

Research Article



Panicle Trait Diversity and Its Impact on the Productivity of Indonesian Foxtail Millet (*Setaria italica* L. Beauv.) Genotypes

Marisa Vidya Luthfiani¹, M Reza Pahlevi¹, Bambang Sapta Purwoko², Sintho Wahyuning Ardie^{2*}

¹Plant Breeding and Biotechnology Study Program, IPB University, Bogor 16680, Indonesia

²Department of Agronomy and Horticulture, IPB University, Bogor 16680, Indonesia

ARTICLE INFO

Article history:

Received September 8, 2025

Received in revised form November 3, 2025

Accepted December 8, 2025

Available Online December 19, 2025

KEYWORDS:

correlation,
minor cereals,
primary branch,
principal component,
quantitative traits



Copyright (c) 2026 @author(s).

ABSTRACT

Foxtail millet is a climate-resilient cereal crop that is growing in importance in food security and sustainable agriculture. This study aimed to identify panicle traits associated with yield, determine functional traits suitable for selecting high-productivity genotypes, and classify superior local Indonesian foxtail millet genotypes. Eight genotypes were evaluated using a randomized complete block design with three replications. Correlation analysis of 31 panicle traits revealed that grain filling rate, panicle weight, grain weight per panicle, grain weight per plant, and grain numbers on the middle and lower primary branches were positively associated with yield. Several of these traits also exhibited high broad-sense heritability and moderate GCV and PCV values, indicating their potential for selection. Principal component and two-way heatmap cluster analyses identified Buru, ICERI-7, Hambapraing, and Mauliru-2 as high-yielding genotypes. The findings provide critical insights for foxtail millet breeding programs in Indonesia focused on improving yield.

1. Introduction

Foxtail millet (*Setaria italica* L. Beauv.) is a minor cereal crop with growing recognition for its resilience to climate stress and its potential as a model species for other cereals (Ardie *et al.* 2025). Its nutritional profile makes it a promising functional staple, with carbohydrate content comparable to rice (75%) and notable levels of protein (11-13.3%), fat (3.36%), and fiber (17%) (Kalsi and Bhasin 2023). Foxtail millet also offers health benefits, including anti-cancer, anti-hypertensive, and anti-diabetic properties (Khan *et al.* 2025). It serves as a gluten-free alternative for individuals with celiac disease (Reaz *et al.* 2023). Its tolerance to drought (Wang *et al.* 2023), salinity (Pan

et al. 2020), and nutrient-poor soils (Nadeem *et al.* 2020) makes it suitable for cultivation in marginal areas, without competing with major staple crops.

Despite these advantages, foxtail millet remains underutilized (Ardie *et al.* 2025), especially in Indonesia, where no superior varieties have yet been developed. One of the main challenges in foxtail millet breeding is improving yield. Current productivity in the F2 Indonesian population ranges from 0.29 to 2.23 tons ha⁻¹ (Sintia *et al.* 2023; Muzzayyanah *et al.* 2024), far below the yield of varieties like 'Jigu37' in China, which can reach 8.91 tons ha⁻¹ (Zhang *et al.* 2022). Yield is closely linked to panicle and grain traits (Liu *et al.* 2020; Zhi *et al.* 2021), making their characterization in local genotypes essential.

Studies have shown a wide genetic diversity among Indonesian foxtail millet genotypes (Ardie *et al.* 2017; Ratnawati *et al.* 2024), including variation

*Corresponding Author

E-mail Address: sintho_wa@apps.ipb.ac.id

in grain traits (Jannah *et al.* 2024). Selection based on phenotypic traits can improve breeding efficiency (Khadka *et al.* 2020). However, despite several studies on Indonesian foxtail millet diversity, comprehensive characterization of genotypes based specifically on panicle traits remains limited. Identifying panicle traits is crucial for understanding yield potential. Additionally, the potential of individual genotypes to contribute to future breeding efforts aimed at improving yield has not been thoroughly assessed. Analytical methods such as Pearson's correlation, clustering, and principal component analysis are valuable for evaluating trait relationships and genetic diversity (Bhakuni *et al.* 2021; Yang *et al.* 2022; Ramesh *et al.* 2023). Therefore, this study aims to identify panicle traits associated with productivity and to classify promising Indonesian genotypes to support future breeding programs.

