cultivares. Assim, o objetivo deste trabalho foi inferir acerca da adaptabilidade e estabilidade produtiva de genótipos de feijão-caupi visando subsidiar a recomendação de cultivares para a produção de grãos verdes no estado do Ceará. Para isto, foram conduzidos cinco ensaios de valor de cultivo e uso (VCU) em localidades distintas pertencentes à duas regiões climáticas do estado do Ceará: Tropical quente semiárido brando (Acaraú, Pentecoste e Crato) e Tropical quente semiárido (Mauriti e Madalena). Foram avaliados 20 genótipos de feijãocaupi, sendo 12 linhagens elite e oito cultivares, em delineamento de blocos casualizados, com quatro repetições. Foram realizadas análises de variância e em seguida análises de adaptabilidade e estabilidade da produtividade de grãos verdes por meio da técnica multivariada GGE biplot. Os efeitos de genótipos, ambientes e interação G×E foram significativos, evidenciando respostas diferenciadas dos genótipos nas diferentes localidades. No aprofundamento das análises de adaptabilidade e estabilidade, os resultados do método GGE biplot revelaram que os dois primeiros componentes principais explicaram 72,17% da variação total, permitindo projeções bidimensionais fidedignas. A cidade de Crato foi indicada como local ideal para teste e as linhagens MNC05-847B-123 e MNC00-595F-27 se mostraram produtivas, adaptadas e estáveis, devendo serem recomendadas para produção de grãos verdes no estado do Ceará.

**Palavra-chaves**: *Vigna unguiculata*. Interação genótipos x ambientes. Produtividade de grãos. Ensaios de valor de cultivo e uso (VCUs).

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### **INTRODUCTION**

Cowpea (*Vigna unguiculata* (L.) Walp.) green grains (immature grains) are very appreciated by people of the Northeast region of Brazil, and is part of several local typical dishes. Thus, the cowpea green grain market is traditional in the Northeast region, and is growing in other capitals of North, Southeast, and Center-West regions of Brazil (SOUSA et al., 2015). The state of Ceará is probably the greatest producer and consumer of green grains in the Northeast region; the cowpea marketed volume in 2016 reached 2.887.7 Mg (CEASA, 2018), denoting a great demand of this product in the state.

The green-grain cowpea (pods and immature grains) is an attractive market due to its great volume, but little information is found regarding its production by family farmers (predominant) or agribusiness entrepreneurships (FREIRE FILHO et al., 2017). However, the Brazilian market is poor in improved cultivars for green grain production (ROCHA et al., 2012). Despite many genetic materials used for dry grain production are used for green grain production, there are a recent demand of supermarket and restaurant chains for green-grain cowpea that presents longer shelf-life and preserve its visual characteristics after cooking, which usually is not found when using conventional cultivars for dry grain production (ROCHA, 2009).

The commercial success of a cultivar is related to its agronomical performance in a broad crop region (SOUSA et al., 2018). Thus, cowpea breeding programs annually test several genotypes in different environments before recommend them (SANTOS et al., 2014). However, these evaluations of genotypes in different environments usually face an additional component that affects phenotypic values, which is the genotype-environment interaction (G×E) (CRUZ; CARNEIRO; REGAZZI, 2014).

The  $G \times E$  occurs when the relative performance of genotypes is not consistent from one environment to the other, and such inconsistency is caused by different responses of a same set of genes to environmental changes, or expression of different set of genes in different environments (MUTHONI; SHIMELIS; MELIS, 2015). The G×E cannot be avoided (ADEWALE et al., 2010) and its occurrence hinders the selection of genotypes (CARVALHO et al., 2016). One of the alternatives recommended to attenuate the effect of this interaction is the use of cultivars with broad adaptability and good stability (CRUZ; CARNEIRO; REGAZZI, 2014).

The stability analysis is an important tool for plant breeders to identify and recommend genotypes widely or specifically adapted for target environments (MUTHONI; SHIMELIS; MELIS, 2015). A genotype is adapted and stable when advantageously use the environmental effects and when its development is predictable in an environment (ROCHA et al., 2012).

Several methodologies are used to evaluate the G×E and determine the adaptability and production stability of genotypes. One of the most used method in genetic studies is the GGE biplot. This model explores efficiently the G×E, with high accuracy in the identification of mega-environments and in the selection of stable and adapted genotypes to specific environments (SILVA; BENIN, 2012).

