

Analysis of the effect of GE interaction on the grain yield and its related traits in rain-fed Algerian durum wheat (*Triticum turgidum* L. var. *durum*) grown in contrasting environments



Análisis del efecto de la interacción GE sobre el rendimiento de grano y sus rasgos relacionados en trigo duro argelino de secano (*Triticum turgidum* L. var. *durum*) cultivado en ambientes contrastados

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ABSTRACT

Keywords: Environment relationship GE interaction Grain yield Stability Traits correlation	Selection for higher yield and wider adaptability are the most important tasks in crop breeding programs. (GE) interactions are commonly seen as one of the major barriers in plant breeding. The present work aims to assess the effects of GE interaction for the grain yield of 14 durum wheat varieties grown in rain-fed environments during 2014-2017 cropping seasons, and to analyze the relationships between 15 traits intra and inter-environments. Field trials were carried out in a randomized complete block design with four replicates. Grain yield data were analyzed using AMMI model. The combined analysis of variance showed that the effects of genotype, environment and their interactions were highly significant on the grain yield. Using CV and Pi index, GTA dur was the high yielding (32.5 q ha ⁻¹) and most stable variety across all the environments. Based on the inter-character correlation, the indirect selection of grain yield via the number of grains per m ² would be effective. Moreover, the inter-environment correlation of the studied variables confirms there was GE interaction and suggests that the best varieties should be chosen according to their specific adaptation. Cold environments differed from warm and moderate ones in the ranking of varieties. Indeed, Sétif site offers better possibilities for producing the Ofanto variety (39.9 q ha ⁻¹). Whereas, GTA dur and Simeto (30.9 q ha ⁻¹ and 29.7 q ha ⁻¹ , respectively) prove to be the most efficient in terms of grain yield at Oued Smar and Khemis Miliana sites together.
	RESUMEN
Palabras clave: Relación con el entorno Interacción GE Rendimiento de granos Estabilidad Correlación de rasgos	La selección para obtener un mayor rendimiento y una mayor adaptabilidad son las tareas más importantes en los programas de mejora de cultivos. Las interacciones GE son comúnmente consideradas como una de las principales barreras en el fitomejoramiento. El presente trabajo tiene como objetivo evaluar los efectos de la interacción GE para el rendimiento de grano de 14 variedades de trigo duro cultivadas en ambientes de secano durante las temporadas de cultivo 2014-2017, y analizar las relaciones entre 15 caracteres intra e interambientes. Los ensayos de campo de 14 variedades se organizaron en un diseño de bloques completos al azar con cuatro repeticiones. Los datos de rendimiento de grano se analizaron utilizando el modelo AMMI. El análisis combinado de la varianza mostró que el efecto del genotipo, el ambiente y sus interacciones fueron altamente significativos para el rendimiento de grano. Utilizando el CV y el índice Pi, GTA dur fue la variedad de mayor rendimiento (32,5 q ha ⁻¹) y más estable en todos los ambientes. Basándose en la correlación entre caracteres, la selección indirecta del rendimiento de grano a través del número de granos por m ² sería efectiva. Además, la correlación interambiente de las variables estudiadas, confirman la presencia de la interacción GE y sugiere que se deben elegir las mejores variedades de acuerdo con la adaptación específica. Los entornos fríos difirieron de los cálidos y moderados en la clasificación de las variedades. En efecto, el sitio Sétif ofrece mejores posibilidades para producir la variedad Ofanto (39,9 q ha ⁻¹). En cambio, GTA dur y Simeto (30,9 q ha ⁻¹ y 29,7 q ha ⁻¹ , respectivamente) demuestran ser los más eficientes en términos de rendimiento de grano en los sitios de Oued Smar y Khemis Miliana juntos.

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The production of durum wheat is highly limited by abiotic stress in semi-arid regions and biotic stress in sub-humid areas (Mansour and Hachicha 2014). Frost and desiccation damage the floral organs and developing grain, which cause yield loss (Zheng et al. 2015). Determining the traits related to grain yield (GY) is essential to improve reproductive efficiency (Mohammadi et al. 2012). In this context, variables such as grains per square meter, biomass, harvest index, and reduced plant height are positively associated with GY progress (Xiao et al. 2012). Cycle length, days to heading and anthesis can be increased when moving from the warmest and driest zones to the coldest and wettest ones, inversely to the duration of the grain filling period (Royo et al. 2014). In addition, GY genetic gains for CIMMYT material are mainly associated with flowering time, grain size and grain weight (Lopes et al. 2012; Aisawi et al. 2015).

Plant breeders are interested in the selection of varieties that have good performance in a range of environments, thus selection is complicated by the presence of Genotype by Environment interaction (GE) (Oral et al. 2018; Benkadja et al. 2022). In general, complex traits such as GY and its components show GE interaction, which may be expressed as heterogeneity in genetic variance among environments and/or in the ranking of individuals (Burgueño et al. 2008; Karimizadeh et al. 2016). Multi-environment trials (METs) are important for studying the stability and adaptation of cultivars for grain yield, as well as for predicting the performance of genotypes in different environments (Solonechnvi et al. 2015; Solonechnyi et al. 2018). In this way, both yield and stability should be considered simultaneously to reduce the effect of GE interaction (Bose et al. 2014; Mohammadi et al. 2018). Such selections are very difficult to be make. A stable genotype is defined as one having an unchanged performance irrespective of any variation in the test environments (Karimizadeh et al. 2012; Sabaghnia et al. 2012). In this context, the use of selection indices is recommended (Benmahammed et al. 2010). Several structures can be used for modeling the GE. In fact, models which separate genetic effects into common and specific components can be the superior form of increasing the accuracy of genotypic selection (Crossa et al. 2006; Burgueño et al. 2007). One of the efficient models is the additive main effects and multiplicative interaction (AMMI) (Gauch et al. 2008). It has been considered as an effective way in graphic analysis method that can be applied in breeding programs (Mladenov et al. 2012). This displays more informative results for responses of different genotypes over environments such as describing specific and nonspecific adaptability of genotypes and identification of the most discriminating environments (Kendal and Sener 2015), high yielding, stable genotypes, and interrelationships among environments (Mortazavian et al. 2014; Heidari et al. 2017; Ram et al. 2020). Solomon et al. (2008) applied AMMI analysis to determine the effect of GE interaction on durum wheat. Furthermore, one of the recommended strategies for assessing specific environmental challenges is genetic correlations between locations. Therefore, selection for a specific adaptation is a good for exploiting the interaction which can result in faster genetic progress than that of the wide adaptation (Karimizadeh et al. 2016). Indeed, the environments can be grouped into sub-regions based on the similarity of the genotype performances (Annicchiarico et al. 2006).