2. Materials and Methods

2.1. Planting Materials

The experiment was conducted from March to July 2024 in the Leuwikopo Experimental Field (-6.565549260850146, 106.7250459870867), Department of Agronomy and Horticulture, IPB University, West Java. The experiment employed a non-factorial randomized complete block design (RCBD), with genotype as the single factor. Each replication consisted of eight plots measuring 1.5 m × 1.2 m, each containing six rows of 10 plants per row. Three seeds were planted in each plot at a distance of 25 cm between rows and 10 cm between the planting holes. Two sample plants per row were observed in the experimental plots, ensuring that plants were collected from areas without border rows, yielding eight samples per genotype per replication.

The study used eight foxtail millet genotypes: ICERI-5, ICERI-6, and ICERI-7 from the Indonesian Cereal Research Institute; Botok-4(B), Mauliru-2, and Hambapraing from East Nusa Tenggara; Buru from North Maluku; and NTB-1 from West Nusa Tenggara. Field preparation included weed removal, tillage, and plot setup. Manure (2.5 tons ha⁻¹) and dolomite (300 kg ha⁻¹) were applied one week before planting. A protective net was installed to prevent pest damage. Plant maintenance involved regular weeding and fertilization: urea (150 kg ha⁻¹, half dose), SP-36 (150 kg ha⁻¹), and KCl (75 kg ha⁻¹) were applied two weeks after planting, followed by the remaining urea (150 kg ha⁻¹) at six weeks. Pest and

disease control was conducted as needed using suitable pesticides and fungicides.

2.2. Data Collection

Data were collected on yield traits, panicle characteristics, and architecture following UPOV (2013) and Zhi *et al.* (2021). Yield traits included heading time (days to 50% flowering), days to maturity (50% panicles matured), and grain filling period (days to maturity minus days to heading). Grain filling rate was calculated as the estimated yield divided by the grain-filling period. Yield estimation used the formula: (number of plants per ha ÷ 8 sample plants) × total grain weight of eight sample plants.

Panicle traits included panicle weight, grain weight per panicle, grain weight per plant, and 1,000-grain weight. Structural traits measured were panicle length (base to tip), diameter (midsection), and panicle exertion (uppermost node to panicle base). Density was assessed by counting primary branches per panicle length; grain and branch numbers were recorded per panicle. Panicle architecture was analyzed by dividing panicles into upper, middle, and lower zones. In each, three primary branches were measured for length and diameter. The number of primary branches per zone was counted manually, and grains were counted to assess distribution.

2.3. Data Analysis

Foxtail millet data were analyzed using various statistical tools. ANOVA and the least significant difference (LSD) test at the 5% level were used to evaluate yield traits and panicle architecture, with analyses performed in SAS OnDemand for Academics and Microsoft Excel. Broad-sense heritability (h²bs) was calculated following Allard (1960), using genetic, environmental, and phenotypic variance. Heritability was classified as high (h²bs>50%), moderate (h²bs 20–50%), or low (h²bs<20%) based on Stanfield (1983). Genetic and phenotypic coefficients of variation (GCV and PCV) were computed using formulas from Singh and Chaudhary (1985). Pearson correlation analysis was conducted using the “metan” package. Pearson's correlation coefficient (r), ranging from -1 to 1, quantifies the linear association between two variables: positive values (closer to 1) indicate strong direct relationships, negative values (closer to -1) indicate inverse relationships, and zero indicates no correlation (Lazar *et al.* 2017). Heatmap clustering with “pheatmap” (Hu 2021), and principal component analysis (PCA)

using “factoextra” in RStudio (version 4.4.1), following Irnawati *et al.* (2021).

3. Results

Heading time, days to maturity, grain-filling period, grain-filling rate, and yield estimation showed variability among eight foxtail millet genotypes (Table 1). The NTB-1 genotype exhibited the longest heading and maturation times, but the lowest yield estimation. In contrast, the Buru genotype displayed the fastest heading and maturation times and achieved the highest yield estimation. The grain filling period of the Buru genotype was similar to that of the NTB-1 genotype. However, the grain-filling rate of the Buru genotype was higher than that of the NTB-1 genotype.

Based on Pearson correlation analysis, six traits were positively correlated with yield estimation (Figure 1). The traits were grain filling rate, panicle weight, grain weight per panicle, grain weight per plant, number of grains on the middle primary branch, and number of grains on the lower main branch. The correlation coefficients (*r*) ranged from 0.84 to 1.00, indicating a strong relationship. Grain filling rate had a significant positive effect on yield. Still, it was negatively correlated with days to maturity, indicating that faster grain filling both increased yield and shortened time to maturity. Among the genotypes, Buru had the highest grain-filling rate and the shortest harvest time, making it a promising candidate for breeding early-maturing, high-yielding foxtail millet varieties.

