# **BREEDING AND GENETICS**

## Testing Locations in Regional High Quality Tests for Cotton Seed Quality Traits

Linghe Zeng\*, William C. Bridges Jr., and Fred M. Bourland

## ABSTRACT

Significant genotype (G) × environment (E) effects for cotton (Gossypium hirsutum L.) seed quality traits have been identified in previous studies. Significant G × E interactions necessitate multiplelocation tests to evaluate seed quality traits, which add cost to the tests. Reduction of testing locations could trim costs if the analysis of G × E interactions and the efficiency in breeding are not dramatically affected. The objectives of this study were: 1) to determine an appropriate reduction of testing locations without significant loss in power for detecting  $G \times E$  effects; 2) to determine an appropriate reduction of testing locations without significant loss in accuracy for estimating strain means; and 3) to identify a possible mega-environment for evaluation of seed traits using GGE biplot. Historical data of Regional High Quality (RHQ) tests from 2005 through 2013 were used to address the objectives for three seed quality traits including oil content, N content, and free-gossypol. Significant G × location (L) interactions were detected in most cases. However, with averages of the three traits, less G  $\times$  L interactions were detected with 7.3% and 9.1% non-significance, when two and three locations were omitted, respectively. Reduction of locations up to three, increased standard error to 25% of those with zero locations omitted. There was no clear mega-environment identified for seed traits. However, the locations of Lubbock, TX, Stoneville, MS, Florence, SC, and Portageville, MO were identified as being more representative than others for evaluation of the N content.

In general, genotype by environment interaction (G  $\times$  E) can be defined as differential performance of genotypes across environments. There are two types

of  $G \times E$  in breeding with ranking changes in cultivar performance across environments, i.e., crossover, or without ranking change across environments (De Leon et al., 2016). The impact of  $G \times E$  in plant breeding can be negative because it complicates breeding designs and reduces genetic gain and heritability when tests are conducted across broad geographic regions (Kang, 1998). Possibilities also exist for breeders to take advantage of  $G \times E$  to develop cultivars with specific adaptation to environments when 'crossover' interactions are significant. The successful application of this strategy relies on some repeatability of the 'interaction patterns' (Cooper, 1999). In other cases, when there was no significant crossover, breeders can select a superior genotype across diverse environments. If  $G \times E$  effects are large, the testing environments can be divided into regions to reduce  $G \times E$  effects and superior genotypes can be selected for the targeting regions.

Genotype x Environment effects on lint yield and fiber quality have been analyzed extensively as summarized below. United States (U.S.) breeders now spend more effort in developing cultivars with adaptability across environments. In earlier periods, i.e., 1970-1980, breeders focused more on selecting for locally superior genotypes (Meredith, 1984). In a few studies of  $G \times E$  for lint yield, the ratio of the  $G \times L$  variance component to the G variance component ranged from 0.12 to 3.3 (Abou-El-Fittouh et al., 1969; Miller et al., 1959; Murray and Verhalen, 1970). In contrast, a study of  $G \times E$  effects on lint yield using data of Regional High Quality (RHQ) tests from 2001 through 2007 (Meredith et al., 2012), G and  $G \times L$  variance components contributed 7.4% and 1.7% of total variance, respectively. In another study of  $G \times E$  effects on lint vield in RHQ tests, variance components of G and G  $\times$  L were analyzed in three-year testing cycles from 1996-2013 and the ratios of  $G \times L$  to G ranged from 0.61 to 1.9 in the six testing cycles (Zeng et al., 2015). Generally, significant  $G \times E$  effects were observed for seed quality traits in a series of recent studies (Campbell et al., 2016; Meredith et al., 2012; Zeng et al., 2015). Meredith et al. (2012) reported that G and  $G \times E$  variance components for seed oil content contributed 36.7 and 10.5% of total variance, respectively, and variance

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components of G and G × E for seed protein content contributed 10.8 and 7.7% to total variance, respectively. Zeng et al. (2015) observed highly significant G × L for seed oil content, protein content, and free gossypol content in six three-year testing cycles of the RHQ tests from 1996-2013. In another study over 11 location-year environments in North Carolina, South Carolina, Georgia, and Mississippi, G × E was highly significant for oil content, but not significant for protein content (Campbell et al., 2016).

