ORIGINAL ARTICLE

Genetic enhancement of onion germplasm through population improvement

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Received: 8 October 2021 / Accepted: 28 January 2022 / Published online: 23 February 2022 © Indian Society for Plant Physiology 2022

Abstract Sustainable onion breeding relies on genetic values of the germplasm. Descriptive statistics for the breeding values for economical traits revealed the maximum variability among the 62 onion genotypes studied. The principle components among the genotypes contributed to 75.44% of the variance and their association was differed significantly ($\alpha = 0.05$). Analysis of genetic diversity among the germplasm population aided for the classification of genotypes and identification of core collections with possible utility for specific breeding strategies. The sixty-two onion genotypes studied were grouped in to five clusters, cluster-I included nine genotypes, cluster-II had thirteen genotypes, cluster-III contained fourteen genotypes, cluster-IV consisted of twelve and cluster-V contained fourteen genotypes. The inter-cluster distance (56.54) was found maximum between cluster-I and -III. The cluster means reveals the cluster-I is the best for bulb weight, equatorial and polar diameter, stem girth and number of leaves, cluster-IV for plant height. The genotypes differed significantly for the bulb yield and their yield attributes. The ample variability and diversity among the genotype population could aid for genetic improvement of qualitative and quantitative traits of onion germplasm.

Keywords Genotypes · Genetic diversity · Onion · Variability · Principal components

Introduction

Onion (Allium cepa L.) is an antiquity spice; it is grown commercially as vegetable across the climates of temperate, sub-tropical and tropical regions of the world (Brewster, 2018; Corgan & Kedar, 2018; Currah & Proctor, 1990). The economic importance of the crop originated due to its nutritional properties (D C Manjunathagowda et al., 2019a) and health benefits (Benkeblia, 2005). Despite the significance of onion, the research on genetic improvement has significantly paused than the other major vegetable crops(McCallum et al., 2008), this could be due to the poor genetic resource representation among the germplasm (Cross, 1998; Kik, 2006; Manjunathagowda et al., 2021), hence there is a need to understand the population structure among the germplasm for better maintenance and exploitation of genotypes (McCallum et al., 2008). The crop improvement has related to the degree of its genetic variability existed among the genotypes (Mallor et al., 2014; Mallor Giménez et al., 2011; Manjunathagowda & Anjanappa, 2021a, 2021b), the efficiency of selection in the genotypes depends on the knowledge of genetic variability. The variety or hybrid breeding needs the knowledge about genetic variability and diversity, the genetic distinctionis the base for plant breeding and it makes ease to select the genotypes based on distinctiveness for varietal or hybrid development (Dangi et al., 2018; Manjunathagowda & Anjanappa, 2020; Manjunathagowda & Selvakumar, 2021). The management and evaluations of germplasm lead to the exploitation and transfer of useful genes into the desirable phenotypes.

Numerous methods are known for estimation of variance divergence among the genotypes through multivariate tools, among them the principal component (PC) analysis has the potential tool to transform possibly correlated



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variables into limited variables called principal components (Ziegel, 2002). It could reveal the dimensional data patterns in the identification of key components of variation in a data set. Each PC reveals the data properties and interpreted independently since PCs are orthogonal and independent of each other (Mohammadi & Prasanna, 2003). PCA could reveal the decisive traits among genotypes differentiation, it enables breeders to understand the impact and associations among different traits of the genotypes (Kovacic, 1994). The principal component analysis (PCA) was carried out in the Turkish onion of 96 genotypes for 31 quantitative traits revealed the maximum Eigen value and total variance in PC-I followed by PC-II and PC-III. The first nine principal components (PCs) with high Eigen values (> 1) contributed 71.84% of the variability. The bulb weight and pseudostem diameter traits were contributed more positively with PC1 (Hanci & Gokce, 2015). The principal components (PC1 to PC5) accounted of 78.5% total variation among the genotypes. The squared cosine value of bulb yield traits was with positive direction and plant growth traits were in the negative direction (Dangi et al., 2018).