The main panicle was divided into upper, middle, and lower zones, each with distinct primary branch architecture

(Figure 2). Five traits—panicle weight, grain weight per panicle, grain weight per plant, and grain counts on middle and lower zone branches—showed significant positive correlations with yield estimation (Table 2). The Buru, ICERI-7, and Mauliru-2 genotypes had the highest number of grains per primary branch in the middle and lower zones of the panicle.

Broad-sense heritability, genetic coefficient of variance, and phenotypic coefficient of variance for traits correlated with yield estimation are presented in Table 3. Yield estimation and its six positively correlated traits exhibited high heritability, suggesting strong potential for use in selection. Grain weight per panicle, grain weight per plant, number of grains on the middle primary branch, and number of grains on the lower primary branch had the highest heritability with moderate GCV and PCV values. Although the difference was small, PCV values were consistently higher than GCV values. Grain filling rate and panicle weight showed lower variation, indicating more environmental influence on these traits.

Principal component analysis (PCA) (Figure 3) identified several genotypes with strong yield-related traits. ICERI-7 showed potential in grain development and panicle structure, while Buru excelled in grain weight and overall productivity. Hambapraing demonstrated uniform grain distribution across panicle zones, and Mauliru-2 had structural advantages in primary branch number. ICERI-6 performed well in branch diameter and length, ICERI-5 had the highest 1,000-grain weight, and Botok-4(B) showed the longest panicle exertion. NTB-1 was characterized by a longer heading time and grain filling duration, indicating late maturity. Genotypes clustered

Table 1. Mean of heading time, days to maturity, grain filling period, grain filling rate, and yield estimation of eight local foxtail millet genotypes

Genotype	HeT (DAP)	DM (DAP)	GFP (DAP)	GFR (kg ha ⁻¹ DAP ⁻¹)	Ye (ton ha ⁻¹)
ICERI-5	66.60 ^c	87.81 ^d	87.81 ^d	137.05 ^{abc}	2.142 ^d
ICERI-6	69.33 ^{bc}	89.33 ^{cd}	89.33 ^{cd}	110.45 ^{bcd}	2.198 ^{cd}
ICERI-7	73.67 ^b	93.00 ^{bc}	93.00 ^{bc}	188.37 ^a	3.622 ^{ab}
Botok-4(B)	71.00 ^{bc}	97.67 ^b	97.67 ^b	79.91 ^{cd}	2.128 ^d
Buru	49.33 ^d	73.67 ^c	73.67 ^c	168.45 ^{ab}	4.105 ^a
Hambapraing	71.33 ^b	92.67 ^{bcd}	92.67 ^{bcd}	142.33 ^{ab}	3.016 ^{bc}
Mauliru-2	73.67 ^b	97.00 ^b	97.00 ^b	139.20 ^{ab}	3.178 ^b
NTB-1	87.33 ^a	114.33 ^a	114.33 ^a	73.63 ^d	1.975 ^d
F test	**	**	**	**	**
CV(%)	3.63	3.18	9.32	5.42	7.29

Numbers followed by the same letter on the same column indicate no significant difference based on the LSD test at $\alpha < 5\%$; HeT: heading time, DM: days to maturity, GFP: grain filling period, GFR: grain filling rate, Ye: yield estimation