The fundamental step that needs to be taken in a crop improvement program is to evaluate and identify the best cultivars. This study aims to (i) analyze the performance of 14 Algerian durum wheat varieties in seven contrasted environments (ii) evaluate the intra-environment correlation between traits and (iii) to determine the best varieties according to specific or wide adaptation based on inter-environments correlation by trait.

MATERIALS AND METHODS

In this study, 14 varieties of durum wheat were evaluated (Table 1). The germplasm was supplied by the Technical Institute for Field Crops (ITGC, Algiers, Algeria). The experiment was carried out at three farms belonging to ITGC, at Sétif and Khemis Miliana during two seasons (2014-2015 and 2015-2016), and at Oued Smar during three seasons (2014-2015, 2015-2016, and 2016-2017), which represent contrasting environments. The Sétif experimental station (36°9'N and 5°21'E, altitude of 1,081 m) is located 5 km southwest of Sétif. It is characterized by a semi-arid climate with cold winters, irregular rainfall, spring frosts, and very high temperature at the end of the vegetation cycle (Mekhlouf et al. in Frih et al. 2021). Khemis Miliana station is situated on Bir Ould-Khelifa

(High Cheliff), 10 km south of Khemis Miliana (Ain Defla, 36°10'N, and 2°14'E, altitude of 300 m). It is characterized by a semi-arid climatic stage with irregular rainfall and

hot and drying winds. Oued Smar station is positioned on Beaulieu (Algiers, 36°43'N and 30°08'E, altitude of 24 m). It has a sub-humid climate with mild winter (Figure 1).

 Table 1. Name, pedigree, and cross origin of the 14 durum wheat genotypes studied.

Name	Pedigree	Cross origin
Bidi ₁₇	Landrace selection	INRA Algeria
Chen's	Ichwa'S'/Bit 'S'CD 26406	CIMMYT-ICARDA
GTA dur	Crane/4/PolonicumPI185309//T.glutin en/2* Tc60/3/Gll	CIMMYT-ICARDA
Hedba ₀₃	Landrace selection	INRA Algeria
MBB	Landrace selection	INRA Algeria
Simeto	Capeiti8/Valvona	Italy
Mexicali ₇₅	GdoVz 469/3/Jo"S"/61.130.Lds/Stk"S"CM470	CIMMYT
Vitron	Turkey77/3/Jori/Anhinga//Flamingo	CIMMYT
Waha	Plc/Ruff//Gta's/3/Rolette CM 17904	CIMMYT
Cirta	KB214-0KB-20KB-OKB-0KB-1KB-0KB	ITGC, ARS, Khroub, Algeria
Ofanto	Appulo/Adamello	Italy
Bousselam	Heider/Martes/Huevos de Oro. ICD-414	CIMMYT-ICARDA
Megress	Ofanto/Waha//MBB	ITGC, ARS, Setif, Algeria
Amar ₀₆	ID94.0920-C-OAP.7AP	CIMMYT-ICARDA



Figure 1. Geographical position of the experimental sites.

The rainfall recorded from September to June varies from 595.02 mm to 604.5 mm for the Oued Smar site, from 391.5 mm to 451 mm for Khemis Miliana, and from 339.85 mm to 340.26 mm for Sétif. The rainfall distribution presents a large monthly variability. The 2014-2015 campaign was marked by a water deficit from April to the harvesting time in all the experimental sites. Whereas the 2015-2016 campaign was characterized by a good distribution with significant amounts of rain. The temperature has a bimodal distribution, a low temperature during the vegetative stage from December to March in both sites (Oued Smar and Khemis Miliana) and from November to April in Sétif site and a high temperature at the beginning of the vegetation cycle and during the reproductive stage especially during the filling and ripening of grains.

Field trials done in seven environments (E1=Sétif 2014-2015, E2=Sétif 2015-2016, E3=Oued Smar 2014-2015, E4=Oued Smar 2015-2016, E5=Oued Smar 2016-2017, E6=Khemis Miliana 2014-2015 and E7=Khemis Miliana 2015-2016) were arranged in a randomized complete block design with four replicates. All environments were subject to the same conditions. Sowing of the 14 varieties was carried out by a plot seeder OYORD at the beginning of December using a density of 300 seeds per meter square in a micro-plot of 6 m² per variety and block. Fertilizer was applied at a rate of 100 kg ha⁻¹ of superphosphate (46%) before sowing and 75 kg ha⁻¹ of N during winter (Tillering to stem elongation). Several agro-morphological, physiological and biochemical parameters were analyzed such as Days to Heading DH, Plant height PH (cm), Awn Length AL (cm). Spike Length SL (cm), Number of Spikes per square meter (NSM²), Number of Grains per Spike (NGS), Number of Grains per square meter (NGM²), Thousand Kernel Weight TKW (g), Grain Yield GY (g ha⁻¹); Relative Water Content RWC (%); Chlorophyll Pigments Chla, Chlb, Chlab (µg g⁻¹ of fresh matter), and soluble sugars SS $(\mu g g^{-1} FM).$

AMMI was used as a model to test the GE interaction of the 14 varieties across seven environments. Boussellam, Waha, and MBB were used as standard controls. Data were subjected to ANOVA multivariate using CropStat 7.2 (2007) software. The significance of the differences between means was determined at P<0.05 using the least significant difference (LSD) test. The correlation coefficients between pairs of characters by environment and between pairs of environments for each character were calculated by the Spearman rank using Past software version 3.2.1.The degree of stability was tested by the Lin and Binns Genotypic Superiority Index using Equation (1):

$$Pi = \left[\sum (X_{ij} - M_j)^2\right] / 2n$$
 (1)

Where " X_{ij} " is the grain yield of genotype "i" in the environment "j". " M_j " is the yield of the best-performing genotype in the "j" environment. "n" is the number of environments. Stability can also be measured by the coefficient of phenotypic variation. The phenotypic coefficient of variation (CV) is obtained using Equation (2):

$$CV(\%) = 100 \left(\frac{\sqrt{s^2 i}}{x_i} \right)$$
 (2)

Where S^2i = Environmental variance, X_i = Performance mean of genotype "i" across all environments.