Significance of  $G \times E$  effects for cotton seed quality traits necessitates multiple location tests which results in increased cost. Reduction of testing locations may be a feasible solution to reduce costs if the statistical power to detect  $G \times E$  will not be significantly reduced with fewer test locations. In this study, historical data of cotton seed quality traits in the RHQ tests were used to determine how reducing testing locations could possibly reduce the F-statistics for detecting significant  $G \times E$  effects, and/or increase the strain standard errors. The data were also used to analyze testing locations to identify possible megaenvironments for seed quality traits using GGE biplot.

#### **MATERIALS AND METHODS**

Historical data of RHQ tests conducted from 2005 through 2013 were used for this study. The RHQ tests are part of the United States Department of Agriculture-Agricultural Research Services (USDA-ARS) National Cotton Variety Test (NCVT) program, which evaluates cotton cultivars, elite strains, and exotic germplasm lines for yield and fiber quality across different locations in the U.S. Cotton Belt. The RHQ sites of tests between 2005 and 2013 involved 12 locations from five agric-climatic regions of the U.S. identified as Eastern, Delta, Central, High Plains, and Western (Table 1). These locations differed substantially in geographic locations, temperature, and rainfall (Zeng et al., 2014). In the RHQ tests, the same sets of entries were evaluated at different locations each year, but different sets of strains were tested in different years. Two to three cultivars were planted at all locations as national standards in a three-year cycle. The tests between 2005-2013 were divided into three three-year cycles with 19 to 22 strains tested in each cycle (Table 1).

Table 1. Testing locations, regions, and standards of the Regional High Quality tests from 2005 through 2013

Testing locations and regions									
Locations	Abbreviation	Region							
Belle Mina, AL	BEL <sup>a</sup>	Eastern							
Florence, SC	FLO	Eastern							
Jackson, TN	JAC	Eastern							
Tifton, GA	TIF	Eastern							
Keiser, AR	KEI	Delta	Delta						
Portageville, MO	POR	Delta							
Stoneville, MS	STV	Delta							
Bossier City, LA	BOS	Central	Central						
College Station, TX	COL	Central							
Saint Joseph, LA	SAI	Central							
Lubbock, TX	LUB	Plain							
Las Cruces, NM	LAS	Western							
	Entries and standar	ds							
3-year testing cycles	No. of genotypes	Standards	PVP						
2005-2007	20-22	PHY72 Acala	200100115						
		ST4892BR	200000253						
		DP555BG/RR	200200047						
2008-2010	19-22	PHY72 Acala	PHY72 Acala						
		DP555BG/RR							
2011-2013	20-21	PHY375WRF	PHY375WRF						
		FM9058F	200700206						

<sup>a</sup> BEL, Belle Mina, AL; BOS, Bossier City, LA; COL, College Station, TX; FLO, Florence, SC; JAC, Jackson, TN; KEI, Keiser, AR; LAS, Las Cruces, NM; LUB, Lubbock, TX; POR, Portageville, MO; SAI, Saint Joseph, LA; STV, Stoneville, MS; TIF, Tifton, GA.

Experimental design at all locations was a randomized complete block with four to six replicates for evaluation of lint yield and two replicates for fiber quality and seed quality traits (Meredith et al., 2012). Boll samples were obtained from 50 to 150 hand-picked bolls per plot from each replicate. Plants were grown in about  $12 \text{ m} \times 1 \text{ m}$ , two-rows plots. Boll samples from individual plots at each location were ginned separately using laboratory saw gins. Seed were sent to Eurofins Scientific<sup>4</sup> (Memphis, TN) for measurements of seed quality traits. Oil content was measured from fuzzy seed by the American Oil Chemists' Society (AOCS) recommended practice Aa 4-38 (AOCS, 2001). Nitrogen was measured from fuzzy seed by the AOCS Method Ba 4-38 (AOCS, 1976). Gossypol was measured from dehulled seed which were dried in a forced-draft oven at 82°C for 4 h. The method was the AOCS recommended practice Ba 8a-99 (AOCS, 1998). The isomers of the (+) and (-) gossypol were determined by high performance liquid chromatography (HPLC).