During the process of breeding, the identification and selection of genetically varied psarents have an immense significance for genetic improvement through recombination breeding (Arunahalam, 1981). Among genotypes the diversity reveals the closeness; the better assortment of genotypes helps the plant breeder for strategic breeding of hybridization (Manjunathagowda et al., 2021). The economic traits in bulb yield in onion are polygenic character influenced by the environmental factors, hence understanding of genetic variability and magnitude of association of bulb yield with yielding traits are highly essential for genetic improvement of bulb yield through selection of better genotypes (Dod & Sharma, 2017). Therefore the study on strategic improvement of onions aided with variance, divergence and principal components analysis carried out for a better understanding of genetic variability and diversity among the genotypes.

Material and methods

The trial was conducted in late-*kharif* 2019 at ICAR-Directorate of Onion and Garlic Research, Rajgurunagar, Pune, Maharashtra, India. The experimental layout as followed as Randomized Complete Block Design (RCBD) with three replications. The plots of size of 1.5 m length and 1.2 m width with the spacing of 15 cm \times 10 cm apart between plants was followed. Crop production and management practices were performed with the guidelines set by the ICAR-Directorate of Onion and Garlic Research, Rajgurunar, Pune, Maharashtra, India (DOGR, 2020). The 45 days old seedling was transplanted in the experimental field, the observations on plant height (cm), number of leaves, stem girth (cm), equatorial diameter (cm), polar diameter (cm) and bulb weight (g) recorded from randomly selected five plants per treatment during full crop growth at 75 days after transplanting, which were subjected for statistical analysis. The performance of 62 genotypes for plant growth and bulb yield traits was assayed and resulted presented in Supplementary Table 1, majority of the genotypes were evaluated for male fertility maintainer and Chandregowda Manjurestorer lines (Dalasanuru nathagowda & Selvakumar, 2021). The data were subjected to One-Way-ANOVA per the procedure of the Turkeys test by using MiniTab software (MiniTab, 2020). Genetic variability assays was carried out by OPSTAT open access software (Sheoran et al. 1998). The k-mean analysis of divergence and principle component analysis was performed with the help of XLSTAT Software (XLSTAT, 2020).

Result and discussion

The performance of genotypes for plant growth, bulb yield and its attributing traits was differed significantly (Supplementary Table 1). Genotypes namely DOGR-006 and DOGR-132 differed significantly with the maximum bulb weight, equatorial bulb diameter, stem girth and number of leaves per plant. Similarly, the performance onion genotypes was differed significantly for their plant growth and bulbing traits in kharif season(D C Manjunathagowda et al., 2019b). The significant difference could be due to the response of genotypes to the photosynthetic activity and mobility of availed nutrient within the plant, as this helped in better accumulation of photosynthesis in the bulbs (Sharma, 2009). The significant difference for bulb yield and their attributing traits could be influenced by the genotypic characters, which cause for increased bulb morphological traits, as these traits influenced the bulb weight, and ultimately contributed to bulb yield (Hosamani et al., 2010; Umamaheswarappa et al., 2015).

The descriptive statistics of growth and bulbing traits were revealed in Table 1.The results revealed the considerable variability existed among the genotypes. The highest variability was noted for plant height followed by the number of leaves, stem girth, equatorial and polar diameter, and bulb weight respectively. The principal components of individual values contributed to the cent percentage to cumulative variation among the genotypes (Table 1). Low and high estimates of coefficient reveal the low and high genetic variability among the genotypes, assortment helps to the effective selection of suitable genotypes for breeding (Gurjar & Singhania, 2006; D.

Table 1 Descriptive statistics for plant growth and bulb traits of onion genotypes

Variables	Min	Max	Mean	SD	Eigen value	Variability (%)	Cumulative Variability (%)
Plant height	36.67	65.50	50.06	5.26	3.66	61.02	61.02
No. leaves	6.83	19.50	10.88	1.84	0.87	14.42	75.44
Stem girth	8.65	23.07	14.61	2.94	0.71	11.77	87.21
Equatorial diameter	32.53	56.98	47.49	5.08	0.37	6.15	93.36
Polar diameter	31.77	49.06	40.69	3.65	0.23	3.92	97.28
Bulb weight	29.50	104.39	61.73	18.31	0.16	2.72	100.00