RESULTS AND DISCUSSION

Yield performance and stability analyses

Analysis of variance showed high significant differences for variety and environment effects as well as their interactions in terms of yield. Relative to the LSD value at the 5% threshold which is 5.4, the additive variety effect (P<0.01, MS=460.99) indicates that GTA dur, Simeto, Chen's, Vitron, Ammar₀₆, Ofanto and Megress showed the best grain yields with respective means of 32.5, 31.1, 30.3, 28.8, 28.8, 27.8 and 27.2 g ha⁻¹ (Table 2). However, according to the LSD value which is 1.4, E7, E2 and E4 are ranked as the most high-yielding environments (P<0.01, MS=6777.65) (Table 2). Multivariate analysis for site effect (P<0.001, MS=4361.63) showed that Setif is the most suitable in terms of yield (33.2 g ha⁻¹. Mean value of E1 and E2) compared to Oued Smar (25.5 g ha⁻¹. Mean value of E3, E4 and E5) and Khemis Miliana (21.2 g ha⁻¹. Mean value of E6 and E7) (Table 2).

Analysis of the genotype x environment interaction (P<0.01, MS=104.00) (Table 2) indicates that the best genotype varies depending on the environment. Indeed, GTA dur, and Simeto occupied the top of the ranking in three and two among the seven environments, respectively.

Variations in yield between environments explain the variation in national cereal production, which is generally attributed to climatic conditions. This wide variation makes it difficult to create new high-yielding varieties. This kind of varietal behavior, induced by the GE interaction, has been reported by Haddad et al. (2016). It makes choosing the best genotypes difficult due to the instability of performance. Selection must therefore be made on the basis of yield performance linked to adaptability across environments. In this context, the use of selection indices is recommended (Benmahammed et al. 2010). Based on Pi index, GTA dur and Simeto are selected as stable and highperformance varieties.

	E1	E2	E3	E4	E5	E6	E7	Xi	CV%	Pi
AM6	27.6 ^e	36.3°	25.5 ^d	38.6 ^d	21.8ª	7.6 ^c	44.5 ^b	28.8 ^a	42.8	44.6
B17	29.0 ^d	31.8 ^e	22.0 ^e	24.6 ^g	8.1 ^d	4.5 ^d	32.8 ^f	21.8 ^b	52.0	136.7
BOU	31.8°	33.2 ^e	20.0 ^f	26.9 ^g	14.8 ^c	7.3 ^c	41.2°	25.0 ^b	46.8	93.4
CHE	27.9 ^e	45.3 ^a	29.2°	39.9°	18.3 ^b	7.7°	43.8 ^b	30.3 ^a	46.0	33.6
CIR	30.4 ^d	36.2 ^d	26.9 ^d	30.6 ^f	16.3 ^c	4.4 ^d	39.3 ^d	26.3 ^b	46.1	71.3
GTA	37.0 ^b	35.9 ^d	36.3 ^a	51.3 ^a	19.6 ^a	7.1°	40.3 ^c	32.5 ^a	44.9	21.4
H3	22.0 ^g	26.6 ^f	18.4 ^f	21.6 ^h	7.2 ^e	2.9 ^d	22.6 ^h	17.3°	50.9	223.7
MBB	39.7 ^a	31.5 ^e	21.9 ^e	26.1 ^g	10.0 ^d	1.2 ^e	29.4 ^g	22.8 ^b	57.9	133.9
MEG	36.7 ^b	33.9 ^d	22.2 ^e	32.8 ^f	22.6 ^a	5.0 ^c	37.0 ^e	27.2 ^a	42.6	71.3
MEX	24.3 ^f	37.3°	25.6 ^d	34.5 ^e	16.0 ^c	11.9 ^a	37.9 ^d	26.8 ^b	38.6	69.9
OFA	40.5 ^a	39.3 ^b	24.2 ^e	33.4 ^e	17.4 ^b	8.0 ^b	32.3 ^f	27.8 ^a	43.0	69.1
SIM	33.2°	35.5 ^d	27.4°	41.6 ^c	19.9 ^a	7.6 ^c	52.3 ^a	31.1 ^a	46.9	26.4
VIT	30.3 ^d	36.7°	31.8 ^b	46.7 ^b	19.1 ^b	13.8ª	23.2 ^h	28.8 ^a	38.7	77.2
WAH	26.0 ^e	32.1 ^e	28.7°	35.1 ^e	16.4 ^c	8.9 ^b	18.2 ⁱ	23.6 ^b	39.9	138.0
X.j	31.2	35.1	25.7	34.5	16.2	7.0	35.3	26.4	42.8	86.5
LSD 5%				3.0				5.4		

Table 2. Yields means by environment, coefficient of variation CV and index Pi of the studied varieties.

MS (ENV)=6777.65**, MS (Var)=460.99**, MS (GE)=104.00**, Err=4.5. **very highly significant. E1=Sétif 2014-2015, E2=Sétif 2015-2016, E3=Oued Smar 2016-2017, E6=Khemis Miliana 2014-2015, E7=Khemis Miliana 2015-2016 GTA=Gaviota Durum, BOU=Boussellam, OFA=Ofanto, SIM=Simeto, H3=Hedba₀₃, CIR=Cirta, MEX=Mexicali, WAH=Waha, B17=Bidi₁₇, CHE=Chen's, AM6=Amar₀₆, MEG=Megress, MBB=Mohamed Ben Bachir, VIT=Vitron.

The grain yield gains induced by the selection of Simeto and GTA dur, relative to the average yield of the standard controls, vary from 11.15% in E2 to 74.64% in E4, for GTA dur and from 2.13% in E1 to 76.68% in E7, for Simeto. The results of the present study corroborate those of Bendjama and Solonechnyi (2018) who reported that the grain yield varies according to sites, years, genotypes, and their interaction, and the greatest variation is mostly induced by the site effect, followed by the site x years interaction effect.

