

Selection indices to identify drought-tolerant grain sorghum cultivars

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ABSTRACT. Twenty-five cultivars of grain sorghum [*Sorghum bicolor* (L.) Moench] were examined under both drought stress and normal conditions in 4 experiments. In each condition, genotypes were evaluated in a factorial experiment using a randomized complete block design with 3 replications. Eight drought tolerance indices including stability tolerance index, mean productivity (MP), geometric MP, harmonic mean, stress susceptibility index, tolerance index, yield index, and yield stability index were estimated for each genotype based on grain yield under drought (Ys) and irrigated conditions (Yp). The results indicated that there were positive and significant correlations among Yp and Ys with geometric MP, MP, harmonic mean, and stability tolerance index, indicating that these factors are better predictors of Yp and Ys than tolerance index, stress susceptibility index, yield stability index, and yield index. Based on adjusted means at Yp and Ys, indices geometric

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MP, MP, harmonic mean, and stability tolerance index, unweighted pair group method with arithmetic mean cluster and biplot analysis, the most tolerant cultivars were '9929020', '9929034', and 'N 95B'.

Key words: Abiotic stress; Drought stress; *Sorghum bicolor*; Sorghum breeding; Sorghum yield

INTRODUCTION

The area used to plant grain sorghum in Brazil has increased in recent decades. Major production areas are in southeast region in the States of Goiás, Mato Grosso, and Minas Gerais. Although the national average yield is 2.6 t/ha (CONAB, 2013), the results of experimental trials indicate that this yield can be doubled if growers follow technical crop management guidelines.

Sorghum yields have not increased or have even declined because production is being pushed into more marginal areas and poorer soils. In Brazil, sorghum is grown as a succession crop after soybean. After harvesting the soybean, a farmer begins sowing corn in late January and early February. Sorghum is planted in the rest of the area when the risk of planting corn is high because of drought stress, and in most of the times without any fertilizer. Therefore, the development of drought-tolerant sorghum cultivars producing more stable for yield is essential for guaranteeing the success of the sorghum crop in these areas.

Drought may be the most important abiotic stress limiting crop productivity worldwide, including Brazil; in Brazil, sorghum is typically grown when rainfall is generally low or its distribution is erratic. The crop season often has a normal rain start but terminates prematurely, thereby exposing the crop to post-flowering stress.

Identification of lines with high levels of post-flowering drought tolerance and the selection of these lines for higher yields are very important for sorghum breeding.

The relative yield performance of genotypes in drought-stressed and non-stressed environments appear to be a common starting point for identifying desirable genotypes for unpredictable rainfall conditions (Mohammadi et al., 2010). Various conditions must be considered during the selection process: a) under non-stressed conditions, b) under target stress condition, and c) a mid-point under both none and stressed conditions (Betrán et al., 2003; Golabadi et al., 2006; Mutava et al., 2011). Drought resistance was defined by Hall (1993) as the major relative yield of a genotype compared with other genotypes subjected to the same drought stress. Drought susceptibility of a genotype is often measured as a function of the reduction in yield under drought stress (Blum, 1988), while the values are confounded with the differential yield potentials of genotypes (Ramirez and Kelly, 1998). Several indices were utilized to evaluate the genotypes for drought tolerance, which are shown in Table 1.

Typically, the efficiency of these indices are evaluated in one local environment without considering the genotype-environment interaction. Thus, it is necessary to evaluate this effect for choosing the best indices for genotype screening. Selection of different genotypes under environmental stress conditions is a priority of plant breeders for exploiting genetic variability to improve stress-tolerant cultivars.

The present study was conducted to assess selection indices for identifying drought tolerance in grain sorghum genotypes considering the environmental effect, as well as to select the best genotypes that are stable under both stressed and non-stressed conditions.