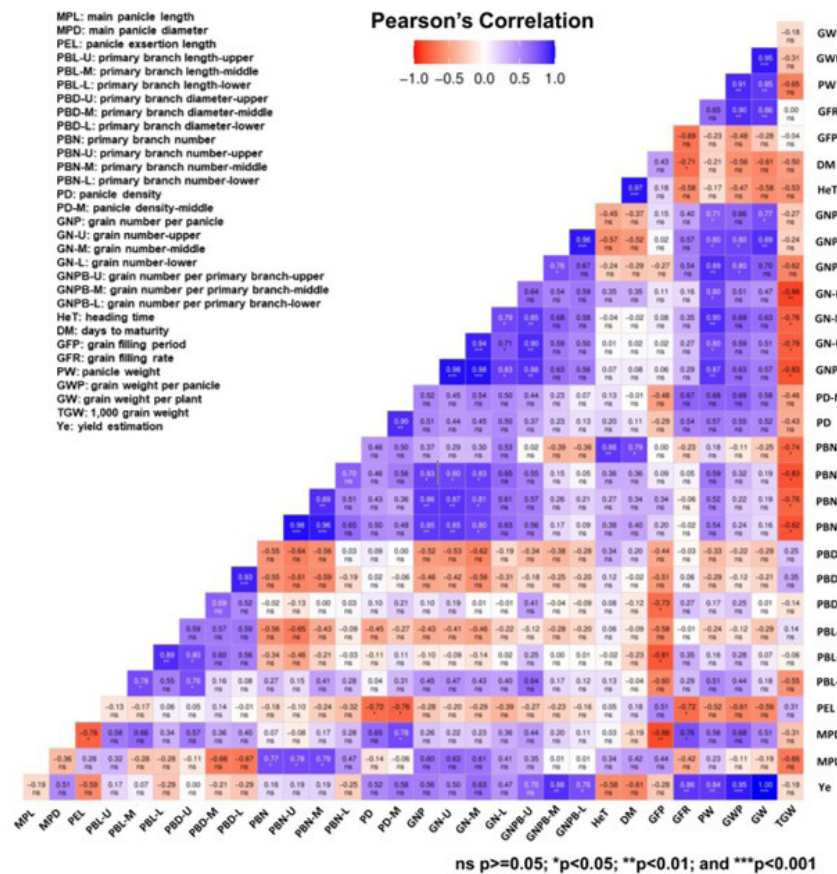


Figure 1. Correlation coefficients between panicle architecture and yield characteristics of eight local foxtail millet genotypes

by quadrant showed similar traits: ICERI-7 and Buru (I), Hambapraing and Mauliru-2 (II), Botok-4(B) and NTB-1 (III), and ICERI-5 and ICERI-6 (IV).

Two-way heatmap clustering (Figure 4) grouped yield-related traits into four clusters and genotypes into two. NTB-1, ICERI-5, ICERI-6, and Botok-4(B) showed consistently low values across most traits. In contrast, Buru and ICERI-7 had high values for grain filling rate, grain weight (per panicle and per plant), grain number per primary branch (middle and lower zones), and yield estimation. Hambapraing and Mauliru-2 excelled in grain number per panicle and zone, grain number per primary branch (upper), and panicle weight. These four genotypes—Buru, ICERI-7, Hambapraing, and Mauliru-2—were identified as having panicle traits strongly associated with high yield.

4. Discussion

The development of early-maturing genotypes with high productivity is a target for foxtail millet breeding. However, research on the F2 generation of foxtail

millet from a cross between ICERI-5 and Botok-10 (including reciprocal crosses) revealed a positive correlation between heading and maturation times and productivity, indicating that early-maturing genotypes generally exhibit low productivity (Sintia *et al.* 2023; Muzzayyanah *et al.* 2024). Interestingly, the NTB-1 and Buru genotypes in the present study showed contrasting results. This suggests that breeding early-maturing, high-productivity foxtail millet is achievable, particularly by focusing on grain-filling rate as a key selection trait.

Selecting traits strongly correlated with productivity is a critical step in breeding programs. Enhancing such traits can significantly improve foxtail millet yield. Han *et al.* (2024) reported that higher grain filling rates lead to greater yields, with grain weight also increasing accordingly (Wu *et al.* 2018). In maize and rice, grain weight per panicle and per plant are key indicators of yield (Mushtaq *et al.* 2021; Garko *et al.* 2023). More primary branches contribute to higher grain and panicle weight (Agalya *et al.* 2023), and grain number per primary branch has been linked to increased total grain number in rice (Hastini *et al.* 2019). These findings highlight