The statistical analysis was conducted in two steps. The first step was to determine the appropriate reduction in the number of locations from the RHQ tests. A statistical model was developed within each year such that genotype  $\times$  location F-tests could be conducted, and genotype standard errors could be estimated. The form of the model was

 $Y_{ijk} = \mu + L_i + R(L)_{ij} + G_k + GL_{ik} + GR(L)ilk$ 

where  $Y_{ijk}$  is the dependent variable for seed quality traits;  $\mu$  is the overall mean; L<sub>i</sub> is the term of location i;  $R(L)_{ij}$  is the replication j within location i as random effect; Gk is the term of genotype k; GL<sub>ik</sub> is the interaction term of genotype k and location i; GR(L)ijk is the interaction term of genotype k and replication j within location i as random effect. Then for each of the nine years (2005-2013), a series of datasets were created by the elimination of one location at a time, i.e., each of the nine testing locations in that year. For the three seed traits, there were a total of 243 datasets for one location elimination (Supplemental Table 1). Similarly, a series of datasets were created by elimination of two or three locations, i.e., each of two or three location combinations among all locations in that year. For the three seed traits, there were a total of 972 and 2268 datasets for the elimination of two and three locations, respectively (Supplemental Table 1). For each of these datasets, the  $G \times L$  F-tests were conducted, and the genotype standard errors were estimated again, using the same linear model as above; the only difference being a reduced number of locations. Then the F-tests with p-values and standard errors could be compared as a measure of the impact of the location reduction. To decide which locations to eliminate from the RHQ tests for seed quality traits,  $G \times E$  effects in multiple location-year tests from 2005 through 2013 were analyzed using GGE biplot software<sup>4</sup> (Yan, 2001). The experimental years between 2005-2013 were artificially separated into six two-year periods, 2005-2006 and 2006-2007 for the testing cycle of 2005-2007, 2008-2009 and 2009-2010 for the testing cycle of 2008-2010, and 2011-2012, and 2012-2013 for the testing cycle of 2011-2013. Common genotypes in each of these periods were identified and described in Table 2. In GGE biplot analysis, G and  $G \times E$  were partitioned into the first principle component (PC1) and the second principle component (PC2) of singular values and eigenvectors. A polygon was drawn to contain all genotypes within it. A set of lines perpendicular to each side of the polygon divided the biplot into sectors with environments falling into these sectors. A 'winning' genotype could be viewed at each corner of the polygon which represented the genotype with best performance among the environments falling into that sector. In this way, a group of environments could be viewed in a sector with a 'winning' genotype at the corner of that sector. In GGE biplot, the genotypes ranking high for seed traits were distributed to the right side of the y-axis and the genotypes ranking high for stability were distributed near the x-axis.

The most representative testing locations were identified by the highest repeatability in grouping with other locations in two-year periods of the RHQ tests. The repeatability was calculated in the equation:

Repeatability = [(number of a location in the first year in grouping with other environments /total number of environments) + (number of a location in the second year in grouping with other locations /total number of environments)] / 2.

In the equation, the environment was defined by a location-year combination. For example, the combination of LUB-11 and LUB-12 was environment of Lubbock in 2011 and Lubbock in 2012, respectively.