A high value of CV (%) shows a high inter-environment variability, which affects the stability of varieties. The CV values vary from 38.6 to 57.9% (Table 2). Taking into

consideration the smallest coefficients of variation and the highest mean values of yield, the high-performing and stable varieties, which are selected are GTA dur, Ofanto, Mexicali, Amar₆, Megress and Vitron (Figure 2).

Inter-character, intra environment relationships

The study of the relationships between traits is necessary for breeders to identify the effect of traits, which can be easily measured in the growing stage (DH, PH, NSM², SL, AL, RWC, SS...etc.), inversely to the complex characters (NGS, GY, TKW...etc.) which are measured during harvest by destructive methods. Such characters can be used in the indirect selection of complex characters as highlighted by Salmi et al. (2019).

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Figure 2. Performance and stability of 14 varieties of durum wheat for yield based on the coefficient of variation. 1=GTA dur, 3=Ofanto, 7=Mexicali, 11=Amar₀₆, 12=Megress), 14=Vitron: efficient and stable varieties.

Analysis of the correlation between the measured traits (Table 3) indicates that the DH presents variable links, depending on the environment and the target character. Under environmental conditions, similar to Oued Smar and Khemis Miliana, a longue duration of heading value is not favorable for the achievement of a high grain yield, nor the NGS and NGM². However, it is suitable for making a high straw yield.

These results suggest that, when the conditions of the environment discriminate clearly between genotypes tested for the DH as shown in environments belonging to Oued Smar site, selection of early varieties generates more in terms of GY, but it is accompanied by a reduction in the PH and vice versa (Table 3). Similar results were reported in other studies (Gonzalaz-Ribot et al. 2017; Mohammadi 2019; Kumar et al. 2021). The relationship between DH and physiological traits (chlorophyll content and RWC) can be explained by the difference in expression between the late genotypes that express a higher chlorophyll content and RWC than the early ones. The inverse is true for the sugar content. The late cultivars characterized by a low GY should be more resilient than the early cultivars against environmental variability.

The grain yield is significantly and positively dependent on NGM², NGE, NSM², NGE, and NSM², but negative with PH. The link with the SL and AL as well as with the chlorophyll content, RWC, and SS is dependent on the environment and when it is significant, it is inconsistent. Kumar et al. (2021) reported a significant and positive correlation between GY and SL at early sowing. Optimizing the grain yield of wheat is the main issue for breeders worldwide. Understanding relationships between grain yield with morphological, physiological, and biochemical traits across different environmental conditions could help plant breeders to develop wheat cultivars with improved and stable grain yield. The relationship shown between GY and PH suggests that the selection of efficient genotypes is accompanied by a reduction in the PH. Mohammadi (2019) reported that the plant height needs to be at medium level, to obtain a good grain yield. Annicchiarico et al. (2005b) found that the GY was negatively correlated with the straw vield. And the semi-dwarf varieties were top-ranking in terms of yield. Whereas, Royo et al. (2014) found that the greater plant height contributes to the good yield making under dry Mediterranean rainfed conditions. The differences SL and AL in addition to the physiological and biochemical traits do not seem to be decisive in

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	Н	GY	NSM ²	NGS	TKW	NGM	Hd	SL	AL	CHLa	CHLb	CHLab	RWC	SS
Ξ	1.000	-0.187	-0.121	-0.219	0.059	-0.292	0.296	0.111	0.211	0.760**	-0.156	0.117	0.419	-0.392
E 2	1.000	-0.454	-0.473	-0.321	0.137	-0.467	0.667**	0.329	0.314	0.680**	-0.640*	0.627*	-0.282	-0.107
E3	1.000	-0.581*	-0.513	-0.670**	0.239	-0.702**	0.497	0.490	0.329	-0.125	0.054	-0.187	-0.186	-0.385
E4	1.000	-0.806**	-0.342	-0.301	0.424	-0.415	0.837**	0.316	0.362	0.051	0.232	0.127	0.681**	-0.674**
E5	1.000	-0.825**	-0.659*	-0.787**	-0.083	-0.806**	0.856**	0.690**	0.582*	0.084	0.323	0.204	0.668**	-0.846**
E6	1.000	-0.785**	-0.826**	-0.590*	-0.263	-0.833**	0.370	-0.633*	-0.669**	0.108	-0.083	0.003	-0.154	-0.238
E7	1.000	-0.091	-0.577*	0.194	0.698**	-0.343	0.559*	-0.305	-0.397	0.181	0.200	0.243	-0.210	0.359
	Gγ	HQ	NSM ²	GS	TKW	NGM	Н	SL	AL	CHLa	CHLb	CHLab	RWC	SS
Ξ	1.000	-0.187	0.493	0.585*	0.559*	0.872**	-0.438	0.012	0.125	-0.013	0.405	-0.006	-0.136	0.413
E 2	1.000	-0.454	0.462	0.521	0.399	0.585*	-0.734**	-0.666**	-0.514	-0.650*	0.629*	-0.595*	-0.320	0.256
Е3	1.000	-0.581*	0.778**	0.537*	-0.309	0.769**	-0.218	-0.290	-0.294	0.372	0.014	0.266	0.184	0.606*
E4	1.000	-0.806**	0.253	0.640*	-0.485	0.524	-0.710**	-0.250	-0.338	-0.311	-0.554*	-0.428	-0.580*	0.697**
E5	1.000	-0.825**	0.886**	0.702**	0.209	0.940**	-0.881**	-0.606*	-0.629*	-0.258	-0.433	-0.364	-0.381	0.684**
E 6	1.000	-0.785**	0.875**	0.505	0.332	0.855**	-0.072	0.703**	0.696**	-0.163	-0.046	-0.179	0.274	0.191
E7	1.000	-0.091	0.506	0.540*	0.356	0.593*	-0.354	-0.386	-0.063	0.200	-0.412	-0.332	0.236	-0.021
	NSM ²	GΥ	DPV	NGS	TKW	NGM	НЧ	SL	AL	CHLa	CHLb	CHLab	RWC	SS
Ξ	1.000	0.493	-0.121	-0.267	0.297	0.412	-0.074	0.114	0.086	-0.127	0.401	0.070	-0.349	0.275
E2	1.000	0.462	-0.473	0.359	-0.385	0.820**	-0.501	-0.510	-0.524	-0.559*	0.577*	-0.502	-0.440	-0.210
B	1.000	0.778**	-0.513	0.400	-0.409	0.770**	-0.286	-0.435	-0.421	0.500	0.193	0.406	0.017	0.584*
E4	1.000	0.253	-0.342	0.102	-0.458	0.875**	-0.600*	0.071	-0.048	-0.190	-0.321	-0.254	-0.244	0.417
E5	1.000	0.886**	-0.659*	0.486	0.150	0.932**	-0.831**	-0.342	-0.417	-0.354	-0.484	-0.448	-0.261	0.502
E6	1.000	0.875**	-0.826**	0.474	0.264	0.932**	-0.026	0.638*	0.678**	-0.201	0.126	0.036	0.273	0.018
E7	1.000	0.506	-0.577*	0.396	-0.363	0.914**	-0.650*	0.064	0.154	060.0	-0.113	-0.081	0.265	-0.150
DH=Da grains sugars.	ys to Headi oer meter s E1=Sétif 2	ng, GY=Grai quare, PH=F 014-2015, E	n Yield, NSN Plant Height, 2=Sétif 2015	1 ² =Number o AL=Awn Ler -2016, E3=C	of Spikes pund Ingth, SL=S Dued Smar	er square m spike Length r 2014-2015	eter, NGS= n, CHLa, CI i, E4=Oued	Number of HLb, CHLat Smar 2019	Grains per { 5-Chlorophy 5-2016, E5=	Spike, TKW- Il Pigments Oued Smar	Thousanc RWC=Re 2016-201	l Kernel We lative Wate 7, E6=Kher	ight, NGMi r Content, mis Miliana	=Number of SS=Soluble 2014-2015,
E/=Kn(emis Millané	a 2015-2016.	r 5% =0.532	, r 1%=0.661										