In this context, the objective of this work was to determine the adaptability and production stability of cowpea genotypes focused on subsidize recommendations of cultivars for green grain production in the state of Ceará, Brazil.

### MATERIAL AND METHODS

Five cultivation value and use assays were conducted in different locations in two climatic regions of the state of Ceará, Brazil (Table 1, Figure 1) from 2015 to 2017. Twenty cowpea genotypes— 12 elite lines and 8 cultivars— were evaluated. These genotypes were from the Active Germplasm Bank of the Cowpea Breeding Program of the Embrapa Mid-North, in partnership with the Federal University of Ceará (Table 2). The cultivars Vagem Roxa-THE, Azulão-MS, and Sempre Verde-CE, usually grown for green-grain cowpea production were used as controls (SOUSA et al., 2015).

**Table 1**. Location of the areas in the state of Ceará, Brazil, where the experiments were conducted, and their respective sowing times, geographic coordinates, rainfall depths, and mean annual temperatures.

Location	Sowing times	Altitude	Latitude	Longitude	Rainfall depths <sup>*</sup>	Temperatures	
Acaraú	23/03/2015	16.5 m	02°53'S	40°08'W	308.1 mm	27.7 °C	
Pentecoste	12/04/2016	45 m	03°49'S	39°20'W	98.2 mm	26.4 °C	
Crato	24/08/2016	427 m	07°14'S	39°22'W	12.8 mm	21.1 °C	
Mauriti	01/02/2017	453 m	07°23'S	38°41'W	172.0 mm	25.2 °C	
Madalena	25/02/2017	353 m	04°47'S	39°39'W	168.8 mm	25.9 °C	

<sup>\*</sup>Rainfall depths shown as means of three months during the conduction of the experiments.

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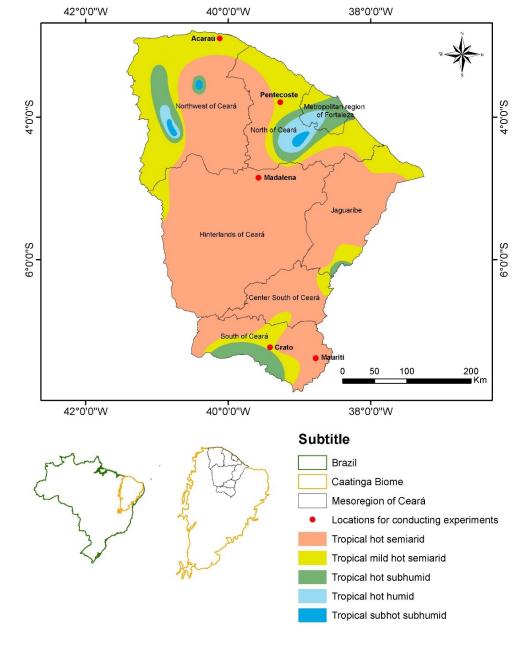


Figure 1. Climate classification and geographical distribution of the locations of evaluation of 20 cowpea genotypes in the state of Ceará, Brazil.

The genotypes were evaluated for grain yield (kg ha<sup>-1</sup>) in rainfed conditions, except in the municipality of Crato, where the crop was daily irrigated using a conventional stationary sprinkle system for 30 minutes. The sowing time varied from February to April, according to the rainy season, except in Crato, where it was done in August, outside the period of higher rainfall depths (Table 1). Therefore, plants in this environment required irrigation.

The assays were conducted in a randomized block experimental design with four replications. The experimental plots of all assays were similar, as required by the Brazilian Ministry of Agriculture, Livestock, and Supply (MAPA), with dimensions of  $3.2 \times 5.0$  m, consisted of four 5-meter rows, using the two central rows for the evaluations. The spacing was 0.80 m between rows and 0.25 m between plants (20 plants per row). Four seeds were sowed per pit and a thinning was done at 15 days after the sowing, leaving one plant per pit.