Cycle of 2005-2007	Cycle of 2008-2010				
2005-2006	2006-2007	2008-2009	2009-2010		
PHY 72 Acala, PVP 20010015	PHY 72 Acala	PHY 72 Acala	PHY 72 Acala		
ST 4892BG/RR, PVP 20000253	ST 4892BG/RR	DP 555BG/RR PVP 200200047	DP 555BG/RR		
DP 555BG/RR	DP 555BG/RR	FM 9180B2F PVP 200800194	MD 25 (PI659508, Meredith and Nokes, 2011)		
FM 960B2R PVP 200500047	FM 960B2R	FM 1740 B2F PVP 200800163	FM 1845LLB2		
DPL 445BG/RRR PVP 200400265	DPL 143B2R PVP 20070011	DP 161B2RF			
DP 455BG/RR PVP 200500052	FM 9063B2F PVP 200700178	MD 25			
NM N1155					
FM 960B2R PVP 200500109					
Cycle of 2011-2013					
2011-2012	2012-2013				
PH 375WRF	PHY 375WRF				
FM 9058F PVP 200700206	FM 9058F				
DP 1032B2RF PVP 201000258	DP 1219B2RF PVP 201100260				
PHX 4912WRF	FM 2484B2RF PVP 201200291				
TAMCOT 73 (PI662044, Smith et al., 2011)	LA 17				
ST 4145LLB2					
MD 25-26ne (PI666044, Meredith, 2013)					

Table 2. Genotypes common in the consecutive years of the 2-year periods of RHQ tests from 2005 through 2013

#### **RESULTS AND DISCUSSION**

The effects of G ×L for seed quality traits were analyzed within each year during 2005 through 2013 (Table 3). Highly significant G × L interactions were identified in all cases except for N content in 2009. These results confirmed that multiple-location tests are required for evaluation of cotton seed quality traits in order to detect G × E interactions.

The appropriate reduction of testing locations in the RHQ tests was determined by the F-test and *P*values of the  $G \times L$  interactions with different numbers of locations omitted (<u>Supplemental Table 1</u>). Significant  $G \times L$  interactions were detected in most cases. However, when two or three locations were omitted with averages of the oil content, N content, and freegossypol, fewer  $G \times L$  interactions were detected with 7.3% and 9.1% non-significant incidences for two and three location omissions, respectively.

Table 3. Significance (≤*P*-values) of genotype × location interactions for seed quality traits from 2005 through 2013

Year	Oil content	N content	Free-gossypol
2005	0.001	0.001	0.001
2006	0.001	0.001	0.001
2007	0.001	0.001	0.001
2008	0.001	0.001	0.001
2009	0.001	0.232	0.001
2010	0.001	0.001	0.011
2011	0.001	0.001	0.001
2012	0.001	0.005	0.001
2013	0.001	0.001	0.001

When *P*-values of genotype × location interactions of free gossypol content were plotted against number of locations omitted in each year during 2005 through 2013, reduction of two to three locations dramatically affected the detection of  $G \times L$ interactions only in 2005 and 2010 whereas the increase of non-significant incidences of  $G \times L$ interactions with reductions of locations was minimum in other years (Fig 1). For nitrogen content, the reduction of two to three locations affected detection of  $G \times L$  interactions only in 2007 and 2012 while the influence was minimal in other years (Fig. 2). For oil content, the reduction of locations did not affect detection of  $G \times L$  interactions in most years except for 2005 (Fig. 3). These results suggest that two to three testing locations can be reduced in future RHQ tests for evaluation of seed quality traits without significant interference on  $G \times E$  analysis.