Analysis of the effect of GE interaction on the grain yield and its related traits in rain-fed Algerian durum wheat (Triticum turgidum L. var. durum) grown in contrasting environments

grain yield making. Therefore, the selection on the basis of these characteristics appears secondary. For the same grain yield, the choice would be made on the basis of these characteristics, and in favor of a long spike and awns and high chlorophyll content and SS. A lot of studies highlighted that using physiological traits as a complement to agronomic traits, may help in identifying selectable features that accelerate breeding for yield potential and performance under drought (Fischer 2007; Araus et al. 2008; Cattivelli et al. 2008; Mohammadi 2019). Using an indirect selection of traits, associated with greater grain yield having lower GxE interaction would make results more reliable and repeatable in most of the environments. In fact, among these traits (NGM², NSM², NGS, NGM², TKW, PH, CHL, AL, SL, RWC, and SS) only NGM² followed by NSM² can be used at an early stage to discriminate between the evaluated genotypes. Therefore, when variability exists for both variables, the selection is recommended for NGM² or NSM² and within varieties having similar NGM² or NSM². We select for other characteristics including NGS, followed by TKW and PH. Our results are in agreement with those of Laala et al. (2021), who reported a highly positive correlation between the number of spikes and the grain yield. In fact, the indirect selection via the number of spikes was the most efficient. Similar results of the relationship between grain yield and its components have been reported in previous studies (Moragues et al. 2006; Royo et al. 2006). They demonstrated that durum wheat yield grown under warm and dry Mediterranean environments is obtained mainly by the number of spikes per unit area. However, in cool and wet environments. kernel weight influences mostly the grain production. In addition, a high grain number conducive for a high yield can be achieved by the production of many small spikes (Bustos et al. 2013). Wheat yield can be affected mostly by the number of grains per m² (Slafer et al. 2014).

The NSM² is an essential determinant of NGM², on which GY is widely dependent. Consequently, this parameter could be used as a criterion in breeding plants. Slafer et al. (2014) confirmed our conclusion: they declared that large changes in NGM² are mainly related to NSM². The varieties with tall straw, which were most often late at heading, have long awns and spikes, as well as a high content of CHLa and low in CHLb and SS. Overall, these results corroborate those reported by Mansouri et al.

(2018). The days to heading had significant correlations and negative signs with the weight of 1,000 grains and the grain yield. Fellahi et al. (2017) noted that the yield is more linked to the number of spikes, and remains independent of the weight of 1,000 grains which did not show a significant link with the number of spikes. Mohammadi et al. (2016) reported that higher grain yields associated with a higher grain weight resulting from early flowering and selection on the basis of the weight of 1,000 grains can further improve the grain yield.

Relations inter environments

Analysis of the correlation coefficients of ranks interenvironments indicates that the order of classification of genotypes for DH remains relatively unchanged, especially in the E2 to E7 environments (Table 4). The ranking of this variable in the E1 environment (Sétif) is not significantly linked to other environments. GY also has a significant correlation between E3 to E6 environments, inversely to other environments (E1, E2, and E7), where the varieties ranking is different. The inter-environment rank coefficients of all varieties were most often significant for PH and NGM². Whereas the inter-environment rank coefficients of NSM², NGS, TKW, RWC (data not shown), and SS (data not shown) were not significant. This means that the classification changes from one environment to another.

GE Interaction often affects the yield of cultivars. This led to the evaluation of genotypes across a large number of sites to estimate yield potential and to analyze and understand the interaction pattern, with a possibility to group locations into homogeneous recommended domains sharing the same genotypes (Annicchiarico et al. 2006).