Code	Genotypes	Parental/Precedence	Commercial Subclass Green		
1	MNC00-586F-303-9 <sup>(1)</sup>	Capela x IT85F-2687			
2	MNC00-595F-2 <sup>(1)</sup>	BRS-Bragança x GV-10-91-1-1	Green		
3	MNC00-595F-27 <sup>(1)</sup>	BRS-Bragança x GV-10-91-1-1	Green		
4	MNC05-835B-15 <sup>(1)</sup>	MNC00-599F-2 x MNC99-537F-14-2	Green		
5	MNC05-835B-16 <sup>(1)</sup>	MNC00-599F-2 x MNC99-537F-14-2	Green		
6	MNC05-841B-49 <sup>(1)</sup>	MNC00-599F-9 x MNC99-537F-14-2	Green		
7	MNC05-847B-123 <sup>(1)</sup>	MNC00-599F-11 x MNC99-537-14-2	Green		
8	MNC05-847B-126 <sup>(1)</sup>	MNC00-599F-11 x MNC99-537-14-2	Green		
9	MNC99-541F-15 <sup>(1)</sup>	TE93-210-13F x TE96-282-22G	White		
10	BRS Guariba <sup>(2)</sup>	IT85F-2687 x TE87-98-8G	White		
11	BRS Tumucumaque <sup>(2)</sup>	TE96-282-22G x IT87D-611-3	White		
12	BRS Xiquexique <sup>(2)</sup>	TE87-108-6G x TE87-98-8G	White		
13	Paulistinha <sup>(2)</sup>	Juazeiro-CE	Canapu		
14	Vagem Roxa-THE <sup>(2)*</sup>	Teresina-PI	White		
15	Azulão-MS <sup>(2)*</sup>	Dourados-MS	Azulão		
16	Sempre Verde-CE <sup>(2)*</sup>	Fortaleza-CE	Sempre-verde		
17	BRS Aracê <sup>(2)</sup>	MNC00-599F-11 x MNC99-537F-14-2	Green		
18	Pingo-de-Ouro-1-2 <sup>(1)</sup>	Iguatu-CE	Canapu		
19	MNC02-701F-2 <sup>(1)</sup>	TE93-210-13F x (TE96-282-22G x Costelão)	White		
20	MNC99-510F-16-1 <sup>(1)</sup>	Paulista x TE90-180-88F	Sempre-verde		

Table 2. Cowpea genotypes and their respective parental and/or precedence and commercial subclasses.

<sup>(1)</sup>Lines; <sup>(2)</sup>Cultivars; \*Control.

Soil preparation were done as needed for each area, using conventional practices of plowing and harrowing. Soil fertilization was done at planting, using potassium chloride and simple superphosphate; topdressing consisted of a nitrogen (urea) application at 15 days after sowing. The fertilizers were applied according to recommendations for the soil of the experimental area of each environment based on soil chemical analysis. Weed and pest control was done as needed, using manual weeding and insecticide applications, respectively. The pods were manually harvested when they were at the maturation stage for marketing as green grains, i.e., when the grains presented 60% to 70% moisture, considering the individual maturation pattern of each genotype (SOUSA et al., 2015).

Individual analyses of variance were done for each environment to assess the homogeneity of residual variances, considering the following model:

$$\overline{Y}_{ij} = \mu + G_i + B_j + e_{ij}, \qquad (1)$$

where  $Y_{ij}$  is the phenotypic mean of the i-th genotype in the j-th block;  $\mu$  is the general mean;  $G_i$  is the effect of the i-th genotype;  $B_j$  is the effect of the j-th block;  $e_{ij}$  is the effect of the error associated to the i-th genotype in the j-th block.

Then, joint analysis of variance was done, considering the effects of genotypes and environments to determine possible genotypeenvironment interactions. The selective accuracy (RESENDE; DUARTE, 2007) was estimated as  $SA = (1-1/F)^{1/2}$ , where F is the F test value for the genotype.

The GGE biplot multivariate analysis was based on phenotypic means, considering the following model:

$$\overline{Y}_{ij} - \mu = G_i + E_j + GE_{ij}, \qquad (2)$$

where  $\overline{Y}_{ij}$  is the phenotypic mean of the genotype *i* in the environment *j*;  $\mu$  is the general mean;  $G_i$  is the effect of genotype *i*;  $E_j$  is the effect of environment *j*; and  $GE_{ij}$  is the effect of the interaction between genotype *i* and environment *j*.