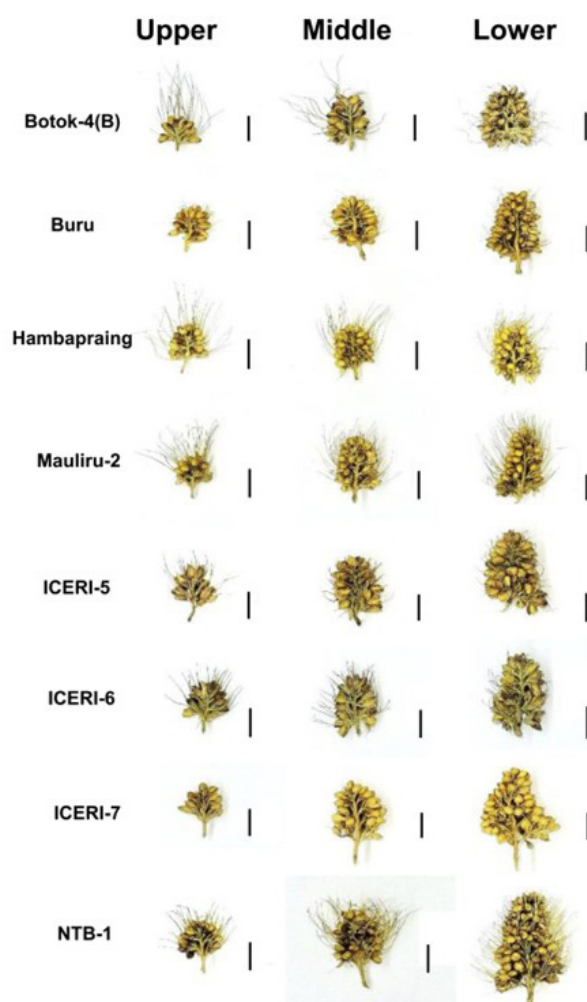


Figure 2. Primary branch diversity at each zone in eight foxtail millet genotypes; Scale bar: 0.5 cm

Table 2. Mean of panicle weight, grain weight per panicle, grain weight per plant, grain number per primary branch in the middle and lower zones of eight local foxtail millet genotypes

Genotype	PW (g)	GWP (g)	GW(g)	GNPB-M	GNPB-L
ICERI-5	3.81 ^c	3.50 ^d	5.35 ^d	16.1 ^c	21.1 ^c
ICERI-6	4.90 ^{abc}	3.92 ^{bcd}	5.50 ^{cd}	23.7 ^{bc}	37.7 ^b
ICERI-7	7.03 ^a	5.92 ^a	9.05 ^{ab}	29.0 ^{ab}	42.7 ^{ab}
Botok-4(B)	4.44 ^{bc}	3.26 ^d	5.32 ^d	24.1 ^{bc}	36.5 ^b
Buru	6.92 ^{ab}	5.86 ^{ab}	10.26 ^a	40.3 ^a	59.6 ^a
Hambapraing	7.33 ^a	5.48 ^{ab}	7.54 ^{bc}	27.3 ^b	37.4 ^b
Mauliru-2	7.15 ^a	5.20 ^{abc}	7.95 ^b	29.9 ^{ab}	41.8 ^b
NTB-1	5.17 ^{abc}	3.10 ^d	4.94 ^d	21.1 ^{bc}	37.0 ^b
F test	*	**	**	*	**
CV(%)	11.70	10.63	8.07	11.82	11.74

Numbers followed by the same letter on the same column indicate no significant difference based on the LSD test at $\alpha < 5\%$; PW: panicle weight, GWP: grain weight per panicle, GW: grain weight per plant, GNPB-M: grain number per primary branch of the middle zone, GNPB-L: grain number per primary branch of the lower zone

Table 3. Broad-sense heritability values, genetic coefficients of variance, and phenotypic coefficients of variance for yield-related traits in Indonesian local foxtail millet genotypes

Traits	Mean square		σ^2_e	σ^2_g	σ^2_p	h^2_{bs}	Mean	GCV (%)	PCV (%)
	Block	Genotype							
Ye	0.14	0.14**	0.02	0.04	0.05	85.71	1.80	11.11	12.00
GFR	0.05	0.06**	0.01	0.02	0.02	83.33	1.08	6.21	6.80
PW	0.23	0.24*	0.09	0.05	0.08	62.50	2.50	8.94	11.31
GWP	0.40	0.23**	0.06	0.06	0.08	73.91	2.21	10.77	12.53
GW	0.39	0.39**	0.05	0.11	0.13	87.18	2.70	12.47	13.35
GNPB-M	1.33	1.43*	0.37	0.35	0.48	74.13	5.12	11.61	13.48
GNPB-L	3.42	2.23**	0.53	0.57	0.74	76.23	6.21	12.12	13.88

Ye: yield estimation, GFR: grain filling rate, PW: panicle weight, GWP: grain weight per panicle, GW: grain weight per plant, GNPB-M: grain number per primary branch of middle zone, GNPB-L: grain number per primary branch of lower zone, σ^2_e : environmental variance, σ^2_g : genetic variance, σ^2_p : phenotypic variance, h^2_{bs} : broad-sense heritability, GCV: genetic coefficient of variation, PCV: phenotypic coefficient of variation

