Original Research Article

Multivariate Analysis Through Principal Components for Yield Attributing Traits in Indigenous Moringa (*Moringa oleifera* L.) Germplasm Lines

Abstract:

The present investigation entitled was carried out at the Department of Vegetable Crops, Horticultural College and Research Institute (HC&RI), Tamil Nadu Agricultural University, Periyakulam during from 2016 -2017. With twenty genotypes in order to study the genetic diversity for different yield attributing characters of moringa by principal component analysis. In this study, out of twelve principal components, only five components exhibited eigenvalue and showed about 99.54% variability among the traits within the axes exhibited great influence on the phenotype of genotypes. The PC1 accounted for the highest variability (62.20%), followed by 28.86% (PC5), 6.25% (PC10), 1.01% (PC7) and 0.75% (PC4). Thus The results of the Principal Component Analysis revealed a wide range of genetic variability among the exists in this moringa genotype accessions.

Key words: Moringa, (*Moringa oleifera* L.), Genotypes or Accessions, PCA, Variability, Traits analysis, EigenValues

Comment [S1]: This title is not clear to me. I would suggest (Multivariate Analysis for Yield Traits in Indigenous Moringa (Moringa oleifera L.) Germplasm Lines)

Comment [S2]: Remove

Comment [S3]: This statement is confusing. I would advise it should be revised to: (To study the genetic diversity in different yield traits in Moringa, twenty accessions were investigated by Principal Component Analysis)

Comment [S4]: This statement is hard to read. I would suggest (In this study, out of twelve principal components, five components exhibited eigenvalue and revealed about 99.54% variability among the traits)

Comment [S5]: This statement should be revised in this form (The PC1 accounted for the highest variability (62.20%), followed by PC5 (28.86%), (PC10) (6.25%), PC7 (1.01%) and PC4 (0.75%).

Comment [S6]: Remove

Comment [S7]: Genotype or accessions

Comment [S8]: Keyword should be one word

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Introduction:

Moringa (Moringa oleifera L.), belonging to the family Moringaceae, is a highly useful vegetable crop and native of India. In India, it is grown all over the subcontinent for its tender pods and also for its leaves and flowers. The Plants have always been vital for mankind irrespective of the era and area, all over the globe since the beginning of life. Popularly known as the"Drumstick" tree, horseradish tree, or Ben tree, M. oleifera is a deciduous-to-evergreen shrub or small tree with a height of 5 to 10 m (Morton, 1991). Unfortunately, limited work studies have been carried out done on the understanding of its detailed germplasm characterization. Detailed studies on the distribution and genetic variability of moringa species are limited. However substantial variations in quantitatively inherited traits have been documented in the natural population from India. In order To do carry out breeding for to increase the yield, genetic variability must be initially considered is the prerequisite since it is the source of variation and raw material for yield improvement. work. Assessment of genetic variability is also needed for efficient parent selection in a breeding program (Rahman et al., 2011), long term selection gain and exploitation of heterosis(Rahman et al., 2012). Moreover, the evaluation of genetic diversity is important to know the source of genes for a particular trait within the available germplasm (Tomooka,1991).(N.Tomooka,1991). Principal Component Analysis (PCA) involves a mathematical procedure that transforms several possibly a number of (possibly) correlated variables into a (smaller) number of uncorrelated variables called Principal Components (C Chatfield and Collis, 1980). PCA is an important statistical method through which we can easily identify important polygenic characters which are of great importance in a plant breeding programme. PCA provides an idea for on how to reduce a complex data set to a lower dimension to reveal the sometimes hidden, simplified structures that often underlie it. The eigenvalue of a particular Principal Component depicts the amount of variation present in traits and is explained by that Principal Component which is very useful for the further breeding programme.

Materials and Methods:

This present investigation was carried out to know the variability through principal component analysis in Moringa (*Moringa oleifera* L.) germplasms cultivated in Telangana State

Comment [S10]: Add a comma

Comment [S11]: Remove

Comment [S12]: There should be space after the full stop, before the word "unfortunately"

Comment [S13]: Space before the word "Moreover"

Comment [S14]: Space before the word "Principal"

Comment [S15]: Capitalize the first words of Principal Component Analysis since it is an acronym of PCA

Comment [S16]: Remove

Comment [S17]: Space before PCA

at the Department of Vegetable Crops, Horticultural College and Research Institute (HC&RI), Tamil Nadu Agricultural University, Periyakulam (PKM) during from 2016 -2017 Twenty moringa accessions were collected from different regions of Telangana and the details of the plant accessions investigated materials used in this the present study are listed in Table 1.