The GGE biplot model does not separate genotypic effects (G) from effects of the genotypeenvironment interaction (G×E), keeping together in two multiplicative terms, represented by the following equation:

$$Y_{ij} - \mu - \beta_j = g_{li} e_{lj} + g_{i2} e_{2j} + \varepsilon_{ij}, \qquad (3)$$

where  $Y_{ij}$  is the expected yield of the genotype *i* in the environment *j*;  $\mu$  is the general mean of the observations;  $\beta_j$  is the main effect of the environment *j*;  $g_{li}$  and  $e_{lj}$  are the main scores of the i-th genotype in the j-th environment, respectively;  $g_{i2}$  and  $e_{2j}$  are secondary scores for the genotype *i* and environment *j*, respectively; and  $\varepsilon_{ij}$  is the residue that was not explained by both effects (noise).

Thus, the construction of the GGE biplot model is done by simple dispersion of  $g_{li}$  and  $g_{i2}$  for genotypes, and  $e_{lj}$  and  $e_{2j}$  for environments, by singular value decomposition (SVD), according to the equation:

$$Y_{ij} - \mu - \beta_j = \lambda_l \xi_{il} \eta_{lj} + \lambda_2 \xi_{i2} \eta_{2j} + \varepsilon_{ij}, \qquad (4)$$

where  $\lambda_1$  and  $\lambda_2$  are the higher eigenvalues of first and second principal components, (*PCE*<sub>1</sub> and *PCE*<sub>2</sub>, respectively);  $\xi_{i1}$  and  $\xi_{i2}$  are the eigenvalues of the i-th genotype for *PCE*<sub>1</sub> and *PCE*<sub>2</sub>, respectively; and  $\eta_{1j}$  and  $\eta_{2j}$  are the eigenvalues of the j-th environment for *PCE*<sub>1</sub> and *PCE*<sub>2</sub>, respectively.

The information relation (IR) proposed by Yan and Tinker (2006) is estimated to evaluate the fit of a biplot and show the patterns of a double entry table. The IR can be calculated for each principal component using the proportion of the total variance explained by each principal component multiplied by *k* (*k* PC). When there is no correlation between environments, all *k* PC should be completely independent, and the proportion of total variance explained by each PC should be precisely 1/k. When there is correlation between environments, the proportion of variation explained by the first PC should be higher than 1/k, and the variation explained by the other PC should be lower than or equal to 1/k. A PC with IR>1 contains patterns (associations between environments); a PC with IR=1 does not include patterns, but can contain some independent information; and a PC with IR<1 does not contain patterns or information (YAN, 2011).

All analyses were done using the R program, with the aid of the GGE biplot GUI package (R CORE TEAM, 2016).

### **RESULTS AND DISCUSSION**

The joint analyses of variance showed significant differences (p<0.01) for the effects of the genotypes, environments, and G×E (Table 3), denoting differences in the green grain yield responses of the genotypes; sufficient differences between locations to discriminate the genotypes; and different responses of genotypes in the different locations. Therefore, the genotypes presented no similar development to all environments due to the ecogeographical differences between the environments tested (Table 1), resulted from their different altitude, location, and climate (rainfall and temperature).

Barros et al. (2016) and Santos et al. (2017a) found similar results for grain yield of cowpea genotypes in multi-environmental assays in the state of Mato Grosso of Sul, Brazil, showing that edaphoclimatic factors had high effect on genotype adaptability and stability and additional analyses are needed to identify genotypes that are adapted to large number of locations.

**Table 3**. Joint analysis of variance for green grain yield (kg  $ha^{-1}$ ) of 20 cowpea genotypes evaluated in cultivation value and use assays in five locations in the state of the state of Ceará, Brazil.

Source of variation	Degrees of freedom	Mean Squares			
Block	3	368,832.1			
Genotypes (G)	19	828,533.9**			
Environments (E)	4	9,905,440.7**			
G×E	76	248,812.9**			
Residue	297	158,262.3			
Selective Accuracy (SA)	-	0.73			
Mean	-	926.45			

\*\*Significant at p<0.01 by the F test.

