



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

J. Karunakar ^{a*}, T. L. Preethi ^b, N. Manikanta Boopathi ^c, L. Pugalendhi ^a,
S. Juliet Hepziba ^d and Y. M. Mahadev Prasad ^a

^a Department of Vegetable Crops, Horticultural College and Research Institute, Tamilnadu Agricultural University, Periyakulam-625604, India.

^b Department of Floriculture and Medicinal Crops, Horticultural College and Research Institute, Tamilnadu Agricultural University, Periyakulam-625604, India.

^c Department of Biotechnology, Horticultural College and Research Institute, Tamilnadu Agricultural University, Periyakulam-625604, India.

^d Department of Genetics and Plant Breeding, Horticultural College and Research Institute, Tamilnadu Agricultural University, Periyakulam-625604, India.

Authors' contributions

This work was carried out in collaboration among all authors. All authors read and approved the final manuscript.

Article Information

DOI: 10.9734/IJPSS/2022/v34i930916

Open Peer Review History:

This journal follows the Advanced Open Peer Review policy. Identity of the Reviewers, Editor(s) and additional Reviewers, peer review comments, different versions of the manuscript, comments of the editors, etc are available here: <https://www.sdiarticle5.com/review-history/76622>

Original Research Article

Received 12 January 2022

Accepted 14 March 2022

Published 19 March 2022

ABSTRACT

The present investigation was carried out at the Department of Vegetable Crops, Horticultural College and Research Institute (HC&RI), Tamil Nadu Agricultural University, Periyakulam during 2016 -2017. Twenty genotypes used to study the genetic diversity for different yield attributing characters of moringa by principal component analysis. In this study, out of twelve principal components, five components exhibited eigen value and revealed about 99.54% variability among the traits. The PC1 accounted for the highest variability (62.20%), followed by PC5 (28.86%) , PC (10 6.25%), PC7 (1.01%) and PC4 (0.75%). The results of the Principal Component Analysis revealed that wide genetic variability exists in these moringa genotypes.

Keywords: *Moringa (Moringa oleifera L.)*; Genotypes; PCA; variability; traits; eigen values.

1. INTRODUCTION

Moringa (Moringa oleifera L.), which belongs to the family Moringaceae, is a highly useful vegetable crop and native to India. In India, it is grown all over the region for its tender pods, leaves and flowers. Plants have always been vital to mankind irrespective of era and area, all over the world since the beginning of life. Popularly known as “Drumstick” tree, horseradish tree, or Ben oil tree. *M. oleifera* is a deciduous-to-evergreen shrub or small tree with a height of 5 to 10 m [1]. To carry out breeding to increase the pod yield, information on genetic variability is the prerequisite since it is the source of variation and raw material for yield improvement. Assessment of genetic variability is also needed for efficient parent selection in a breeding program [2] long-term selection gain and exploitation of heterosis [3]. Moreover, the evaluation of genetic diversity is important to know the source of genes for a particular trait within the available germplasm [4]. Principal component analysis (PCA) involves a mathematical procedure that transforms several possibly correlated variables into a (smaller) number of uncorrelated variables called Principal Component [5]. 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 on how to reduce a complex data set to a lower dimension to reveal the 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. The present investigation was carried out to understand the variability through principal components in *Moringa (Moringa oleifera L.)* germplasms cultivated in Telangana State.

2. MATERIALS AND METHODS

The present investigation was carried out to understand the variability through principal components in *Moringa (Moringa oleifera L.)* germplasms cultivated in Telangana State at Department of Vegetable Crops, Horticultural College and Research Institute (HC&RI), Tamil Nadu Agricultural University, Periyakulam (PKM) during 2016 -2017. Twenty moringa genotypes (MO 1, MO 2, MO 3, MO 4, MO 5, MO 6, MO 7,

MO 8, MO 9, MO 10, MO 11, MO 12, MO 13, MO 14, MO 15, MO 16, MO 17, MO 18, MO 19 & MO 20) were collected from different regions of Telangana and the details of the plant materials used in the present study are listed in Table 1.