Table 2Assessment of geneticvariables among the genotypesof onion

Traits	GCV (%)	PCV (%)	Heritability	GA	GAM
Plant height	9.21	12.71	52.44	6.88	13.74
No. Leaves	15.54	18.69	69.11	2.91	26.61
Stem girth	18.95	22.37	71.76	4.85	33.07
Equatorial diameter	9.50	12.75	55.53	6.93	14.59
Polar diameter	7.95	10.77	54.45	4.92	12.08
Bulb weight	28.91	31.19	85.90	34.06	55.19

Table 3 Pearson correlation co-efficient among the onion genotypes for bulb weight and their attributing traits

Traits	Plant height	No. Leaves	Stem girth	Equatorial diameter	Polar diameter	Bulb weight
Plant height	1.000					
No. leaves	0.321*	1.000				
Stem girth	0.509**	0.565**	1.000			
Equatorial diameter	0.307*	0.482**	0.569**	1.000		
Polar diameter	0.389**	0.330**	0.502**	0.771**	1.000	
Bulb weight	0.379**	0.548**	0.599**	0.822**	0.721**	1.000

* Significant

** Highly significant

Manjunathagowda et al., 2021), the higher variation indicates maximum variation for different growth, yield and quality parameters. These traits afford sufficient opportunity for proficient selection and genetic improvement of genotypes (Ananthan & Balakrishnamoorthy, 2007; Haydar et al., 2007; Hosamani et al., 2010; Ram et al., 2011).

Varied significant variance aid for the exploitation of breeding potential among genotypes. The variance of traits were varied from 7.94 to 28.90 per cent for GCV, 10.41 to 31.19 per cent for PCV, heritability 52.44 to 85.89 per cent and 13.73 to 55.19 per cent for genetic advance mean, respectively (Table 2), the variance ranged from medium to high. The bulb weight acknowledge for high variance for the studied genetic variables (Table 2). These traits were for genotypic and phenotypic variation leads to subsistence variation of traits, and medium to high co-efficient heritability and GAM could contribute for additive-geneaction indicates selection either by mass selection or simple selection could be suitable for genetic improvement of onion genotypes (Dhotre et al., 2010; Manjunathagowda & Anjanappa, 2021b).

The Pearson's coefficients of correlation among the traits results revealed that, the plant growth and bulb yielding traits were highly significantly and positively correlated to bulb weight (Table 3). The studied traits are significantly influenced to increase bulb weight. The correlation studies among the twelve cultivars of onion revealed a significant positive association of bulb yield (Rashid, 2006). Plant height, number of leaves per plant and stem girth were primary yield determining traits in onion, thus these traits can be improved through direct selection (Raghuwanshi et al., 2016). Bulb yield has a

Table 4Bulb weight pathmatrics attributed by plantgrowth and bulb traits (Residualare 0.26494)

Plant Physiol. Rep. (January-March	2022)	27(1):73-80
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Traits	Plant height	No. Leaves	Stem girth	Equatorial diameter	Polar diameter
Plant height	0.043	0.054	0.041	0.161	0.080
No. leaves	0.014	0.168	0.046	0.252	0.068
Stem girth	0.022	0.095	0.081	0.298	0.103
Equatorial diameter	0.013	0.081	0.046	0.524	0.158
Polar diameter	0.017	0.055	0.041	0.403	0.205

Bold indicates direct effects of traits

Biplot (axes F1 and F2: 75.44 %)