The results indicated the need for further evaluations of the main effects and G×E, which cannot be obtained by standard analysis of variance, despite it had shown high selective accuracy according to Resende and Duarte (2007). Selective accuracy is a parameter that shows the quality of the information (experimental precision) and procedures used to predict genetic values (PIMENTEL et al., 2014).

The additive effect of genotypes and the multiplicative effect of the interaction are grouped in

the GGE analysis and subjected concomitantly to analysis of principal components (YAN et al., 2000). The analysis of principal components showed that the two first components were responsible for 72.17% of the total variation in green grain yield (Table 4). Therefore, these results showed that the multivariate technic of principal components explained a large proportion of sum of squares of genotypes and G×E, showing the high efficiency of the methodology (SANTOS et al., 2017b).

**Table 4**. Singular value, variation explained, proportion accumulated, and information relation (IR) for the five principal components (PC) of the GGE biplot analysis for 20 cowpea genotypes evaluated in cultivation value and use assays in five locations in the state of Ceará, Brazil.

PC	Singular Value	% explained	% accumulated	IR	
1	209,924.8	51.84	51.84	3.56	
2	82,305.5	20.33	72.17	1.43	
3	71,534.5	17.66	89.83	1.16	
4	29,155.2	7.20	97.03	0.62	
5	12,020.1	2.97	100.0	0.14	

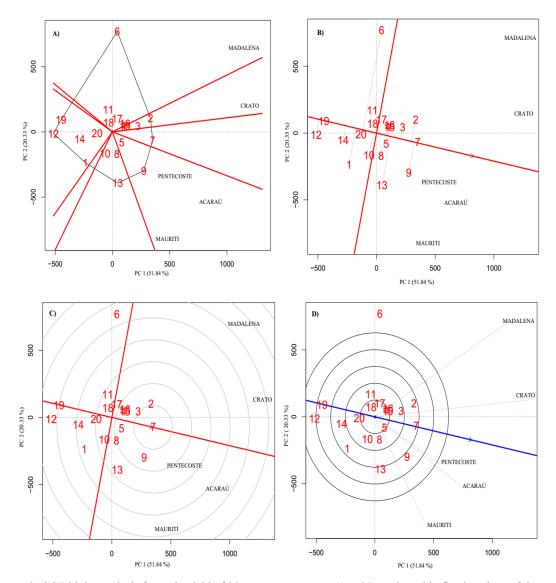
Oliveira et al. (2017) used the same procedure to evaluate adaptability and stability of grain zinc contents in 12 cowpea genotypes and found high efficiency for the two first components (77.8%). However, Sousa et al. (2018) evaluated the effect of the G×E on grain yield of elite lines of cowpea and found lower efficiency when considering the two components (66%). These different first methodology efficiency percentages in the explanation of effects of genotypes and G×E depend on the characters, genotypes, and environments (locations or crop seasons) evaluated (OLIVEIRA et al., 2017).

The IR of the three first principal components were above 1 (Table 4), denoting that they are effectively the most important (informative) to explain the total variation of the data. Oliveira et al. (2017) reported that the existence of patterns in the two first principal components confirms the results of the F test in the joint analysis. Similar to the present study, they found significant differences for  $G \times E$  effects on green grain yields, confirming the different responses of genotypes to environmental changes, thus justifying the application of the GGE biplot method to evaluate their adaptability.

The GGE biplot which-won-where (Figure 2A) based on the two first principal components provided a visualization of patterns, allowing the identification of genotypes with superior development for specific environments. According to this graph, the genotypes 1 (MNC00-586F-303-9), 2 (MNC00-595F-2), 6 (MNC05-841B-49), 7 (MNC05-847B-123), 9 (MNC99-541F-15), 12 (BRS

Xiquexique), 13 (Paulistinha), and 19 (MNC02-701F -2), in the vertices of the polygon are the most responsive to their respective environments near their vertices. However, they can present best or worse performance in one or more environments (YAN; TINKER, 2006), and are more suitable for specific recommendations. Contrastingly, the other genotypes located next to the origin, i.e., within the polygon, are less responsive to environmental stimuli and, thus, more suitable when the objective is a broad adaptation.