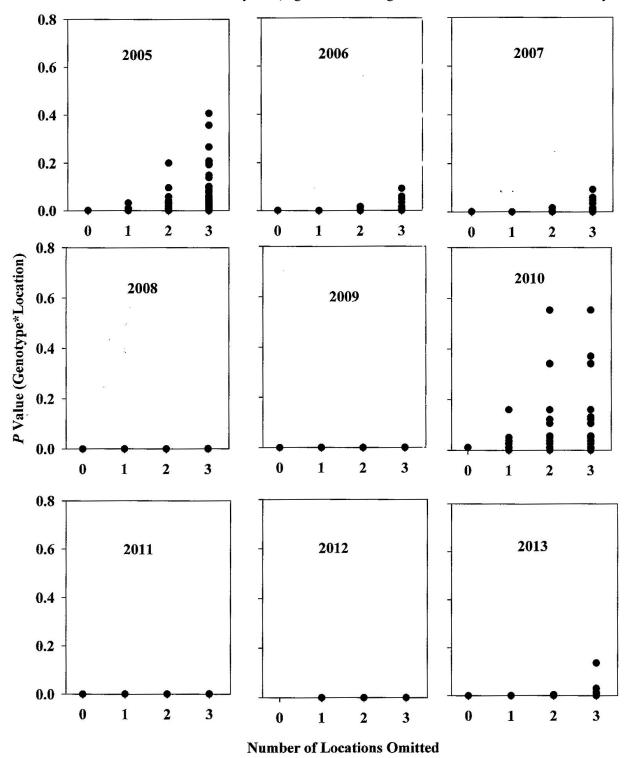
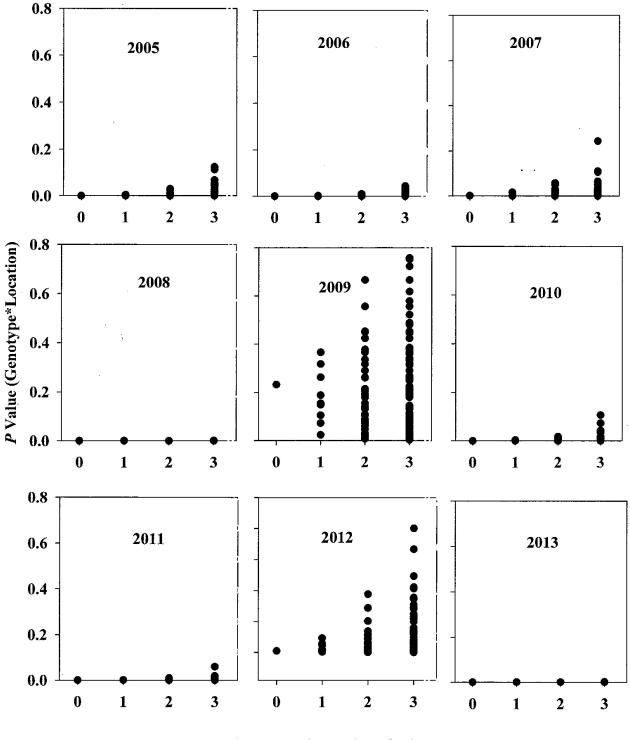
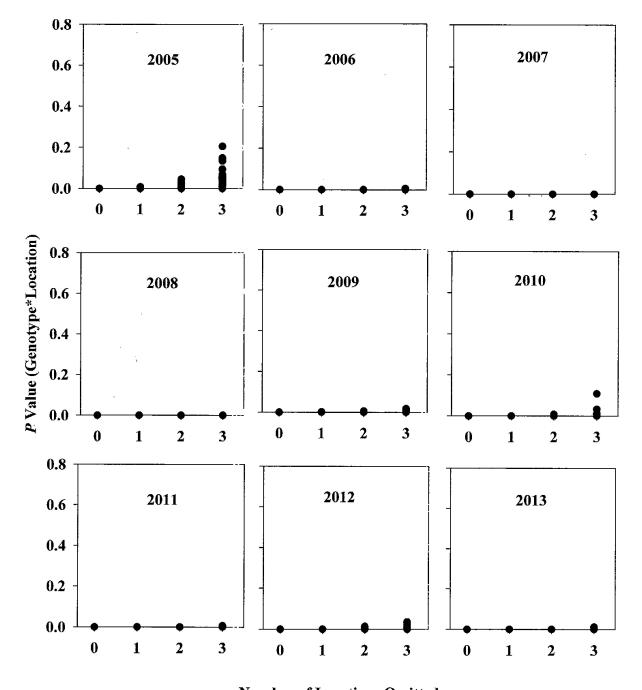


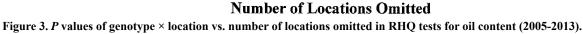
Figure 1. *P* values of genotype × location vs. number of locations omitted in RHQ tests of free gossypol (2005-2013).