Twenty 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 twelve 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 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 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 [6,7].

3. RESULTS AND DISCUSSION

Twenty genotypes of moringa collected from various parts of Telangana were evaluated for different morphological 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 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 genotypes exhibited wide variability for morphological characters such as tree shape, tree nature, the colour of bark, young shoot colour, foliage density, nature of branchlets, leaflet shape, leaflet apex, colour of calyx and pod maturity. Four morphological descriptors viz., duration of plant, type of planting material, 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 genotypes possessed phenotypic variation among them.

Table 1. List of Moringa genotypes used in this study

| S.No. | Name of the genotype | Name of the Type | Place of collection & District | Latitude & Longitude |
|--------------|-----------------------------|-----------------------------|---|--|
| 1. | MO 1 | Long poded perennial type | Warangal, Warangal | 18 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 | 17 ⁰ 49' 58.89 N, 78 ⁰ 59' 57.35 E |
| 4. | MO 4 | Short poded perennial type | Regonda, Warangal | 18 ⁰ 23' 77.70 N, 79 ⁰ 77' 50.80 E |
| 5. | MO 5 | Long podedperennial type | Jagithyala, Karimnagar | 18 ⁰ 46'0.66 N, 78 ⁰ 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 | 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 | Medium Poded perennial type | Rudrur, Nizamabad | 18 ⁰ 34' 45.48 N, 77 ⁰ 52' 31.27 E |
| 10. | MO 10 | Short poded perennial type | Satyanarayanapuram,Nizamabad | 18 ⁰ 32' 40.61 N, 77 ⁰ 53' 31.39 E |
| 11. | MO 11 | Medium poded perennial type | Basara, Nirmal | 18 ⁰ 52' 40.63 N, 77 ⁰ 56' 57.01 E |
| 12. | MO 12 | Short poded perennial type | Mudhol, Nirmal | 18 ⁰ 98' 26.81 N, 77 ⁰ 92' 05.10 E |
| 13. | MO 13 | Short poded perennial type | Ichoda, Adilabad | 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 | 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 ⁰ 14' 8.70 N, 79 ⁰ 36' 34.07 E |
| 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 perennial type | Narayanapuram,Nalgonda | 17 ⁰ 10' 36.74 N, 80 ⁰ 52' 19.91 E |

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 [6,7]. The result of the PCA revealed genetic diversity among the moringa genotypes. There are no standard tests to prove the significance of proper values and coefficients. Principal Component Analysis has shown the genetic diversity among the investigated genotypes (Table 2) indicated that out of 12 principal components, 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%), PC (10 6.25%), PC7 (1.01%) and PC4 (0.75%).

3.1 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. These score can be utilized to propose precise selection indices 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.