Table 1: Table .1. List of Moringa accessions employed in this study

	Accessions			
S/No.		Traits	Location	Latitude & Longitude
1.	MO 1	Long poded perennial type	Warangal, Warangal	18 ⁰ 0 38.60N, 79 ⁰ 36'0 .10 E
2.	MO 2	Long poded perennial type	Malyal, Warangal	18 ⁰ 21' 48.80 N, 80 ⁰ 18' 23.66 E
3.	MO 3	Medium poded perennial type	Ghanpur, Warangal	E 17 ⁰ 49' 58.89 N, 78 ⁰ 59' 57.35 E
4.	MO 4	Short poded perennial type	Regonda, Warangal	E 18 ⁰ 23' 77.70 N, 79 ⁰ 77' 50.80 E
5.	MO 5	Long podedperennial type	Jagithyala, Karimnagar	E 18 ^o 46'0.66 N, 78 ^o 54'42 .83 E
6.	MO 6	Short poded perennial type	Peddapally, Karimnagar	18 ⁰ 37' 24.72 N, 79 ⁰ 22' 47.59 E
7.	MO 7	Short poded perennial type	Armor, Nizamabad	E 18 ⁰ 48' 37.14 N, 78 ⁰ 17' 7.00 E
8.	MO 8	Short poded perennial type	Nandipeta, Nizamabad	18 ⁰ 52' 34.06 N, 78 ⁰ 31' 14.68 E
9.	MO 9	MediumPoded perennial type	Rudrur, Nizamabad	E 18 ⁰ 34' 45.48 N, 77 ⁰ 52' 31.27 E
10.	MO 10	Short poded perennial type	Satyanarayanapuram,Nizamabad	E 18 ⁰ 32' 40.61 N, 77 ⁰ 53' 31.39 E
11.	MO 11	Medium poded perennial type	Basara, Nirmal	E 18 ⁰ 52' 40.63 N, 77 ⁰ 56' 57.01 E
12.	MO 12	Short poded perennial type	Mudhol, Nirmal	E 18 ⁰ 98' 26.81 N, 77 ⁰ 92' 05.10 E
13.	MO 13	Short poded perennial type	Ichoda, Adilabad	E 19 ⁰ 26' 1.02 N, 78 ⁰ 27' 14.82 E
14.	MO 14	Short poded perennial type	Adilabad, Adilabad	19 ⁰ 38' 53.14 N, 78 ⁰ 31' 14.68 E
15.	MO 15	Medium poded perennial type	Amaravathi, Manchiriyal	18 ⁰ 54' 15.05 N, 79 ⁰ 28' 58.30 E
16.	MO 16	Short poded perennial type	Doragaripalli, Manchiriyal	E 18 ⁰ 53' 59.5 N, 79 ⁰ 27' 41.2 E
17.	MO 17	Medium poded perennial type	Kyathanpalli, Manchiriyal	18 ⁰ 55'18.8 N, 79 ⁰ 28' 13.4 E
18.	MO 18	Short poded perennial type	Suryapeta, Nalgonda	17 ^o 14' 8.70 N, 79 ^o 36' 34.07 E

Comment [S18]: This statement is too wordy and needs revision. A portion of this statement could be put as a prose in the abstract, which depicts the aim of the study.

Comment [S19]: Space before the word "Twenty"

Comment [S20]: Be consistent with your choice of words; you either stick to "genotypes which is found in the abstract or be consistent with the use of "accessions"

Comment [S21]: Are you sticking with accessions?