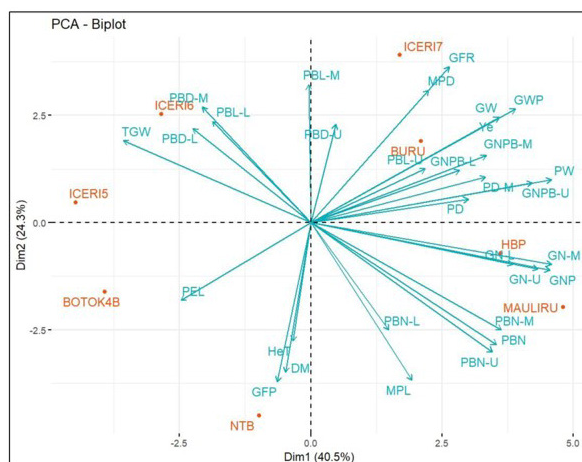


Figure 3. PCA biplot between PC 1 and PC 2 of panicle architecture and yield-related traits among eight Indonesian foxtail millet genotypes

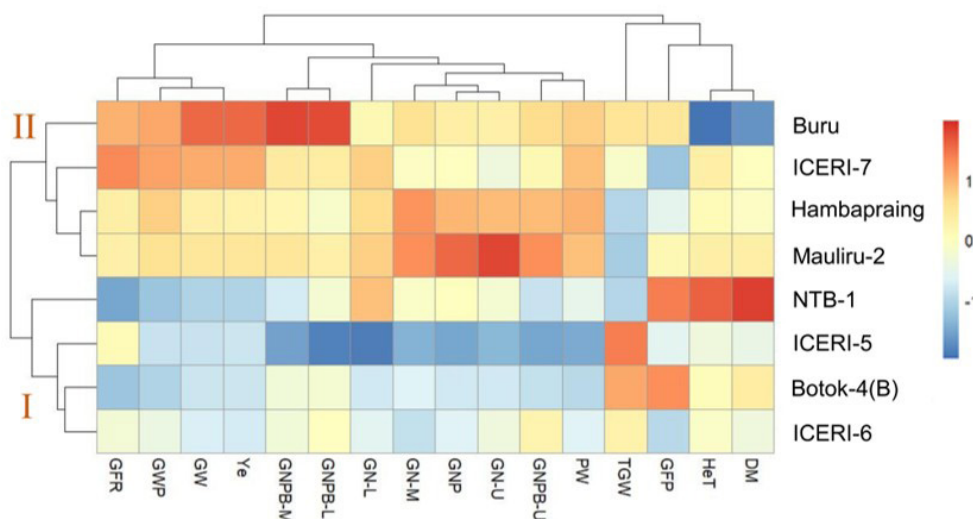


Figure 4. Two-way heatmap clustering analysis of local foxtail millet genotypes that was based on yield-related traits; Color scale represents correlation strength, with 1 indicating a strong positive association and -1 indicating a strong negative association

the importance of selecting traits that influence grain productivity. Consistent with these studies, our results confirm that several panicle traits are strongly associated with productivity in Indonesian foxtail millet genotypes. These findings highlight the importance of selecting traits that influence grain productivity.

In addition to evaluating trait-productivity correlations, it is important to consider heritability, genetic coefficient of variation (GCV), and phenotypic coefficient of variation (PCV) for the traits studied. Heritability helps guide selection decisions by indicating how much of a trait is genetically controlled (Anuradha and Patro 2020). According to Nyquist and Baker (1991), traits with high broad-sense heritability are more efficient to select. In this study, PCV values were slightly higher than GCV values for several traits, but the differences were small, suggesting limited environmental influence and stable trait expression (Patel *et al.* 2021). Mounika *et al.* (2024) also found that grain weight per plant in rice had moderate GCV and PCV but high heritability. Cooper *et al.* (2020) emphasized that both GCV and heritability are essential for effective trait improvement in breeding programs. Based on these findings, traits such as grain weight per panicle, grain weight per plant, and grain number per primary branch in the middle and lower zones are promising selection criteria for identifying high-yielding genotypes.