The results induced by the relation inter environments analysis for the GY trait suggest the absence of the GE interaction between the varieties in four environments (E3, E4, E5, and E6). This means that the order of the yield performance changes a little relatively in these environments, which do not show a specific behavior. This is in contrast to environments E1 and E2 (Site of Sétif), which rank the varieties differently for grain yield performance. These results propose that the Oued Smar and Khemis Miliana sites do not require repeated trials

Р	E1	E2	E3	E4	E5	E6	E7
DH							
E1		0.009	0.046	0.160	0.205	0.089	0.141
E2	0.666**		0.003	0.006	0.001	0.002	0.005
E3	0.540*	0.727**		0.001	0.000	0.000	0.001
E4	0.397	0.694**	0.768**		0.000	0.000	0.000
E5	0.361	0.766**	0.851**	0.877**		0.000	0.000
E6	0.471	0.762**	0.845**	0.890**	0.943**		0.001
E7	0.414	0.699**	0.801**	0.816**	0.863**	0.777**	
GY	E1	E2	E3	E4	E5	E6	E7
NSM ²							
E1		0.051	0.007	0.095	0.284	-0.227	0.143
E2	0.026		0.587*	0.626*	0.499	0.678**	0.407
E3	-0.077	0.218		0.903**	0.574*	0.581*	0.209
E4	0.064	0.330	0.420		0.758**	0.662**	0.380
E5	0.121	0.389	0.473	0.305		0.383	0.468
E6	-0.393	0.517	0.464	0.349	0.301		0.026
E7	-0.099	0.218	0.508	0.385	0.433	0.481	
NGM ²	E1	E2	E3	E4	E5	E6	E7
PH							
E1		0.296	0.209	0.386	0.431	0.031	0.373
E2	0.616*		0.393	0.165	0.623*	0.582*	0.227
E3	0.452	0.620*		0.532*	0.441	0.741**	0.614*
E4	0.704**	0.679**	0.539*		0.378	0.497	0.579*
E5	0.541*	0.807**	0.504	0.837**		0.416	0.539*
E6	0.411	0.587*	0.860**	0.477	0.525*		0.359
E7	0.769**	0.867**	0.709**	0.713**	0.739**	0.671**	

Table 4. Coefficients of inter-environment rank correlation by character.

*Significant at 1%, **Significant at 5%. *P*=Probability, DH=Days to Heading, GY=Grain Yield, NSM²=Number of Spikes per square meter, NGS=Number of Grains per Spike, TKW=Thousand Kernel Weight, NGM²=Number of grains per meter square, PH=Plant Height, AL=Awn Length, SL=Spike Length, CHLa, CHLb, CHLab=Chlorophyll Pigments, RWC=Relative Water Content, SS=Soluble sugars. E1=Sétif 2014-2015, E2=Sétif 2015-2016, E3=Oued Smar 2014-2015, E4=Oued Smar 2015-2016, E5=Oued Smar 2016-2017, E6=Khemis Miliana 2014-2015, E7=Khemis Miliana 2015-2016.

over time to identify the best performing varieties, while the Sétif site requires repeated trials over time. The data obtained for the DH suggest there is GE interaction between E1 and other environments (E2 to E7). These results indicate also that Khemis Miliana site predicts relatively well the order of varieties for the earliness at the Oued Smar site, but it is not the case for the Sétif site. Therefore, determination of the precocity can be made either on Oued Smar or Khemis Miliana site, but not necessarily on both sites at the same time. On the other hand, the order of varieties for this trait requires a specific determination on Sétif site. The divergence that appeared between environments for GY and DH traits can be explained by the fact that E1 (Sétif) is characterized by a harsh climate, especially in terms of temperatures, this makes it different from the other sites. The analysis of inter-environment rank coefficients of NSM², NGS, TKW, RWC, and SS variables was not significant, suggesting the presence of GE interaction. While the information provided by an environment for PH and NGM² can be exploited for the needs of other environments. Complex traits such as GY and its

Based on the correlation coefficients of DH, GY, PH, and NGM², the seven environments can be classified into two sets: the site of Sétif alone and the sites of Oued Smar and Khemis Miliana together. Inside each one, the GE interaction is relatively less notable for the four characters mentioned above. Therefore, a variety of recommendations should be made based on the specific adaptation to these two sets of environments separately. Our findings corroborate partially those defined by Annicchiarico et al. (2005a) using other approaches. GTA dur and Simeto (30.9 g ha⁻¹ and 29.7 g ha⁻¹, respectively) were the top-yielding over the subregion including Oued Smar and Khemis Miliani sites. Whereas, Ofanto (39.9 g ha⁻¹) was the top-yielding over the sub-region that includes Sétif site. Understanding the genetic basis of adaptation and its environmental reasons is important to understand GE interaction, to evaluate the relationship between phenotypic and genotypic values and to improve selection of performing and stable genotypes (Joshi et al. 2010). Our findings agree with those of Karimizadeh et al. (2016), who reported that selection for specific adaptation is recommended because it can speed up the genetic progress better than selecting for wide adaptation in case of different mega-environment. In this case, a genotype has the ability to better exploit the agro ecology of the specific environment (Gauch 2013). Annicchiarico et al. (2005a) reported that specific adaptation could provide 2 to 7% of gains better than wide adaptation, in stressful sub-regions.

CONCLUSIONS

Multivariate analysis showed high significant differences for variety and environment effects as well as their interactions. In terms of yield. GTA dur is selected as stable and suitable variety using both stability index (CV and Pi) and Sétif is the most high-yielding site. The study of the relationships between traits is necessary in order to identify the effect of non-destructive traits, which can be easily measured before the harvest compared to other characters, which are measured during harvest using destructive methods. Such characters can be used in the indirect selection of complex characters of the grain yield. Therefore, the number of spikes can be

used to discriminate between the genotypes evaluated for the grain yield followed by other characteristics such as number of grains per spike, the weight of thousand grains and the plant height. Selection based on biochemical and physiological characters seems to be secondary. Inter-environment correlation showed that the studied varieties were classified in the same way over almost all the environments for both traits of the plant height followed by the days to heading which are less affected by the environment. Whereas, the ranking of varieties is different for the grain yield due to the complexity of this trait. This suggests there is GE interaction. Therefore, varieties should be recommended according to the specific adaptation generating two sets environments. Therefore, Ofanto is the best cultivar in the two environments belonging to Sétif site, and GTA dur is the most efficient in terms of grain yield followed by Simeto in five environments of both sites (Oued Smar and Khemis Miliana). These results could be useful in a breeding program.