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| Drought tolerance indices | Equation ¹ | References |
|--------------------------------|---|-------------------------------|
| 1.Stress susceptibility index | $SSI = \frac{1 - \left(\frac{Ys}{Yp}\right)}{1 - \left(\frac{\overline{Ys}}{\overline{Yp}}\right)}$ | Fischer and Maurer (1978) |
| 2. Geometric mean productivity | $GMP = \sqrt{(Ys)(Yp)}$ | Fernández (1992) |
| 3. Mean productivity | $MP = \frac{Ys + Yp}{2}$ | Rosielle and Hambling (1981) |
| 4. Harmonic mean | $HM = \frac{2(Yp.Ys)}{T}$ | Jafari et al. (2009) |
| 5. Tolerance index | Yp + Ys $TOL = Yp - Ys$ | Rosielle and Hambling (1981) |
| 6. Stress tolerance index | $STI = \frac{(Ys)(Yp)}{(\bar{Y}p)^2}$ | Fernández (1992) |
| 7. Yield index | $YI = \frac{Ys}{Ys}$ | Gavuzzi et al. (1997) |
| 8. Yield stability index | $YSI = \frac{Ys}{Yp}$ | Bouslama and Schapaugh (1984) |

 ${}^{1}Y_{s}$ and Y_{p} are stress and optimal (potential) yield of a given genotype, respectively. Ys and Yp are average yield of all genotypes under stress and optimal conditions, respectively.

MATERIAL AND METHODS

Twenty-five sorghum lines were evaluated in 2 moisture regimes. In the first, lines were well-watered throughout the growing period to allow the genotypes to affect production under non-stress conditions. In the second, lines received adequate watering from germination to the boot stage (just before flowering stage), after which no additional watering was applied. This treatment simulated post-flowering (terminal) moisture stress conditions.

Four experiments were carried in the field, 3 at Nova Porteirinha, MG (sowings on June 14, 2006; June 1, 2007; and July 2, 2008) and Teresina, PI (sowing on September 21, 2006). Both sites are located in a semi-arid region and have a very well-defined rainy season, with no rain during the trial periods (Figure 1). For sorghum drought selection, the main target is to identify stress tolerance during grain-filling period. The mean temperature and precipitation during trials at the 2 locations are shown in Figure 1.

The experimental design consisted of a randomized complete block, with treatments arranged in a factorial 25 x 2 x 4 with 3 replications. Treatments were 25 lines, 2 moisture regimes, and 4 environments.

The plots consisted of 2 rows that were 5 m long and spaced 0.50 m. Sowings were carried out in line with excess seeds so that after thinning, 30 days after seeding, the plot was

left with around 200,000 plants/ha. Grain yield and indices were estimated using the equations shown in Table 1.

Analysis of variance, mean comparison, correlation between different treatments, cluster analysis of genotypes based on Euclidean distance, and biplot display were performed using the R Statistical Software.



Figure 1. Mean monthly air temperature and precipitation sum during trial periods at Nova Porteirinha (NP), 2006; Teresina (TE), 2006; Nova Porteirinha, 2007, and Nova Porteirinha, 2008. Source: INMET - Instituto Nacional de Meteorologia.

RESULTS AND DISCUSSION

The effect of the experimental conditions was significant for all indices, except stress susceptibility index (SSI) and yield index (YI); this indicates that cultivar performance was very influenced by the conditions. The SSI and YI indices were not affected by the different conditions, demonstrating the stability of these indices. Therefore, these indices, if significantly correlated with yield under drought (Ys) and yield under irrigated (Yp) conditions, can be used to select for superior genotypes in one location and inferred for another (Table 2). The disadvantage of these 2 indices is that they increased the coefficient of variation, reducing the significance of the genotype effects.

The significant interaction (genotypes x environments) suggested that sorghum hybrids should be selected based on a combination of yield and yield stability under normal irrigation and water deficit conditions rather than on mean yield alone. However, the effect of genotype was not significant for SSI, tolerance index (TOL), and yield stability index (YSI) (Table 2). Therefore, these indices are not useful for discriminating genotypes in relation to water stress. The results suggest that there is high genetic variation among genotypes, which may be useful for selecting drought-tolerant germplasms.