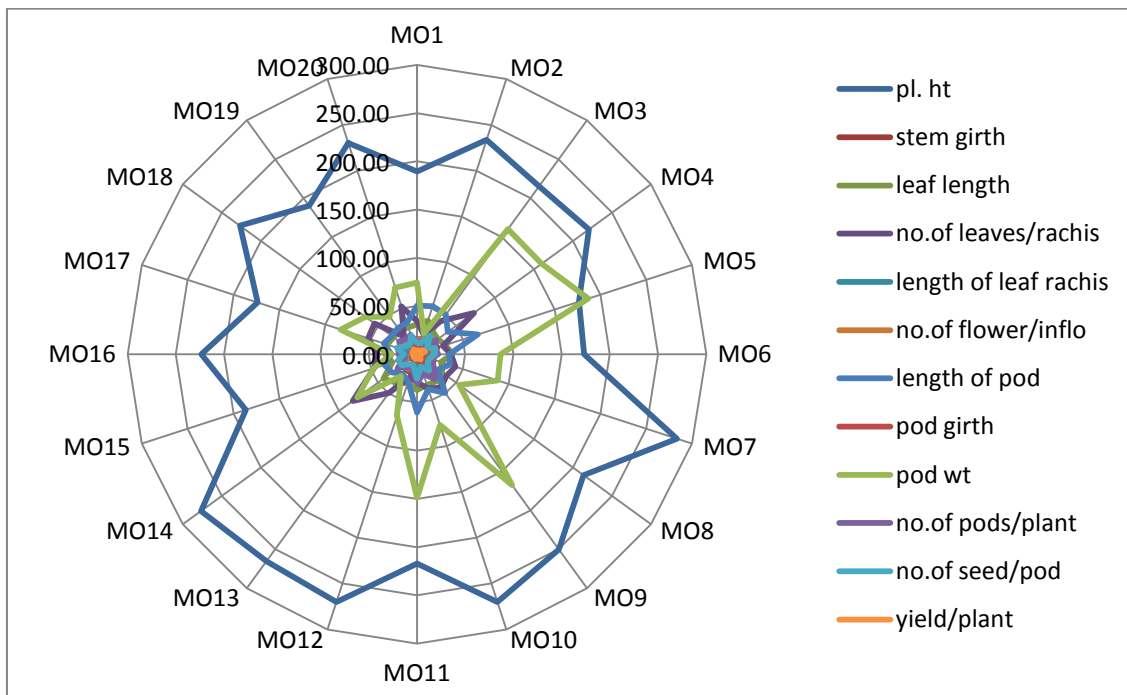


Fig. 1. Radar diagram showing mean performance of 20 moringa germplasm lines for different yield traits

Table 2. Traits, Eigen values, PC, variance and cumulative Eigen values of moringa germplasm

| Traits | PC | Eigenvalue | Percentage of variation | Cumulative % |
|----------------------------|------|------------|-------------------------|--------------|
| 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 |
| No. of leaves per rachis | PC4 | 32.08 | 0.75 | 63.34 |
| Length of leaf rachis | PC5 | 1229.48 | 28.86 | 92.20 |
| No 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(gr) | PC9 | 1.63 | 0.03 | 93.28 |
| No of pods per plant | PC10 | 266.54 | 6.25 | 99.54 |
| No of seeds per pod | PC11 | 15.42 | 0.36 | 99.90 |
| Yield per plant(kg) | PC12 | 4.10 | 0.09 | 100.00 |

Table 3. PC scores of moringa genotypes

| Genotype | PC1 | PC2 | PC3 | PC4 | PC5 | PC6 | PC7 | PC8 | PC9 | PC10 | PC11 | PC12 |
|-----------------|------------|------------|------------|------------|------------|------------|------------|------------|------------|-------------|-------------|-------------|
| MO 1 | 5.926 | 20.841 | 11.157 | 16.129 | 10.557 | 61.487 | 14.830 | 200.187 | 18.472 | 6.201 | 3.466 | 41.701 |
| MO 2 | 8.826 | 24.421 | -4.302 | 17.494 | 12.464 | 70.445 | 15.679 | 231.834 | 20.405 | 5.828 | 4.10 | -17.818 |
| 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 |
| 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 |