19.	MO 19	Medium poded perennial type	Gollapally, Nalgonda	17 ⁰ 31' 23.59 N, 80 ⁰ 52' 19.91 E
20.	MO 20	Short poded	Narayanapuram,Nalgonda	17 ⁰ 10' 36.74 N, 80 ⁰ 52' 19.91
		perennial type		E /

Twenty The moringa genotypes were evaluated by using IPGRI minimal descriptors. The recommended agronomic practices were followed. Observations were recorded for 12 morphological characters. Principal Component Analysis (PCA) is an important multivariate method in modern data analysis because it is a simple, a non-parametric method for extracting relevant information from confusing data sets and it was applied for the assessment of genetic diversity within moringa genotypes. Data were recorded on ten different traits *viz.* plant height stem girth (cm), leaf length (cm), number of leaves per rachis, length of leaf rachis, number of flowers per inflorescence, length of the pod (cm), pod girth (cm), pod weight (g), number of pods per plant, number of seeds per pod, yield per plant (kg). The data on yield traits were statistically analyzed based on the basis of a randomized complete block design. The PCA analysis reduces the dimensions of a multivariate data to a few principal axes, generates an eigenvector for each axis and produces component scores for the characters (Massay, 1965; Jolliffie, 1986). [W. F. Massay, 1965), (I.T. Jolliffie, 1986).]

Results and Discussion:

Twenty accessions of moringa collected from various parts of Telangana were evaluated for different morphological and biochemical traits. Observations on morphological, characters *viz.*, plant height (cm), stem girth(cm), leaf length (cm), number of leaves per rachis, length of leaf rachis, number of flowers per inflorescence, length of the pod (cm), pod girth (cm), pod weight (g), number of pods per plant, number of seeds per pod, yield per plant(kg) and yield per plot.

The accessions exhibited wide variability for morphological characters such as tree shape, tree nature, the colour of bark, young shoot colour, foliage density, nature of branchlets, branch lets, leaflet shape, leaflet apex, the colour of calyx and pod maturity. Four morphological descriptors *viz.*, duration of plant, type of planting material, the shape of corolla and shape of calyx did not reveal any variation among the 20genotypes. The traits that were showing variations revealed that most of the accessions possessed phenotypic variation among them.

Comment [S22]: Genotypes or

Comment [S23]: Space before the word "Observations"

Comment [S24]: Genotypes or accessions?

Comment [S25]: This statement should be in the introduction section

Comment [S26]: Remove

Comment [S27]: Move to the introduction section

Comment [S28]: Genotypes or accessions?

Comment [S29]: I can't find any biochemical traits in the manuscript

Comment [S30]: The statement read that there were observations on morphological characters. However, i did not see any measurements on morphological observation. There should be tables on results having these measurements.

Comment [S31]: This statement should be recast. I would suggest the statement to be in this form: (The Observations on morphological characters, which include plant height (cm), stem girth (cm), leaf length (cm), number of leaves per rachis, length of leaf rachis, number of flowers per inflorescence, length of the pod (cm), pod girth (cm), pod weight (g), number of pods per plant, number of seeds per pod, yield per plant (kg) and yield per plot were recorded).

Comment [S32]: There is no experiment shown in this manuscript to show the results on tree shape, tree nature, the colour of bark, young shoot colour, foliage density, nature of branchlets, leaf shape, leaflet apex, the colour of calyx and pod maturity.

Comment [S33]: There is no result here to show this conclusion.

Comment [S34]: Space between 20 and genotype

Comment [S35]: Genotypes or accessions?

Comment [S36]: How did you arrive at this statement? I can't see any result to prove this statement.

Comment [S37]: How did you arrive at this statement? Are you referring to the traits in Table 2 or the traits in the preceding paragraph? What traits are you referring to?

PCA is a well-known method of dimension reduction that can be used to reduce a large set of variables to a small set that still contains most of the information in the large set (Massay, 1965; Jolliffie, 1986). (W. F. Massay, 1965), (I.T. Jolliffie, 1986). The results of the PCA revealed explained the genetic diversity among of the moringagenotypes. There are no standard tests to prove the significance of proper values and coefficients. Principal Component Analysis Principal component analysis has shown the genetic diversity among the investigated accessions. of the germplasm lines. In Table 2, it (Table 2) indicated that out of 12 principal components, only five components exhibited high eigenvalues and showed about 99.54% variability among the traits studied. The PC1 accounted for the highest variability (62.20%), followed by PC5 (28.86%), (PC10) (6.25%), PC7 (1.01%) and PC4 (0.75% The PC1 had the highest variability (62.20%), followed by 28.86% (PC5), 6.25% (PC10), 1.01% (PC7) and 0.75% (PC4).