The GGE biplot method has the advantage of assisting in delimit agronomical areas by identifying mega-environments, defined as groups of environments with similar G×E and, consequently, with little change in the ranking of genotypes (CARVALHO et al., 2016). The biplot which-wonwhere also allows the visual grouping of environments and determines the genotypes with best mean performances for each mega-environment (YAN et al., 2007). Considering the results of the projections (Figure 2A), three mega-environments were formed: the first represented by Pentecoste, Acaraú, and Mauriti, the second by Crato, and the third by Madalena. The lines 9 (MNC99-541F-15), 2 (MNC00-595F-2) and 6 (MNC05-841B-49) located in the vertices of polygon of first, second, and third mega-environment, respectively, presented the best mean performance within the mega-environments formed. Oliveira et al. (2017) reported that the quantity of mega-environments formed depends on the number and characteristics of genotypes and environments and on the evaluated character.



**Figure 2**. GGE biplot analysis for grain yield of 20 cowpea genotypes (1 to 20) evaluated in five locations of the state of Ceará, Brazil (Acaraú, Pentecoste, Crato, Mauriti, and Madalena). A) which-won-where; B) mean *vs.* stability; C) ideal genotype; D) discrimination *vs.* representativity.

According to the biplot mean vs. stability (Figure 2B), the higher the projection of a genotype in relation to the axis of PC1, the lower its stability; contrastingly, the farther the genotype is from the axis of PC2 (perpendicular to the axis PC1), the more productive it tends to be. Thus, the line 6 (MNC05-841B-49) was the most instable of the genotypes evaluated and expressed lower productive performance than the mean; however, it had advantageous performance in relation to other genotypes grown in the environment Madalena. The lines 7 (MNC05-847B-123), 19 (MNC02-701F-2) and 20 (MNC99-510F-16-1) are highly stable; however, the first stood out with higher green grain yield. Moreover, the lines 2 (MNC00-595F-2), 3 (MNC00-595F-27), 4 (MNC05-835B-15), 5 (MNC05-835B-16), and 8 (MNC05-847B-126), and the control cultivars 15 (Azulão-MS) and 16

(Sempre Verde-CE) stood out, presenting higher stabilities combined with higher yields. Thus, the yield of these control cultivars was surpassed by lines 7 (MNC05-847B-123), 2 (MNC00-595F-2), and 3 (MNC00-595F-27).

According to Yan and Tinker (2006), the high stability of the genotypes is significant only when combined with mean performance. Thus, lines 19 (MNC02-701F-2) and 20 (MNC99-510F-16-1), which showed high stability by presenting low projections of the axis 1, are not good options for green grain production in Ceará, since they stand out only by having high consistent relative performance. However, the line 7 (MNC05-847B-123) had high productive performance combined with high consistent relative performance (high stability), and is a good option, since it had adaptability combined with stability, and surpassed the controls 15 (AzulãoMS) and 16 (Sempre Verde-CE) in both aspects.

An ideal genotype present high mean performance for the studied character combined with high stability in all environments tested (YAN; TINKER, 2006). Although this is a hypothetical model, it is used as reference to identify an ideotype (SANTOS et al., 2017b). Genotypes located nearer the center of concentric circles are the most desirable (Figure 2C); thus, the line 7 (MNC05-847B-123), which had high stability and yield, was close to an ideal genotype, proving to be a promising genotype for green grain production in the state of Ceará.

The lines 3 (MNC00-595F-27) and 2 (MNC00-595F-2), in the limit of the first concentric circle, followed by lines 9 (MNC99-541F-15), 5 (MNC05-835B-16), 8 (MNC05-847B-126), and 4 (MNC05-835B-15), and cultivars 15 (Azulão-MS) and 16 (Sempre Verde-CE), in the second concentric circle, stood out by presenting similar performance to the ideal genotype regarding grain yield and phenotypic stability. The lines 9 (MNC99-541F-15), 2 (MNC00-595F-2), and 3 (MNC00-595F-27) presented superior productive performance to controls 15 (Azulão-MS) and 16 (Sempre Verde-CE), but the two first did not the surpassed them in terms of stability. Therefore, these lines are recommended only for the studied environments (specific adaptability), whereas the line 3 (MNC00-595F-27) had similar stability to controls and can be recommended for the whole state of Ceará. Thus, the recommendation of the best genotypes should not be based only on their high productive performance, but also on their stability.