Number of Locations Omitted

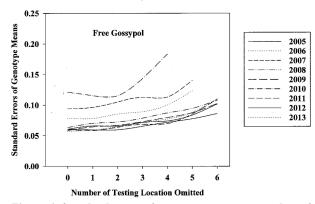
Figure 2. P values of genotype × location vs. number of locations omitted in RHQ tests for nitrogen content (2005-2013).





Significant  $G \times E$  interactions affect efficiency in selection and reduce repeatability in breeding. Therefore, the estimation of standard errors of the genotypic means is another critical factor when  $G \times$ E interactions are significant. In order to maintain the efficiency in breeding, reduction of testing locations is only feasible when there is no dramatic increase in standard errors of genotypic means. When the standard errors of genotypic means for the three seed traits was plotted against the number of locations omitted in each year from 2005 through 2013, reduction of locations up to two increased standard error about 10% of those with zero locations omitted (Fig. 4, 5, 6). Reduction of locations up to three increased standard errors 23 to 25% compared to the standard errors with zero locations omitted. These results suggest that two to three locations can be reduced from the future RHQ tests without serious influence on estimation of genotypic means. However, the control of accuracy in genotypic means could be largely empirical

and other factors such as sample size, techniques of measurements, and replicate number, etc., can also influence standard errors. These findings contrast with those reported by Bourland et al. (2016) for fiber quality and yield component traits using the same approach. They evaluated data from nine years and four Arkansas locations of six strain tests to determine if accurate data could be obtained from boll samples taken from fewer than all locations. F-tests indicated that over 90% of the incidence of  $G \times L$  interactions for yield were significant. Their results suggested that boll samples should be taken from all four locations of the tests in that study.



0.35 Nitrogen Content Standard Errors of Genotype Mean 0.30 2005 0.25 2006 2007 2008 0.20 2009 2010 0.15 2011 2012 2013 0.10 0.05 0 2 3 4 5 6 Number of Testing Location Omitted

Figure 5. Standard error of genotype means vs. number of locations omitted in RHQ tests for nitrogen content.

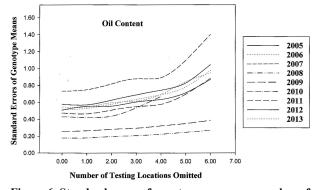


Figure 6. Standard error of genotype means vs. number of locations omitted in RHQ tests for oil content.

Figure 4. Standard error of genotype mean vs. number of locations omitted in RHQ tests for free-gossypol content.

Table 4. Grouping of locations for A content based on GGE biplot analysis of KHQ tests of 2003-2013	ble 4. Grouping of locations for N content based on GGE biplot analysis of RHQ tests of 2005-2013
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Years	Grouping	Locations <sup>a</sup>	Best performer
2005-2006	1	BEL-05, BEL-06, COL-06, FLO-05, FLO-06, KEI-05, KEI-06, LAS-06, LUB-05, LUB-06, POR-05, POR-06, STV06	DP 455BG/RR
	2	COL-05, LAS-05	DP 555BG/RR
2006-2007	1	BOS-07, LAS-06, LUB-06, POR-06	ST 4892RR
	2	BEL-06, BEL-07, COL-06, COL-07, LAS-07, LUB-07, POR07, STV-06	DP 555BG/RR
2008-2009	1	BEL-08, FLO-08, FLO-09, KEI-09, LAS-08, POR-08	PHY 72 Acala
	2	BOS-09, COL-08, COL-09, JAC-08, JAC-09, LUB-08, LUB-09, POR-09, STV-08, STV09	DP 555BG/RR
	3	BEL-09, BOS-08, KEI-08, LAS-09	FM 1740B2F
2009-2010	1	COL-09, FLO-10, KEI-09, KEI-10, LAS-09, STV-09	MD 25
	2	BEL-09, BOS-09, COL-10, FLO-09, POR-09	PHY 72 Acala
	3	BEL-10	DP 555BG/RR
	4	JAC-09	FM 1845LLB2
2011-2012	1	BEL-11, COL-12, KEI-12	MD 25-26ne
	2	BEL-12, COL-11, FLO-11, FLO-12, LAS-11, LUB-11, LUB-12, POR-11, POR-12, STV-12	DP 1032B2RF
	3	KEI-11, LAS-12	PHY 375WRF
2012-2013	1	COL-12, FLO-13, LAS-12, LAS-13, STV-12	DP 1219B2RF
	2	BEL-12, COL-13, FLO-12, LUB-12, LUB-13, POR-12, SAI-12, SAI-13, STV-13	PHY 375WRF
	3	KEI-12, KEI-13, POR-13	FM 2484B2F