Table 2: Traits, Eigen values, PC, % percentage variance and cumulative Eigen values of moringa germplasm accessions

Traits	PC	Eigen values	Percentage	Cumulative		
			of variation	percentage		
Plant height (cm)	PC1	2649.61	62.20	62.20		
Stem girth (cm)	PC2	2.25	0.053	62.25		
Leaf length (mm)	PC3	14.12	0.33	62.58		
Number of leaves per rachis	PC4	32.08	0.75	63.34		
Length of leaf rachis	PC5	1229.48	28.86	92.20		
Number of flower/inflorescence	PC6	-2.08	-0.049	92.15		
Length of pod (cm)	PC7	43.36	1.01	93.17		
Pod girth (cm)	PC8	3.11	0.07	93.24		
Pod weight (g)	PC9	1.63	0.03	93.28		
Number of pods per plant	PC10	266.54	6.25	99.54		
Number of seeds per pod	PC11	15.42	0.36	99.90		
Yield per plant (kg)	PC12	4.10	0.09	100.00		

Comment [S38]: Take to the introduction section.

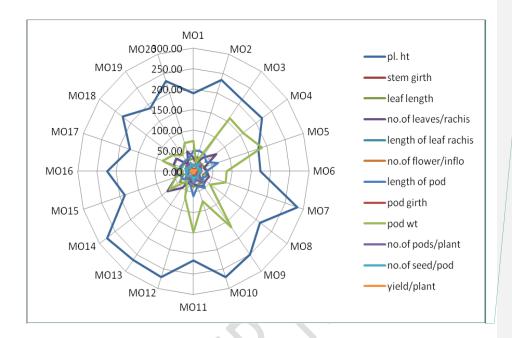
Comment [S39]: Space before the word "The"

Comment [S40]: Space between moringa and genotypes

Comment [S41]: Genotypes or accessions?

Comment [S42]: Add space in-between moringa and genotype or accessions.

Comment [S43]: Remove



Comment [S44]: This Rader is difficult to explain, therefore I would suggest that the authors put this result in a bar chart for proper clarity

Figure 1: Radar diagram showing mean performance of 20 moringa accessions with germplasm lines for different yield traits

PC scores of genotypes

The PC scores of each component (PC1, PC2, PC3, PC4, PC5, PC6, PC7, PC8, PC9, PC 10, PC11, and PC12) had positive and negative values (Table 3). In this pc score PC1, PC5, PC10, PC7 and PC4 or given high pc score values These scores can be utilized to propose precise selection indices based on genetic variability, which is whose intensity can be decided by variability explained by each principal component. A high PC score for a particular genotype in a particular component denotes high values for the variables in that particular genotype.

Comment [S45]: Genotypes or accessions?

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Comment [S47]: This statement should be revised. It is not clear to me

Comment [S48]: Genotypes or accessions?

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Table 3: PCA scores of moringa genotypes

Genotype	PC1	PC2	PC3	PC4	PC5	PC6	PC7	PC8	PC9	PC10	PC11	PC1 accession	ons
MO 1	5.926	20.841	11.157	16.129	10.557	61.487	14.830	200.187	18.472	6.201	3.466	41. Comm	
MO 2	8.826	24.421	-4.302	17.494	12.464	70.445	15.679	231.834	20.405	5.828	4.10	-17. accession	ons
MO 3	9.801	22.129	19.591	17.334	11.383	52.714	13.755	243.949	27.398	14.740	3.50	119.532	
MO 4	9.0280	19.058	51.668	14.773	10.750	52.310	14.964	249.686	28.665	-0.255	7.066	116.888	
MO 5	9.438	24.090	2.652	16.157	11.771	56.790	14.522	211.174	29.096	8.777	8.866	155.363	