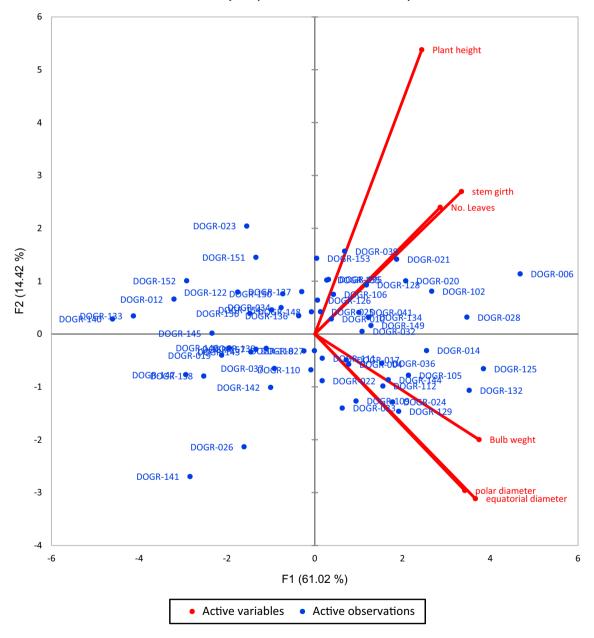


Fig. 1 Principal component biplot of variables among the onion genotypes

Table 5 Eigenvectors for theprincipal components

@	PC1	PC2	PC3	PC4	PC5	PC6
Plant height	0.30	0.67	-0.57	-0.33	-0.12	0.11
No. leaves	0.36	0.30	0.73	-0.41	0.29	0.01
Stem girth	0.42	0.34	0.11	0.83	0.04	-0.04
Equatorial diameter	0.46	-0.39	-0.01	-0.02	-0.21	0.77
Polar diameter	0.43	-0.37	-0.36	-0.06	0.70	-0.25
Bulb weight	0.47	-0.25	0.05	-0.14	-0.61	-0.57

Table 6 Clustering of oniongenotypes through K-meananalysis

Cluster	Cluster-I	Cluster-II	Cluster-III	Cluster-II	Cluster-V
Genotypes	9	13	14	12	14
Minimum distance to Centroid	4.981	2.654	4.624	3.588	2.597
Average distance to Centroid	8.281	5.735	7.747	7.160	6.810
Maximum distance to Centroid	14.936	11.261	15.150	13.881	12.139
	DOGR-004	DOGR-010	DOGR-012	DOGR-017	DOGR-026
	DOGR-006	DOGR-025	DOGR-019	DOGR-020	DOGR-037
Genotypes	DOGR-014	DOGR-027	DOGR-023	DOGR-021	DOGR-111
	DOGR-024	DOGR-033	DOGR-122	DOGR-022	DOGR-126
	DOGR-028	DOGR-034	DOGR-133	DOGR-032	DOGR-127
	DOGR-102	DOGR-039	DOGR-140	DOGR-036	DOGR-130
	DOGR-125	DOGR-106	DOGR-145	DOGR-041	DOGR-138
	DOGR-129	DOGR-110	DOGR-147	DOGR-105	DOGR-141
	DOGR-132	DOGR-118	DOGR-150	DOGR-109	DOGR-142
		DOGR-134	DOGR-154	DOGR-112	DOGR-143
		DOGR-135	DOGR-151	DOGR-128	DOGR-146
		DOGR-136	DOGR-152	DOGR-144	DOGR-148
		DOGR-149	DOGR-155		DOGR-153
			DOGR-156		DOGR-157

positive significant correlation with equatorial and polar bulb diameter (Patil et al., 1990), equatorial bulb diameter (Dhotre et al., 2010), and the number of leaves (Mahanthesh et al., 2008; Mohanty, 2001; Pal & Singh, 1988).The results divulged the presence of significant genetic variability among the onion genotypes, which can be exploited for genetic improvement of onion.

The path matrics of bulb weight revealed that, the trait was influenced by directly with positive effects viaplant height, number of leaves, neck girth, polar diameter and equatorial diameter (Table 4). Thus, it could aid for onion genetic improvement by direct mass selection of studied traits could be more effective. The path analysis results revealed desirable positive direct effect on bulb yield via plant height, number of leaves, neck girth, polar diameter and equatorial diameters (Dhotre et al., 2010; Manjunathagowda & Anjanappa, 2021a; Raghuwanshi et al., 2016).