<sup>a</sup> BEL, Belle Mina, AL; BOS, Bossier City, LA; COL, College Station, TX; FLO, Florence, SC; JAC, Jackson, TN; KEI, Keiser, AR; LAS, Las Cruces, NM; LUB, Lubbock, TX; POR, Portageville, MO; Saint Joseph, LA; STV, Stoneville, MS.

In order to decide which testing locations to eliminate in future RHQ tests, it would be ideal if mega-environments for seed quality traits could be identified. Seed N content in the RHQ tests from 2005 through 2013 were used to analyze relationships among testing locations using GGE biplot. To analyze  $G \times E$  interactions in multiple location-year tests, common genotypes in consecutive years were selected in the three three-year testing cycles (Table 2). Each of the three cycles was further divided into two two-year periods and the relationships among testing locations were analyzed in a total of six twoyear periods in 2005-2013 (Table 4).

In the analysis of relationships among testing locations in 2011-2012 and 2012-2013, there were five and four sectors in polygon views, respectively, with three groups of locations in each of the two twoyear periods (Fig. 7, 8). In 2011 and 2012, there were three groups of locations as Belle Mina-2011, College Station-2012, and Keiser-2012 with MD 25-26ne as the best performer; Keiser-2011 and Las Cruces-2012 with PHY 375WRF as the best performer; and Belle Mina-2012, College Station-2011, Florence-2011, Florence-2012, Las Cruces-2011, Lubbock-2011, Lubbock-2012, Portageville-2011, Portageville-2012, Saint Joseph-2012, and Stoneville-2012 with DP 1032B2RF as the best performer (Fig. 7). In 2012 and 2013, there were three groups of locations as College Station-2012, Florence-2013, Las Cruces-2012, Las Cruces-2013, and Stoneville-2012 with DP 1219B2RF as the best performer; Keiser-2012, Keiser-2013, Portageville-2013 with FM 2484B2F as the best performer; and Belle Mina-2012, College Station-2013, Florence-2012, Lubbock-2012, Lubbock-2013, Portageville-2012, Saint Joseph-2012, Saint Joseph-2013, and Stoneville-2013 with PHY 375WRF as the best performer (Fig. 8).

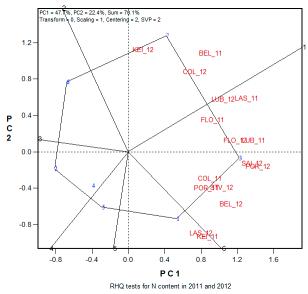


Figure 7. Relationships among testing locations in Regional High Quality tests of 2011 and 2012 for cotton seed N content. The Arabic numbers in blue color represent strains: 1, PHY 375WRF; 2, FM 9058F; 3, DP 1032B2RF; 4, PHX 4912WRF; 5, Tamcot 73; 6, ST 4145LLB2; 7, MD 25-26ne. Uppercase letters in red color represent testing locations as shown in Table 1. The letters with Arabic number 11 are environments of 2011 and those with number of 12 are environments of 2012. PC1 and PC2 are first and second principal component, respectively. Model parameters: Transform=0, no transformation; Scaling=1, the data were scaled by the standard deviation of genotype means within environments (Yan and Holland, 2010); centering=2, tester centered (G + G×E); SVP=2, tester metric (f=0).