An ideal test environment should discriminate superior genotypes and be representative of all test environments (SANTOS et al., 2017b). The GGE biplot shows the discriminatory power of a test environment based on the length of its vector (YAN; HOLLAND, 2010). The discrimination vs representativity graph (Figure 2D) showed that the environments Madalena and Crato had higher vectors and, thus, higher discriminatory power; Mauriti and Acaraú presented moderate discriminatory power; and Pentecoste lower discriminatory power. This denotes that the environment Pentecoste hindered the genotypical differentiation.

According to Yan et al. (2007) and Yan and Tinker (2006), environments can be classified as discriminative and representative (useful to select superior adapted genotypes); discriminative and not representative (useful to discard instable genotypes); and not discriminative and not representative (not useful as test environments). Regarding the representativity, the test environment sthat presented small angles with mean environment axis (line that crosses the mean environment and the origin of the biplot) are more representative (YAN; TINKER, 2006); thus, the environments Crato, Pentecoste, and Acaraú were the most representative ones (Figure 2D).

The results showed that the environment Crato was discriminative and representative and, therefore, closer to an ideal location for recommendation of superior genotypes focused on higher green-grain cowpea yields, i.e., this environment favors the selection of superior adapted genotypes. However, the irrigated crop may have affected the choice of this municipality as the closer to an ideal environment, since the constant irrigation, mainly at more critical stages of development of plants (flowering and grain filing) may have improved the yield.

Moreover, Madalena and Mauriti are useful to discard instable genotypes, since these are discriminative and not representative environments (YAN; TINKER, 2006). Pentecoste was not discriminative, but representative, indicating that despite this environment cannot be used to assess genetic variation between genotypes (BLANCHE; MYERS, 2006), it can represent the conditions of other locations of evaluations. None of the environments was simultaneously not discriminative and not representative, making impossible the discarding of environments based on this criterion.

The vectors of the environments (lines that connect environments up to the origin of the biplot) showed the similarity between environments in discriminate the genotypes. According to Yan and Tinker (2006),the distance between two environments measures its dissimilarity in the discrimination of genotypes. Therefore, Pentecoste and Acaraú, which had close environment vectors (Figure 2D), were similar in the discrimination of genotypes. Although these environments are in different mesoregions, they have the same climate (Figure 1) and showed similar results. Consequently, one of the environments can be discarded in further evaluations to provide savings in physical, financial, and human resources.

Despite the geographical proximity between the environments Crato and Mauriti, both located in the same mesoregion (South of Ceará) (Figure 1), they were not similar in the discrimination of genotypes, exhibiting a considerable distance between their vectors. This was probably due to the effect of the sowing time, which was during the dry season in Crato (August of 2016) and during the rainy season in Mauriti (February of 2017); the irrigation used in the experiment conducted in Crato; and the different climate and temperature between Mauriti (tropical hot semiarid, with mean temperature of 25.2 °C) and Crato (tropical mild hot semiarid, with mean temperature of 21.1 °C); and their soil type.

The GGE biplot discrimination vs. representativity (Figure 2D) showed the relation between environments according to the angle formed between their vectors; angles <90° denote strong positive correlation between environments, angles

=90° denote no correlation between environments, and angles >90° denote strong negative correlation between environments (YAN; TINKER, 2006). Therefore, most environments were correlated positively, except Madalena and Mauriti, which had angle >90°. This indicates a G×E of complex nature only between Madalena and Mauriti, i.e., the ranking of genotypes changed only in these two environments. Moreover, there was predominance of simple nature interaction between environments, thus, the recommendation can be done to a broader area without significant consequences.

The similarity between Pentecoste and Acaraú confirms the strong correlation between these environments and the similar classification of genotypes. According to Yan et al. (2007), some environments cannot provide exclusive information due to their similarity with other environments in the separation and classification of genotypes, and can be discarded, providing a decrease in evaluation costs. The identification and discarding of these noninformative and redundant environments should be based on data of several years. A genotype can present high adaptability and stability, but low productive performance, denoting the importance of mean yield analyzes. The gathering of information of GGE biplot analyses and mean yields showed that the lines 7 (MNC05-847B-123), 2 (MNC00-595F-2), and 3 (MNC00-595F-27), which were adapted to the local conditions and had production stability, presented higher mean yields than the controls 14 (Vagem Roxa-THE), 15 (Azulão -MS), and 16 (Sempre Verde-CE) (Table 5). These results confirm the precision and sensitivity of the GGE biplot methodology and indicate that these lines should be recommended for the state of Ceará, focused on green grain production of cowpea.