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REFERENCES

Aisawi KAB, Reynolds MP, Singh RP and Foulkes MJ (2015) The physiological basis of the genetic progress in yield potential of CIMMYT spring wheat cultivars from 1966 to 2009. Crop Science 55: 1749–1764. https://doi.org/10.2135/cropsci2014.09.0601

Annicchiarico P, Bellah F and Chiari T (2005a) Defining subregions and estimating benefits for a specific-adaptation strategy by breeding programs: A case study. Crop Science 45: 1741–1749. https://doi.org/10.2135/cropsci2004.0524

Annicchiarico P, Abdellaoui Z, Kelkouli M and Zerargui H (2005b) Grain yield, straw yield and economic value of tall and semi-dwarf durum wheat cultivars in Algeria. Journal of Agricultural Science 143: 57-64. https://doi.org/10.1017/S0021859605004855

Annicchiarico P, Bellah F and Chiari T (2006) Repeatable genotype x location interaction and its exploitation by conventional and GIS-based cultivar recommendation for durum wheat in Algeria. European Journal of Agronomy 24: 70–81. https://doi.org/10.1016/j.eja.2005.05.003

Araus JL, Slafer GA, Royo C and Serret MD (2008) Breeding for yield potential and stress adaptation in cereals. Critical Reviews in Plant Sciences 27: 377–412. https://doi.org/10.1080/07352680802467736

Bendjama A and Solonechnyi P (2018) GGE biplot analysis of yield performance and stability of durum wheat genotypes in multi

environment trials in Algeria. Plant Breeding and Seed Production 114:8-18.

Benkadja S, Maamri K, Guendouz A et al (2022) Stability analysis for grain yield and thousand kernel weight of durum wheat (*Triticum durum* Desf.) genotypes growing under semi-arid conditions. Agricultural Science and Technology 14:34-43.

Benmahammed A, Nouar H, Haddad L et al (2010) Analyse de la stabilité des performances de rendement du blé dur (*Triticum durum* Desf.) sous conditions semi-arides. Biotechnologie Agronomie Société et Environnement 14(1):177-186.

Bose LK, Jambhulkar NN, Pande K and Singh ON (2014) Use of AMMI and other tability statistics in the simultaneous selection of rice genotypes for yield and stability under direct seeded conditions. Chilean Journal of Agricultural Research 74 (1):3–9.

Burgueño J, Crossa J, Cornelius PL et al (2007) Modeling additive × environment and additive × additive × environment using genetic covariances of relatives of wheat genotypes. Crop Science 43:311–320.

Burgueño J, Crossa J, Cornelius PL and Yang RC (2008) Using factor analytic models for joining environments and genotypes without crossover genotype × environment interaction. Crop Science 48:1291–1305. https://doi.org/10.2135/cropsci2007.11.0632

Bustos DV, Hasan AK, Reynolds MP and Calderini DF (2013) Combining high grain number and weight through a DH-population to improve grain yield potential of wheat in high-yielding environments. Field Crops Research 145:106–115. https://doi.org/10.1016/j.fcr.2013.01.015

Cattivelli L, Rizza F, Badeck FW et al (2008) Drought tolerance improvement in crop plants: an integrated view from breeding to genomics. Field Crops Research 105:1–2. http://doi.org/10.1016/j.fcr.2007.07.004

Crossa J, Burgueño J, Cornelius PL et al (2006) Modeling genotype × environment interaction using additive genetic covariances of relatives for predicting breeding values of wheat genotypes. Crop Science 46:1722–1733. https://doi.org/10.2135/cropsci2005.11-0427

Joshi AK, Crossa J, Arun B et al (2010) Genotype × environment interaction for zinc and iron concentration of wheat grain in eastern Gangetic Plains of India. Field Crop Research 116:268–277.

Fellahi Z, Hannachi A, Ferras K et al (2017) Analysis of the phenotypic variability of twenty f3 biparental populations of bread wheat (*Triticum aestivum* L.) evaluated under semi-arid environment. Journal of Fundamental and Applied Sciences 9:102–118. https:// doi.org/10.4314/jfas.v9i1.8

Fischer RA (2007) Understanding the physiological basis of yield potential in wheat. Journal of Agricultural Science 145:99-113. http://doi.org/10.1017/S0021859607006843

Frih B, Oulmi A and Guendouz A (2021) Study of drought tolerance of some durum wheat (*Triticum durum* Desf.) genotypes growing under semi-arid conditions in Algeria. International Journal of Bio-resource and Stress Management 12(2):137-141. https://doi.org/10.23910/1.2021.2171a

Gauch H, Piepho HP and Annicchiarico P (2008) Statistical analysis of yield trials by AMMI and GGE: Further considerations. Crop Science 48 (3):866–889.

Gauch HG (2013) A simple protocol for AMMI analysis of yield trials. Crop Science 53:1860–1869

Gonzalaz-Ribot G, Opazo M, Silva P and Acevedo E (2017) Traits explaining Durum wheat (*Triticum turgidum*. L. spp. *durum*) yield in dry chilean mediterranean environments. Frontiers in Plant Science 8:1-11. http://doi.org/10.3389/fpls.2017.01781

Haddad L, Bouzerzour H, Benmahammed A et al (2016) Analysis of genotype × environment interaction for grain yield in early and late sowing date on Durum wheat (*Triticum durum* Desf.) Genotypes. Jordan Journal of Biological Sciences 9(3): 139- 146.

Heidari SH, Azizinezhad R and Haghparast (2017) Determination of yield stability in durum wheat genotypes under rainfed and supplementary irrigation conditions. Journal of Argricultural Science and Technology 19: 1355-1368. https://jast.modares.ac.ir/article-23-10653-en.pdf

Karimizadeh R, Mohammadi M, Sabaghnia N et al (2012) Univariate stability analysis methods for determining genotype × environment interaction of Durum wheat grain yield. African Journal of Biotechnology 11:2563–2573.

Karimizadeh R, Asghari A, Chinipardaz R et al (2016) Application of GGE biplot analysis to evaluate grain yield stability of rainfed spring durum wheat genotypes and test locations by climatic factors in Iran. Crop Breeding Journal 6 (2):41-49.

Kendal E and Sener O (2015) Examination of genotype×environment interactions by GGE biplot analysis in spring Durum wheat, Indian Journal of Genetic and plant breeding 75 (3): 341-348.