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| Table 2. Varian | ce analy | ysis of hydric s | tress indices for | sorghum yield ii | ı four expe | sriments. | | | | | |
|---|-----------------------------|---|---------------------------------------|---------------------------------------|----------------------|------------------------------------|--------------------------------------|------------------------------------|----------------------------|-------------------------|--------------------|
| Source of variation | d.f. | Yp | Ys | GMP | ISS | MP | ΗМ | TOL | ITZ | И | ΥSI |
| Replication/E | ~ | 3195047.7** | 7136371.4** | 4316639.1** | 2.78** | 3692031.9** | 5009854.1** | 5894710.5** | 0.29** | 0.57** | 0.19** |
| Experiments (E) | ŝ | 89786896.1** | 163965806.8** | 138257351.3** | 0.07ns | 115283990.0** | 156581203.9** | 4636445.6** | 2.63^{**} | 0.01 ns | 2.11** |
| Genotypes (G) | 24 | 9550251.8** | 3445273.4** | 4770350.1** | 0.75^{ns} | 5059959.3** | 4697636.9** | 5751213.0 ^{ns} | 0.40^{**} | 0.45** | 0.10^{ns} |
| GXE | 72 | 3618768.1** | 1362201.1** | 1344286.6^{**} | 0.73^{**} | 1481197.2** | 1375428.4** | 4037149.6** | 0.13^{**} | 0.19^{**} | 0.09 ** |
| Residual | 192 | 1146028.0 | 747180.8 | 535804.2 | 0.42 | 533315.1 | 610434.0 | 1653157.3 | 0.04 | 0.08 | 0.04 |
| CV | | 19.6 | 27.7 | 18.3 | 71.4 | 17.0 | 20.7 | 54.7 | 35.9 | 28.4 | 35.4 |
| Mean | | 5467.0 | 3116.39 | 4008.6 | 0.92 | 4291.7 | 3772.2 | 2350.7 | 0.57 | 1.00 | 0.59 |
| Yp = yield under productivity; HM ns: not significant | optima = harn at 0.05 | l conditions; Y nonic mean; TC probability. | 's = yield under DL = tolerance ir | stress condition: ndex; STI = stre | s; GMP = ss toleranc | geometric mean e index; YI = yi | productivity; SS eld index; YSI = | I = stress susc yield stability | eptibility i index. **S | ndex; MP Significant | = mean at 0.01; |

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Grain yield varied from 4096 kg/ha (line SC 283) to 7687 kg/ha (line N 95B) under Yp and from 2341 kg/ha (line SC 283) to 4171 kg/ha (line 9929020) in Ys. Mean grain yield under non-stress condition was 5467 kg/ha, while under water stress condition it was 3116 kg/ ha, indicating a reduction of 43% compared to full-irrigation conditions (Table 2). The data showed that drought stress in sorghum can significantly reduce grain yield.

The lines N 95B, BR 008B, and 9929034 showed higher grain yield under non-stress conditions, with yield averages higher than 6600 kg/ha, and the lines 9929020, N 95B and 9929034 recorded higher grain yield in stress environment, with yield averages as higher as 3900 kg/ha. The genotypes N 95B and 9929034 showed good performance under both water conditions (Table 3).

Table 3 Average yield of sorghum from 4 experiments using different drought tolerance indices