To further validate trait associations and genotype performance, PCA and heatmap clustering were used. PCA identified key traits influencing yield and helped highlight superior genotypes for breeding (Kumari *et al.* 2021). It has been widely applied to classify genotypes of rice and wheat based on panicle traits (Adilova *et al.* 2020; Banjare *et al.* 2024). Supporting this, Singh *et al.* (2023) found panicle weight positively correlated with grain yield, while Herlina *et al.* (2016) and Zhao *et al.* (2016) reported that longer panicle exertion may reduce the rice yield. Grain weight per panicle and per plant was confirmed as a key yield trait (Behera *et al.* 2020; Mushtaq *et al.* 2021; Garko *et al.* 2023). Heatmap clustering complemented PCA by grouping genotypes and traits into two clear clusters (Sakinah *et al.* 2021). Aligned with previous findings, our study clustered genotypes into two groups. Genotypes such as Buru, Hambapraing, Mauliru-2, and ICERI-7 demonstrated strong performance in yield-related traits, making them promising candidates for future breeding. These findings

provide valuable insights for the targeted selection and development of high-yielding foxtail millet genotypes.

Acknowledgements

The authors are grateful to the manager and technicians of the Leuwikopo Experimental Field and to the Department of Agronomy and Horticulture, Faculty of Agriculture, IPB University, for their support with research facilities.

References

- Adilova, S., Qulmamatova, D., Baboev, S., Bozorov, T., Morgunov, A., 2020. Multivariate cluster and principal component analyses of selected yield traits in Uzbek bread wheat cultivars. *Am. J. Plant Sci.* 11, 903-912. <https://doi.org/10.4236/ajps.2020.116066>.
- Agalya, J.S., Hari, P.P., Ramchander, S., Dinesh, K.P., Devesena, N., Naveenkumar, R., Sugitha, T., John, K.N.B., 2023. Assessment of variability parameters and diversity of panicle architectural traits associated with yield in rice (*Oryza sativa* L.). *Plant Sci. Today.* 11, 109-118. <https://doi.org/10.14719/pst.2658>
- Allard, R.W., 1960. Principles of Plant Breeding. John Wiley & Sons, New York.
- Anuradha, N., Patro, T., 2020. Estimates of variability, heritability and genetic advance in foxtail millet. *J. Pharmacogn. Phytochem.* 9, 1614-1616.
- Ardie, S.W., Khumaida, N., Fauziah, N., Yudiansyah, Y., 2017. Biodiversity assessment of foxtail millet (*Setaria italica* L.) genotypes based on RAPD marker. *J. Trop. Crop Sci.* 4, 21-25. <https://doi.org/10.29244/jtcs.4.1.21-25>
- Ardie, S.W., Nugroho, R.B., Dirpan, A., Anshori, M.F., 2025. Foxtail millet research in supporting climate change resilience efforts: bibliometric analysis and focused literature review. *Heliyon.* 11, e42348. <https://doi.org/10.1016/j.heliyon.2025.e42348>
- Behera, P.P., Singh, S.K., Singh, D.K., 2020. Genetic association study of rice (*Oryza sativa* L.) genotypes for yield and yield attributing traits over five different locations. *Plant Arch.* 20, 5191-5196.
- Banjare, B., Katiyar, P., Thakur, N., Magar, A., S. 2024. Evaluating panicle architecture and yield characteristics in medium duration rice genotypes through correlation and principal component analysis. *J. Exp. Agric. Int.* 46, 154-163. <https://doi.org/10.9734/jeai/2024/v46i92814>
- Bhakuni, V., Prasad, R., Shukla, P.S., 2021. Genetic variability and correlation studies for morphological and seed quality parameters in foxtail millet (*Setaria italica* (L.) Beauv.). *Pharma Innov.* 10, 160-165. <https://doi.org/10.22271/tpi.2021.v10.i4c.5911>