2 waan awalaa	Years	Testing locations										
3-year cycles		BEL <sup>a</sup>	BOS	COL	FLO	JAC	KEI	LAS	LUB	POR	SAI	STV
2005-2007	2005-2006	0.800	<sup>b</sup>	0.433	0.800		0.800	0.433	0.800	0.800		0.800
	2006-2007	0.583	0.250	0.583				0.417	0.417	0.417		0.583
2008-2010	2008-2009	0.200	0.300	0.450	0.250	0.450	0.200	0.200	0.450	0.350		0.450
	2009-2010	0.154	0.308	0.346	0.345		0.385	0.385		0.308		0.385
2011-2013	2011-2012	0.367		0.367	0.600		0.100	0.333	0.600	0.600		0.600
	2012-2013	0.471		0.353	0.353		0.118	0.235	0.471	0.294	0.471	0.353
averages		0.43	0.29	0.42	0.47	0.45	0.32	0.33	0.55	0.46	0.47	0.53

Table 5. Frequency of testing locations in grouping with other locations in GGE biplot in the tests for N content of 2005-2013

<sup>a</sup> BEL, Belle Mina, AL; BOS, Bossier City, LA; COL, College Station, TX; FLO, Florence, SC; JAC, Jackson, TN; KEI, Keiser, AR; LAS, Las Cruces, NM; LUB, Lubbock, TX; POR, Portageville, MO; Saint Joseph, LA; STV, Stoneville, MS.

<sup>b</sup> Data are not available.

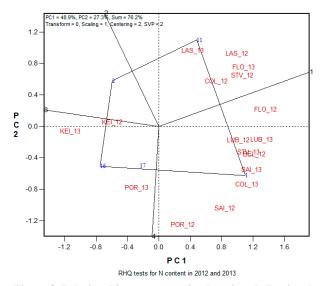


Figure 8. Relationships among testing locations in Regional High Quality tests of 2012 and 2013 for cotton seed N content. The Arabic numbers in blue color represent strains: 1, PHY 375WRF; 2, FM 9058F; 11, DP 1219B2RF; 16, FM 2484B2F; 17, LA 17. Uppercase letters in red color represent testing locations as shown in Table 1. The letters with Arabic number 12 are environments of 2012 and those with number of 13 are environments of 2013. PC1 and PC2 are first and second principal component, respectively. Model parameters: Transform=0, no transformation; Scaling=1, the data were scaled by the standard deviation of genotype means within environments (Yan and Holland, 2010); centering=2, tester centered (G + G×E); SVP=2, tester metric (f=0).

Although the purpose of a mega-environment analysis is to identify environments with repeatability, a lack of repeatability for the grouping of locations between the two consecutive years in those two-year trials was observed (Table 4). These results did not support the existence of possible mega-environments for seed traits. The failure to identify a mega-environment is understandable because the environmental factors between years such as weather conditions, insect and disease pressure, and other abiotic stresses at different locations would be unpredictable. A similar result was reported in a previous study of  $G \times E$  interactions on lint yield among testing locations in RHQ tests in 200-2009 when mega-environments were not observed (Zeng et al., 2014). Nevertheless, some testing locations are more representative than others with higher frequency in grouping with locations (Table 5). When averaged over the three testing cycles, Lubbock, TX, Stoneville, MS, Florence, SC, and Portageville, MO locations had the highest repeatability of 0.55, 0.53, 0.47, and 0.46, respectively, which compared

to the others ranged from 0.29 to 0.43. Jackson, TN and Saint Joseph, LA were excluded because of low participation in 2005-2013. The locations of Las Cruces, NM, Keiser, AR, and Bossier City, LA were most unique with the lowest repeatability, 0.33, 0.23, and 0.29, respectively. In GGE biplot analysis of oil content and free-gossypol content, the groupings were less obvious than those of N content when the environmental factor of 'year' was included in the GGE analysis, and thus, not feasible for analysis of mega-environments (data not shown).

In conclusion, reduction of two to three testing locations from the RHQ tests from 2005 through 2013 did not affect detection of  $G \times L$  interactions for seed traits. It was determined also that the testing locations could be reduced by three from the RHQ tests without dramatic sacrifice to accuracy for breeders. The testing locations of Lubbock, Stoneville, Florence, and Portageville were most representative in the RHQ tests for N content and these locations should remain in future multiple-location RHQ tests for seed traits.

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