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|------|----------------|----------------|---------------|----------|---------|------|----------|----------|---------|------|------|
| Code | Genotype | Yp (kg/ha) | Ys (kg/ha) | GMP | SSI | MP | HM | TOL | STI | YI | YSI |
| 1 | 9409132 | 4467 | 2714 | 3392 | 0.75 | 3591 | 3222 | 1753 | 0.38 | 0.92 | 0.73 |
| 2 | 9503086 | 5606 | 3165 | 4113 | 0.94 | 4385 | 3882 | 2441 | 0.57 | 1.03 | 0.58 |
| 3 | 9929020 | 6275 | 4171 | 5058 | 0.73 | 5223 | 4904 | 2105 | 0.92 | 1.47 | 0.67 |
| 4 | 9929034 | 6620 | 3954 | 4993 | 0.81 | 5287 | 4735 | 2665 | 0.83 | 1.26 | 0.67 |
| 5 | ATF 14B | 5643 | 2433 | 3595 | 1.39 | 4038 | 3238 | 3210 | 0.43 | 0.74 | 0.43 |
| 6 | ATF 46B | 4450 | 2512 | 3310 | 1.11 | 3481 | 3152 | 1939 | 0.39 | 0.84 | 0.57 |
| 7 | ATF 54B | 5214 | 2392 | 3304 | 0.95 | 3803 | 2919 | 2822 | 0.38 | 0.71 | 0.49 |
| 8 | ATF 8B | 5247 | 3045 | 3914 | 0.90 | 4146 | 3711 | 2202 | 0.51 | 0.99 | 0.59 |
| 9 | B 803 | 5100 | 3021 | 3855 | 0.97 | 4060 | 3672 | 2079 | 0.50 | 1.00 | 0.60 |
| 10 | B 8911 | 4715 | 2983 | 3707 | 0.81 | 3849 | 3575 | 1732 | 0.47 | 0.98 | 0.62 |
| 11 | BR 008B | 7077 | 3338 | 4661 | 1.15 | 5208 | 4237 | 3739 | 0.74 | 1.04 | 0.48 |
| 12 | CMSXS230B | 5293 | 3598 | 4282 | 0.67 | 4445 | 4136 | 1695 | 0.63 | 1.12 | 0.68 |
| 13 | N 95B | 7687 | 4157 | 5545 | 1.04 | 5922 | 5218 | 3531 | 1.04 | 1.32 | 0.53 |
| 14 | P 89003 | 5814 | 3431 | 4432 | 1.05 | 4623 | 4256 | 2383 | 0.68 | 1.17 | 0.60 |
| 15 | SC 283 | 4096 | 2341 | 3001 | 0.73 | 3219 | 2812 | 1755 | 0.31 | 0.76 | 0.60 |
| 16 | SC 414-12-E | 5904 | 3521 | 4505 | 0.99 | 4712 | 4316 | 2384 | 0.71 | 1.09 | 0.58 |
| 17 | SC 566-14 | 5799 | 2904 | 4007 | 1.09 | 4351 | 3715 | 2895 | 0.55 | 1.01 | 0.53 |
| 18 | Tx 2737 | 5369 | 3802 | 4405 | 0.42 | 4585 | 4246 | 1567 | 0.65 | 1.20 | 0.71 |
| 19 | Tx 2862 | 5731 | 2745 | 3868 | 1.27 | 4238 | 3559 | 2986 | 0.58 | 0.92 | 0.49 |
| 20 | Tx 2895 | 5591 | 2602 | 3631 | 1.16 | 4097 | 3292 | 2989 | 0.45 | 0.75 | 0.45 |
| 21 | Tx 2904 | 5078 | 2744 | 3587 | 1.04 | 3911 | 3336 | 2334 | 0.46 | 0.84 | 0.53 |
| 22 | Tx 2907 | 4377 | 2678 | 3265 | 0.63 | 3528 | 3052 | 1699 | 0.37 | 0.81 | 0.61 |
| 23 | Tx 2908 | 6486 | 3212 | 4403 | 1.20 | 4849 | 4048 | 3274 | 0.68 | 1.00 | 0.47 |
| 24 | Tx 430 | 4292 | 3134 | 3475 | 0.39 | 3713 | 3281 | 1158 | 0.42 | 0.89 | 0.74 |
| 25 | Tx 436 | 4749 | 3316 | 3908 | 0.72 | 4032 | 3792 | 1433 | 0.54 | 1.13 | 0.70 |

For abbreviations, see Table 2.

The values of geometric mean productivity (GMP) ranged from 3001-5545 kg/ha and the genotypes N 95B, 9929020, and 9929034 were the most productive (>4993 kg/ha). Based on mean productivity (MP), yield was 3219-5922 kg/ha, indicating that these genotypes were the most productive (>5027 kg/ha). Harmonic mean (HM) ranged from 2812-5218 kg/ha, suggesting that the genotypes N 95B, 9929020, and 9929034 are the most promising of all studied genotypes (>4735 kg/ha). Stability tolerance index (STI) ranged from 0.3-1.0; values close to 1 indicate high stress tolerance. Genotypes 13, 3, 4, and 11 had higher values of up to 0.7, suggesting that these genotypes were the most tolerant. YI ranged from 0.7-1.5, with genotypes 9929020, N 95B and 9929034 with the higher index (>1.2). The YI selected the same genotypes of Ys (r = 0.96) and showed a moderate correlation with Yp (r = 0.58).

To determine the most desirable drought tolerance measures, the correlation coefficient between Yp, Ys, and other quantitative indices of drought tolerance were estimated (Table 4).