Plate 1. Morphological variation in leaves of moringa genotypes



Plate 2. Morphological variation in leaves of moringa genotypes



Plate 3. Morphological variation in pods of moringa genotypes

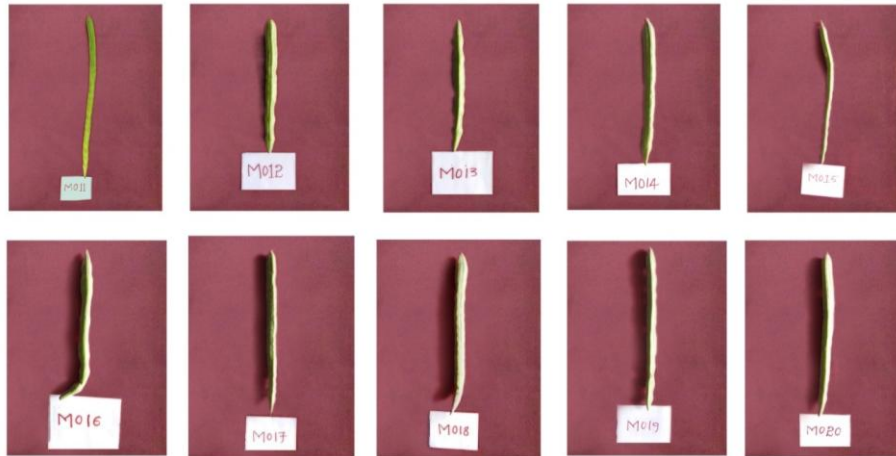


Plate 4. Morphological variation in pods of moringa genotypes

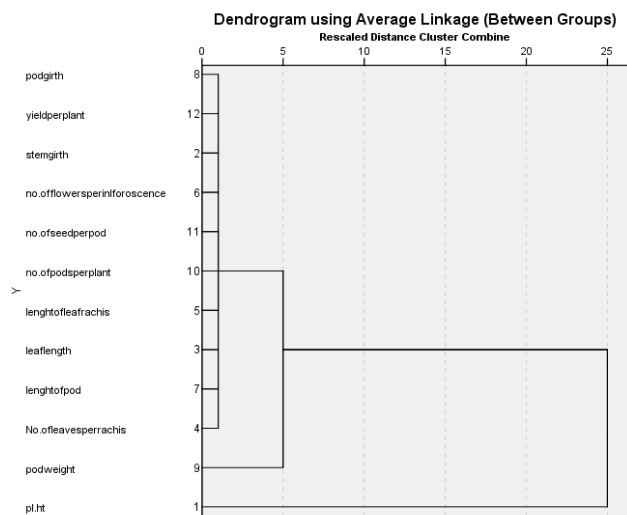


Fig. 2. Dendrogram for twenty germplasm genotypes of moringa for different traits

4. 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 and yield per plant are the chief contributors towards genetic divergence in moringa genotypes. Therefore, the prominent characters coming together in different principal components and the contribution in explaining the variability has revealed the need to adopt these characters or traits while carrying out a breeding programme.

COMPETING INTERESTS

Authors have declared that no competing interests exist.

REFERENCES

1. Morton JF. The horseradish tree, *Moringa pterigosperma* (*Moringaceae*): A boon to arid lands? *Economic Botany*. 1991;45: 318–333.
2. Rahman MM, Rasul MG, Bashar MK, Syed MA, Islam MR. Parent selection for transplanted Aman rice breeding by morphological, physiological and molecular diversity analysis. *Journal International of the Libyan Agriculture Research Center*. 2011;2(1):29-35.
3. Rahman MM, Bashar MK, Rasul MG. Molecular characterization and genetic variation in rice. LAP Lambert Academic Publishing GmbH & Co. KG, Saarbrücken, Germany. 2012;1-45.
4. Tomooka N. Genetic diversity and landrace differentiation of mung bean the (*Vigna radiata* L.) Wilc Zek and evaluation of its wild relatives (The subgenus *Ceratotropis*) as breeding materials. *Tech. Bull. Trop. Res. Centre, Japan*. Ministry of Agriculture, Forestry and Fisheries. Japan. 1991;28:1.
5. Chatfield C, Collis A. *Introduction to Multivariate Analysis*. CRC Press, Boca Raton. 1980;246.
6. Massay WF. Principal component regression in exploratory statistical research. *Journal of the American Statistics Association*. 1965;60:234-246.
7. Jolliffe IT. *Principal Component Analysis*. Springer, New York; 1986.

© 2022 Karunakar et al.; This is an Open Access article distributed under the terms of the Creative Commons Attribution License (<http://creativecommons.org/licenses/by/4.0>), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

Peer-review history:

The peer review history for this paper can be accessed here:
<https://www.sdiarticle5.com/review-history/76622>