The high positive component values in the principal component (Fig. 1) were noted for bulb weight, equatorial diameter, polar diameter, stem girth, number of leaves and plant height in PC1. The plant height, stem girth and the number of leaves in PC2, and the number of leaves in PC3, stem girth in PC4, polar diameter in PC5 and equatorial diameter in PC6 (Table 5). The principal component coefficients with equal or more than 0.3 were taken to finalize the limiting factor for the coefficients of the vector (Raji, 2002), the traits with higher positive, or negative value revealed the existence of more genetic diversity (Hanci & Gokce, 2015). The PCAof 96 Turkish onion genotypes for 31 quantitative traits revealed the maximum Eigen value with total variance in PC-I, which was followed by PC-II and PC-III. The nine PCs contributed 71.84% of the variability(high Eigen values > 1), the bulb weight and pseudostem diameter traits were contributed more positively with PC1 (Hanci & Gokce, 2015).

Table 7Distances between the
class centroids based onEuclidian method as groped
based on minimum distance

@	Cluster-I	Cluster-II	Cluster-III	Cluster-II	Cluster-V
Cluster-I	0				
Cluster-II	32.21	0			
Cluster-III	56.54	24.68	0		
Cluster-IV	18.76	13.64	38.18	0	
Cluster-V	42.64	11.39	14.41	24.33	0

Table 8 Relative contribution of trait means in the clusters of all the genotypes

Cluster	Plant height	No. Leaves	Stem Girth	Equatorial Diameter	Polar Diameter	Bulb Weight	Sum of Weights	Within-Class Variance
I	51.93	12.57	18.41	53.78	44.42	93.28	9.00	87.59
Π	52.08	10.74	15.14	47.83	41.31	62.00	13.00	41.29
III	47.71	9.99	13.14	41.42	36.61	39.14	14.00	75.35
IV	52.63	11.74	15.11	50.77	43.22	75.13	12.00	64.70
v	47.12	10.10	12.73	46.41	39.61	52.31	14.00	57.95

However, in our study high Eigen values less than one. The principal components (PC1 to PC5) accounted of 78.5% total variation among the genotypes. The squared cosine value of bulb yield traits was with positive direction and plant growth traits were in the negative direction (Dangi et al., 2018).

The PCA simplified the composite data into principal components with a smaller number of variables through the transformation of correlated variables, the first principal component (PC1) reported the highest variability in the data as regarded by subsequent principal components (Leilah & Al-Khateeb, 2005). The results of the study revealed the identification of genetic variability among the onion genotypes based on these traits, which could be accurate for genetic improvement of onion.

The sixty-two onion genotypes were grouped in to five clusters presented in Table 6, cluster-I included nine genotypes, cluster-II had thirteen genotypes, cluster-III contained fourteen genotypes, cluster-IV consisted of twelve and cluster-V contained fourteen genotypes. The inter-cluster distance (56.54) was found maximum between cluster-I and -III (Table 7). The cluster means revealed the cluster-I have the best for bulb weight, equatorial and polar diameter, stem girth and number of leaves, cluster-IV for plant height, and the mean contribution of all traits studied are presented in the Table 8.Genetic diversity has necessarily assembled the genotypes based on the mean similarity, it could diversify goals of plant breeding, and hence the selection of genotypes from the cluster-I and III was most appropriate for hybridization breeding program for better exploitation of heterosis. The assortment of genetically assorted parents in breeding is of immense importance for successful recombination and is vital for breeding (Mohanty, 2001; Patil et al., 1990), the highest diversity showed its greatest potential for improving qualitative and quantitative traits (Singh et al., 2013).

Conclusion

Among the genotypes, the DOGR-006 and DOGR-132 differed significantly for growth and yield, agronomic performance was found to be superior to the other genotypes. The genotypes divulged considerable variability, the high positive component values in the principal components were attributed to the precise selection of genotypes. The significant correlation for growth and bulbing traits in the onion genotypesis attributed to breeding and genetic improvement of onion. The inter-cluster distance was found maximum between cluster-I and –III, hence selecting parents from these groups is appropriate for heterosis breeding of onion for the development of hybrids.

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s40502-022-00646-z.

Acknowledgements Author acknowledge to Major Singh, Janhavi V, Kuldip for extending the research support.

Declarations

Conflict of interest All authors declare that they have no conflict of interest.

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