Kumar A, Chand P, Thapa RS and Singh T (2021) Assessment of Genetic diversity and character associations for yield and its traits in bread wheat (*Triticum aestivum* L.). Indian Journal of Agricultural Research 55 (6):695-701. http://doi.org/10.18805/JJARe.A-5686

Laala Z, Oulmi A, Fellahi ZEA and Benmahammed A (2021) Studies on the nature of relationships between grain yield and yieldrelated traits in Durum wheat (*Triticum durum* Desf.) populations. Revista Facultad Nacional Agronomia Medellín 74 (3):9631-9642. https://doi.org/10.15446/rfnam.v74n3.92488

Lopes MS, Reynolds MP, Manes Y et al (2012) Genetic yield gains and changes in associated traits of CIMMYT spring bread wheat in a "Historic" set representing 30 years of breeding. Crop Science 52: 1123–1131. https://doi.org/10.2135/cropsci2011.09.0467

Mladenov V, Banjac M and Milosevic M (2012) Evaluation of yield and seed requirements stability of bread wheat (*Triticum aestivum* L.) via AMMI model. Turkish Journal of Field Crops 17 (2): 203-207.

Mansour M and Hachicha M (2014) The vulnerability of Tunisian agriculture to climate change. In: Ahmad P and Rasool S. (Eds.). emerging technologies and management of crop stress tolerance - a sustainable approach. Volume 2. Elsevier. San Diego, CA, USA. 514 p.

Mansouri A, Oudjehih B, Benbelkacem A et al (2018) Variation and Relationships among Agronomic Traits in Durum Wheat [*Triticum turgidum* (L.) Thell. ssp. *turgidum* conv. *durum* (Desf.) MacKey] under South Mediterranean Growth Conditions: Stepwise and Path Analysis. International Journal of Agronomy 2018:1-11. https://doi. org/10.1155/2018/8191749

Mohammadi R, Amri A, Agricultural D and Box PO (2012) Analysis of genotype environment interaction in rain-fed Durum wheat of Iran using GGE-biplot and non-parametric methods. Canadian Journal of Plant Science 92(4):757-770. https://doi.org/10.4141/CJPS2011-133

Mohammadi R, Farshadfar E and Amri A (2016) Path analysis of genotype × environment interactions in rainfed Durum wheat. Plant Production Science 19:43–50. https://doi.org/10.1080/13439 43X.2015.1128100

Mohammadi RM, Armion E, Zadhasan MM et al (2018) The use of AMMI model for interpreting genotype × environment interaction in durum wheat. Experimental Agriculture 54 (5):670–683. https://doi.org/10.1017/S0014479717000308

Mohammadi R (2019) Genotype by yield*trait biplot for genotype evaluation and trait profiles in durum wheat. Cereal Research Communications 47 (3):541-551. http://doi.org/10.1556/0806.47.2019.32

Moragues M, Garcia del Moral LF, Moralejo M, Royo C (2006) Yield formation strategies of durum wheat landraces with distinct pattern of dispersal within the Mediterranean basin: I. Yield components. Field Crops Research 95:194–205.

Mortazavian SMM, Nikkhah HR, Hassani FA et al (2014) GGE Biplot and AMMI Analysis of yield performance of barley genotypes across different environments in Iran. Journal of Argricultural Science and Technology 16:609-622. https://jast.modares.ac.ir/article-23-1496-en.pdf

Oral E, Kendal E and Dogan Y (2018) Selection the best barley genotypes to multi and special environments by AMMI and GGE biplot models. Fresenius Environmental Bulletin 27:5179-5187.

Slafer GA, Savin R and Sadras VO (2014) Coarse and fine regulation of wheat yield components in response to genotype and environment. Field Crops Research 157:71-83. https://doi.org/10.1016/j.fcr.2013.12.004

Ram K, Munjal R, Kesh H et al (2020) AMMI and GGE biplot analysis for yield stability of wheat genotypes under drought and high temperature stress. International Journal of Current Microbiology and Applied Sciences 9:377–389.

Royo C, Villegas D, Rharrabti Y et al (2006) Grain growth and yield formation of durum wheat grown at contrasting latitudes and water regimes in a Mediterranean environment. Cereal Research Communications 34:1021–1028-

Royo C, Nazco R and Villegas D (2014) The climate of the zone of

origin of Mediterranean durum wheat (*Triticum durum* Desf.) landraces affects their agronomic performance. Genetic Resources and Crop Evolution 61:1345–1358. http://doi.org/10.1007/s10722-014-0116-3

Sabaghnia N, Karimizadeh R and Mohammadi M (2012) The use of corrected and uncorrected nonparametric stability measurements in durum wheat multi-environmental trials. Spanish Journal of Agricultural Research 10:722–730.

Salmi M, Benmahammed A, Benderradji L et al (2019) Generation means analysis of physiological and agronomical targeted traits in durum wheat (*Triticum durum* Desf.) cross. Revista Facultad Nacional Agronomia Medellín 72 (3):8971-8981. https://doi.org/10.15446/rfnam.v72n3.77410

Solomon KF, Smit HA, Malan E et al (2008) Parametric model based assessment of genotype × environment interactions for grain yield in durum wheat under irrigation. International Journal of Plant Production 2 (1):23-26.

Solonechnyi P, Vasko N, Naumov A et al (2015) GGE biplot analysis of genotype by environment interaction of spring barley varieties. Zemdirbyste-Agriculture 102:431-436. http://doi.org/10.13080/z-a.2015.102.055

Solonechnyi P, Kozachenko M, Vasko et al (2018) AMMI and GGE biplot analysis of yield performance of spring barley (*Hordeum vulgare* L.) varieties in multi environment trials. Agriculture and Forestry 64: 121–132. https://doi.org/10.17707/agricultforest.64.1.15

Xiao YG, Qian ZG, Wu K et al (2012) Genetic gains in grain yield and physiological traits of winter wheat in Shandong Province, China, from 1969 to 2006. Crop Science 52:44–56. https://doi.org/10.2135/cropsci2011.05.0246

Zheng B, Chapman SC, Christopher JT et al (2015) Frost trends and their estimated impact on yield in the Australian wheatbelt. Journal of Experimental Botany 66:3611–3623. https://doi.org/10.1093/jxb/erv163