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| Table | Table 4. Correlation coefficients between of drought stress index, and yield under optimal and stress conditions. | | | | | | | | | | | | |
|-------|--|---------------------|--------------------|---------------------|---------------------|--------------------|--------------------|--------------------|-------|--|--|--|--|
| | Yp | Ys | GMP | SSI | MP | HM | TOL | STI | YI | | | | |
| Ys | 0.63** | | | | | | | | | | | | |
| GMP | 0.88** | 0.92** | | | | | | | | | | | |
| SSI | 0.45* | -0.30 ^{ns} | 0.07 ^{ns} | | | | | | | | | | |
| MP | 0.95** | 0.85** | 0.98** | 0.19 ^{ns} | | | | | | | | | |
| HM | 0.80** | 0.96** | 0.99** | -0.02** | 0.95** | | | | | | | | |
| TOL | 0.80** | 0.04 ^{ns} | 0.42* | 0.82** | 0.57** | 0.30 ^{ns} | | | | | | | |
| STI | 0.87** | 0.91** | 0.99** | 0.08 ^{ns} | 0.97** | 0.98** | 0.42* | | | | | | |
| YI | 0.58** | 0.96** | 0.88** | -0.24 ^{ns} | 0.80** | 0.94** | 0.01 ^{ns} | 0.88** | | | | | |
| YSI | -0.41* | 0.40* | 0.04 ^{ns} | -0.88** | -0.12 ^{ns} | 0.15 ^{ns} | -0.83** | 0.02 ^{ns} | 0.42* | | | | |

For abbreviations, see Table 2. *,**Significant at 0.05 and 0.01; ns: not significant at 0.05 probability.

The indices GMP, MP, HM, and STI were very similar to the selection based on Yp and Ys. This was confirmed by the high correlations between Yp and GMP (r = 0.88), MP (r = 0.95), HM (r = 0.80), and STI (r = 0.87) and the correlation between Ys and GMP (r = 0.92), MP (r = 0.85), HM (r = 0.96), and STI (r = 0.91) (Table 4).

MP is the mean production under both stress and non-stress conditions, and was highly correlated with yield under both conditions. Thus, MP can be used to identify cultivars in the tolerant group. A limitation of using MP is that it is very influenced by extreme values, i.e., yields very low or very high, which was not observed in this study.

SSI values varied from 0.39-1.39, which were significantly and negatively correlated with yield under stress and positively correlated with the TOL index. A low SSI value is preferred, and the genotypes Tx 2907, Tx 2737, and Tx 430 showed the lowest indices. These genotypes were not selected based on the other indices.

TOL ranged from 1158-3739 kg/ha. Lower or negative TOL indices indicate tolerance to water stress. Therefore, the genotypes Tx 430, Tx 436, and Tx 2737 were more tolerant (<1567 kg/ha). Notably, the less tolerant genotypes were BR 008B and N 95B (>3530 kg/ha), in contrast to the indices GMP, STI, MP, and HM. This was verified by the moderate correlation observed for TOL with GMP (r = 0.42), MP (r = 0.57) and was not significant with HM (r = 0.30). A positive correlation between TOL and yield under normal conditions (Yp) and a negative correlation between TOL and yield under stress (Ys) suggested that selection based on TOL resulted in reduced yield under stress, but failed to select genotypes with good yield in both environments. Similar results have been reported in several crops such as barley (Rizza et al., 2004), wheat (Sio-Se Marde et al., 2006), durum wheat (Talebi et al., 2009; Shiri et al., 2010), and chickpea (Talebi et al., 2011).

YSI ranged from 0.43-0.74; a higher rate indicates greater stability. Genotypes that showed higher indices include Tx 430, 9409132, Tx 2737, and Tx 436 whose values were greater than 0.70 (Table 3). Similarly to the SSI and TOL, correlations between YSI and GMP, STI, MP, and HM were low (r = 0.04, r = 0.02, r = -0.12, and r = 0.15, respectively), indicating that similar genotypes were not selected (Table 4).

A suitable index must be significantly correlated with yield in any of the 2 environments and a lower coefficient of variation. The indices SSI, TOL, and YSI showed the lowest correlation with Ys (Table 4), and the highest coefficient of variation (Table 2). YI was significantly correlated with Ys and Yp, but showed a higher coefficient of variation than the GMP, MP, and HM indices.

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The results indicated that there were positive and significant correlations among Yp and Ys with GMP, MP, HM, and STI; thus, these parameters may be better predictors of Yp and Ys than TOL, SSI, YSI, and YI. The observed results are consistent with those of Fernández (1992) in mungbean, Farshadfar and Sutka (2002a,b) in wheat and maize and Golabadi et al. (2006) in durum wheat.

STI was significantly correlated with Yp and Ys, but had a higher coefficient of variation than GMP. STI was calculated based on the GMP index and therefore a high positive correlation was observed between these indices (0.963), which is in agreement with Fernández (1992) and Mozaffari et al. (1996). Therefore, GMP is a better selection factor than STI.