Comment [S50]: Remove

Comment [S51]: Genotypes or

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MO 6	6.659	30.529	18.274	15.736	11.862	45.098	12.324	187.533	29.975	6.144	3.20	54.240
MO 7	8.143	18.603	19.994	17.591	13.014	52.620	14.964	295.488	22.169	6.807	4.133	33.407
MO 8	10.77	25.938	21.089	16.651	10.852	45.965	13.885	220.035	26.577	2.626	3.766	13.585
MO 9	9.632	27.914	18.995	18.321	12.683	53.608	15.095	279.457	39.805	3.322	6.50	119.361
MO 10	8.672	25.480	15.366	18.440	16.001	55.598	15.494	279.878	26.749	3.207	4.70	25.655
MO 11	10.231	28.840	3.475	15.021	13.360	60.951	13.869	242.304	40.651	6.729	4.00	108.928
MO 12	11.179	25.470	6.403	16.205	13.250	45.772	13.110	277.670	22.096	4.220	5.10	14.253
MO 13	10.644	27.503	30.404	18.695	13.424	55.442	14.855	265.256	21.835	5.374	4.20	-22.496
MO 14	6.480	31.126	59.697	20.097	9.358	67.293	15.221	287.228	32.739	5.766	4.30	23.743
MO 15	11.851	18.335	27.406	15.339	11.940	54.348	16.691	192.465	25.169	12.323	2.20	14.728
MO 16	7.074	23.847	22.790	16.196	14.461	51.379	11.644	223.917	24.986	4.091	4.466	-15.621
MO 17	8.910	24.832	34.332	17.474	14.919	52.565	14.570	187.257	28.143	12.501	4.966	51.645
MO 18	12.008	21.309	34.444	17.440	14.400	54.497	15.835	235.756	28.390	2.742	5.233	23.593
MO 19	10.281	23.868	5.321	14.849	11.004	46.524	13.201	195.610	24.460	2.084	6.066	13.202
MO 20	7.809	20.815	31.522	16.653	13.863	54.345	15.510	240.507	30.160	8.476	4.10	29.349

Conclusion:

The phenotypic value of each trait measures the importance and contribution of each component to the total variance. The component contributed the maximum for phenological traits, plant height, number of pods per plant, yield per plant are the chief contributors towards genetic divergence in moringa genotypes. Therefore, Thus, the prominent characters coming together in different principal components and the contribution in explaining the variability has revealed and have the need to adopt these characters or traits while carrying out a breeding programme. tendency to remain together this may be kept into consideration during the utilization of these characters in the breeding program.

References:

Morton, J.F. (1991). The horseradish tree, *Moringa pterigosperma* (Moringaceae): A boon to arid lands? *Economic Botany*, **45**: 318–333.

Comment [S53]: Phenology is the study of periodic events in biological life cycles and how these are influenced by seasonal variations in climate, as well as habitat factors. Do you mean this, or phenotypic traits, which are the physical characters or observations?

Comment [S54]: Genotypes or accessions?

Rahman, M.M., Rasul, M.G., Bashar, M.K., Syed, M.A. and Islam, M.R. (2011). Parent selection for transplanted Aman rice breeding by morphological, physiological and molecular diversity analysis. *Libyan Agriculture Research Center Journal International*, **2**(1): 29-35.

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Massay, W.F. (1965). Principal components regression in exploratory statistical research. *Journal of the American Statistics Association*. **60**: 234-246.

Jolliffie, I.T. (1986). *Principal Component Analysis*. Springer, New York.

Comment [S55]: Too much space between variation and the word "in"

Comment [S56]: Please check

Comment [S57]: Check this reference for proper referencing

Comment [S58]: Put the number of pages

Plate.1. Morphological variation in leaves of moringa genotypes



Comment [S59]: What type of morphological trait is this plate representing? Is it in terms of leave orientation or colour? More explanation is needed on this plate.

Comment [S60]: What type of morphological trait is this plate representing? Is it in terms of leave orientation or colour? More explanation is needed on this plate.

Plate.2. Morphological variation in leaves of moringa genotypes



Comment [S61]: What type of morphological trait is this plate representing? Is it in terms of pod length or size? More explanation is needed on this plate.

Plate.3. Morphological variation in pods of moringa genotypes



Plate.4. Morphological variation in pods of moringa genotypes



Comment [S62]: What type of morphological trait is this plate representing? Is it in terms of pod length or size? More explanation is needed on this plate.