The line 2 (MNC00-595F-2) in Crato presented the highest yield found in the experiments, denoting a high adaptation to this environment. The highest green grain yields found for lines 2 (MNC00-595F-2), 3 (MNC00-595F-27), 7 (MNC05-847B-123), and 9 (MNC99-541F-15) are possibly due to the genetic superiority of the genotypes, which results in higher mean environmental yields.

**Table 5**. Mean green grain yields (kg ha<sup>-1</sup>) of 20 cowpea genotypes evaluated in cultivation value and use assays in five locations in the state of Ceará, Brazil.

	Genotypes	Environments										
Code		Acaraú I		Pente	Pentecoste		Crato		Mauriti		Madalena	
1	MNC00-586F-303-9	781	Bb	563	Da	896	Ad	715	Cb	893	Ab	770
2	MNC00-595F-2	1064	Ca	631	Da	2413	Aa	634	Db	1629	Ba	1274
3	MNC00-595F-27	1005	Ca	930	Da	1196	Bc	722	Eb	1821	Aa	1135
4	MNC05-835B-15	938	Ca	640	Da	1765	Ab	322	Ec	1053	Bb	944
5	MNC05-835B-16	929	Ca	583	Ea	1384	Ac	751	Db	1314	Bb	992
6	MNC05-841B-49	646	Cb	248	Db	1257	Bc	104	Ed	1966	Aa	844
7	MNC05-847B-123	1350	Ca	875	Da	1438	Bc	739	Eb	1780	Aa	1236
8	MNC05-847B-126	1139	Ba	807	Da	1294	Ac	512	Eb	1115	Cb	973
9	MNC99-541F-15	1099	Ca	676	Ea	1712	Ab	1065	Da	1319	Bb	1174
10	BRS Guariba	1091	Ba	608	Ea	880	Cd	701	Db	1290	Ab	914
11	BRS Tumucumaque	793	Cb	343	Eb	1416	Ac	389	Dc	1211	Bb	830
12	BRS Xiquexique	555	Bb	238	Eb	407	Dd	489	Cc	878	Ab	513
13	Paulistinha	1422	Aa	588	Ea	1077	Cc	855	Da	1174	Bb	1023
14	Vagem Roxa-THE	769	Cb	222	Eb	805	Bd	627	Db	1032	Ab	691
15	Azulão-MS	1323	Ba	701	Da	914	Cd	504	Eb	1737	Aa	1036
16	Sempre Verde-CE	973	Ca	606	Ea	1277	Bc	628	Db	1546	Aa	1006
17	<b>BRS</b> Aracê	852	Ca	435	Ea	1296	Bc	625	Db	1449	Aa	931
18	Pingo-de-Ouro-1-2	911	Ca	505	Ea	1087	Bc	532	Db	1392	Ab	885
19	MNC02-701F-2	611	Bb	552	Ca	733	Ad	80	Db	713	Ab	538
20	MNC99-510F-16-1	800	Cb	463	Ea	943	Bd	641	Db	1262	Ab	822

Means followed by the same uppercase letter horizontally and the same lowercase letter vertically constitute a statistically homogeneous group using the Scott-Knott test at p < 0.05.

# **CONCLUSIONS**

The lines 2 (MNC00-595F-2), 3 (MNC00-595F-27), 7 (MNC05-847B-123) and 9 (MNC99-541F-15), presented higher productive performances and are indicated for further evaluations in cowpea breeding programs focused on green grain production. The environments Pentecoste and Acaraú were similar in the discrimination of genotypes, whereas the environments Crato and Mauriti were not similar in the discrimination of genotypes.

The lines 7 (MNC05-847B-123) and 3 (MNC00-595F-27) of cowpea can be recommended for green grain production in the state of Ceará, Brazil, due their high grain yield, adaptability, and

genotypical stability.

The line 2 (MNC00-595F-2) can be recommended specifically for Crato, since it combined good stability and adaptability to high grain yield in this environment.

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