Selection based on a combination of indices may be more useful for improving drought resistance of sorghum, but the correlation coefficient is useful for determining the degree of overall linear association between any 2 attributes. Thus, a better approach than a correlation analysis such as biplot analysis is required to identify superior genotypes for both stress and non-stress environments. Principal component analysis (PCA) revealed that the first PCA explained 65% of the total variation and was highly and positively correlated with Yp, Ys, GMP, MP, HM, and STI (Figure 1). Thus, the first dimension can be considered the yield potential and drought tolerance. Considering the high and positive values determined through biplot analysis, genotypes with high values for this index will be high-yielding under stress and non-stress environments. Therefore, genotypes belonging to numbers 13, 3, and 4 were superior genotypes under both conditions in all locations. The second PCA explained 32% of the total variability. Genotypes with higher PCA are more suitable for non-stressed than stressed environments.

The biplot shows that the best index for evaluating genotypes under stress condition (Ys) is YI, and genotype 3 (9929020) was found to be best suited to water stress. A similar result was found by Yarnia et al. (2011) and Darvishzadeh et al. (2010). In contrast, vectors for the indices MP, STI, GMP, and HM remained between the Yp and Ys vectors, indicating that these indices are very similar for drought selection. GMP and STI appeared to be the best indices for dividing the angle symmetrically between Yp and Ys. Therefore, these factors can be used to select for genotypes that are better adapted to both conditions. A similar conclusion was reached by Yarnia et al. (2011) in studying rape. Darvishzadeh et al. (2010) examined sunflower in one location, and found that tolerant indices including MP, GMP, and HM were suitable for drought-tolerant genotype selection. However, based on the biplot presented by these authors, GMP is the most appropriate index for selection under stressed and non-stressed conditions. Kharrazi and Rad (2011) suggested that MP and STI are useful indicators for selecting tolerant genotypes.

The correlation coefficient between any 2 indices was nearly the cosine of the angle between their vectors. Thus, $r = \cos 180^\circ = -1$, $\cos 0^\circ = 1$, and $\cos 90^\circ = 0$ (Yan and Rajcan, 2002). The most prominent relationships revealed by these biplots were: i) a strong negative association between SSI and TOL with YSI, as indicated by the large obtuse angles between their vectors, ii) a nearly zero correlation between SSI with GPM, MP, HM, and STI, as well as SSI and TOL with Ys and YI, as indicated by the nearly perpendicular vectors, and iii) a positive association between Yp and Ys with MP, GMP, HM, and STI, as indicated by the acute angles (Figure 2). The results obtained from the biplot graph confirmed the correlation analysis results (Table 4).

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Figure 2. Biplot diagram of 25 sorghum genotypes and 8 drought indices. The indices are indicated using uppercase letters (see Table 2, for abbreviations), and each genotype is represented with numbers. Genotype codes: see Table 3.

Using indices with the highest correlation with Yp and Ys (GMP, MP, HM, YI, and STI), unweighted pair group with arithmetic mean cluster analyses were conducted to group the genotypes (Figure 3). The results were consistent with those of biplot analysis (Figure 2). The advantage of this approach is that it can be used to calculate distances between genotypes. The distance between the 2 greater clusters was 1300 units. The top cluster grouped genotypes with low yield, while the lower cluster contained genotypes with higher yield. Within the cluster of superior genotypes, 3, 4, and 13 were 1000 units away from other members of the sub-cluster. This result indicates the superiority of these genotypes, and efficiency of these 5 indices for classifying genotypes under both stress and non-stress conditions.



Figure 3. Dendrogram from UPGMA cluster analysis of genotypes based on drought tolerance indices (GMP, MP, HM, STI, and YI) and grain yield of grain sorghum lines, in both normal and stress environments. Genotype codes: see Table 3.

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CONCLUSIONS

Drought stress significantly affected the yield of sorghum lines, causing a reduction of 43% compared to the full-irrigation condition. GMP, MP, HM, and STI were more suitable indices for selecting sorghum lines tolerant to drought.

Selection using these indices can be useful for identifying a cultivar with desirable yield under both stress and non-stress conditions (group A), although the selection was conducted based on PCA results (by using several indices rather than only one index).

Based on yield under non-stressed and stressed conditions, the lines 9929020, 9929034, and N 95B were the best performing genotypes. The indices SSI, TOL, and YSI were not correlated with either Yp or Ys. YI may also be useful when the selection program goal is to identify lines in a water stress environment.

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