- Cooper, M., Powell, O., Voss-Fels, K.P., Messina, C.D., Ghosh, C., Podlich, D.W., Technow, F., Chapman, S.C., Beveridge, C.A., Ortiz-Barrientos, D., Hammer, G.L., 2020. Modelling selection response in plant-breeding programs using crop models as mechanistic gene-to-phenotype (CGM-G2P) multi-trait link functions. *In Silico Plants*. 3, 1-21. <https://doi.org/10.1093/insilicoplants/diaa016>
- Garko, M.S., Dawaki, K.D., Yawale, M.A., Sa'ad, A.M., Daraja, Y.B., Fulani, M.S., Magashi, A.I., Abdussalam, S.S., 2023. Correlation and path coefficient analysis between grain yield and some growth and yield components of maize (*Zea mays* L.) genotype as influenced by drought and heat stress conditions in sudan savannah of Nigeria. *Int. J. Agric. Environ. Res.* 9, 162-169. <https://doi.org/10.22004/ag.econ.334600>
- Han, Y., Zhao, P., Zhao, Y., Liu, M., Guo, E., Wang, G., Zhang, A., 2024. Transcriptome sequencing and metabolome analysis reveals the regulatory and molecular mechanisms of the grain filling rate in Foxtail millet (*Setaria italica* L.). *Agronomy*. 14, 1114. <https://doi.org/10.3390/agronomy14061114>
- Hastini, T., Suwarno, W.B., Ghulamahdi, M., Aswidinnoor, H., 2019. Short Communication: Correlation and regression among rice panicle branches traits. *Biodiversitas*. 20, 1140-1146. <https://doi.org/10.13057/biodiv/d200428>
- Herlina, L., Sobir, Trijatmiko, K.R., 2016. Identification of quantitative trait loci (QTL) for awn, incomplete panicle exertion and total spikelet number in an F2 population derived from a backcross inbred line, Bio-148, and the recurrent parent, IR64. *Makara J. Sci.* 20, 17-27. <https://doi.org/10.7454/mss.v20i1.5657>
- Hu, K., 2021. Become competent in generating RNA-seq heat maps in one day for novices without prior R experience. *Methods Mol. Biol.* 2239, 269-303. https://doi.org/10.1007/978-1-0716-1084-8_17
- Irnawati, I., Riswanto, F.D.O., Riyanto, S., Martono, S., Rohman, A., 2021. The use of software packages of R, factoextra, and FactoMineR and their application in principal component analysis for authentication of oils. *Indonesian J. Chemom. Pharm. Anal.* 1, 1-10. <https://doi.org/10.22146/ijcpa.482>
- Jannah, R.M., Ratnawati, S., Suwarno, W.B., Ardie, S.W., 2024. Digital phenotyping for robust seeds variability assessment in *Setaria italica* (L.) P. Beauv. *J. Seed Sci.* 46, e202446012. <https://doi.org/10.1590/2317-1545v46281586>
- Kalsi, R., Bhasin, J.K., 2023. Nutritional exploration of foxtail millet (*Setaria italica*) in addressing food security and its utilization trends in food system. *eFood*. 4, e111. <https://doi.org/10.1002/efd2.111>
- Khadka, K., Earl, H.J., Raizada, M.N., Navabi, A., 2020. A physi-morphological trait-based approach for breeding drought tolerant wheat. *Front. Plant Sci.* 11, 715. <https://doi.org/10.3389/fpls.2020.00715>
- Khan, T., Azad, A.A., Islam, R.U., 2025. Millets: A comprehensive review of nutritional, antinutritional, health, and processing aspects. *J. Food Compos. Anal.* 141, 107364. <https://doi.org/10.1016/j.jfca.2025.107364>
- Kumari, B., Kumar, B.R., DPB, J., Rao, N.M., 2021. Diversity analysis in rice breeding lines for yield and its components using principal component analysis. *J. Pharmacogn. Phytochem.* 10, 905-909. <https://doi.org/10.22271/phyto.2021.v10.i1m.13451>
- Lazar, J., Feng, J.H., Hochheiser, H., 2017. Statistical analysis. In: Lazar, J., Feng, J.H., Hochheiser, H. (Eds.). *Research Methods in Human-Computer Interaction*, 2nd edition. Cambridge: Morgan Kaufmann. pp. 71-104.
- Liu, T., He, J., Dong, K., Wang, X., Yang, W., Ren, R., Zhang, L., Zhang, Z., Yang, T., 2020. QTL mapping of yield component traits on bin map generated from resequencing a RIL population of foxtail millet (*Setaria italica*). *BMC Genom.* 21, 141. <https://doi.org/10.1186/s12864-020-6553-9>
- Mounika, J., Badugu, K., Chapara, R., Bhuvaneswari, V., 2024. Genetic variability and association studies in rice (*Oryza sativa* L.). *Andhra Agric. J.* 71, 23-28. <https://doi.org/10.61657/aaj.2024.88>
- Mushtaq, D., Kumar, B., Singh, P., Sharma, M., Sheera, A., 2021. Exploring the relationship between yield and yield attributing traits in advanced breeding lines of rice (*Oryza sativa* L.). *Int. J. Environ. Clim. Chang.* 11, 350-358. <https://doi.org/10.9734/ijec/2021/v11i1230586>
- Muzzayyanah, P.N., Suwarno, W.B., Ardie, S.W., 2024. Gene action and heritability estimates in F2 populations of foxtail millet (*Setaria italica* L.). *Sabao J. Breed. Genet.* 56, 65-75. <http://doi.org/10.54910/sabao2024.56.1.6>
- Nadeem, F., Ahmad, Z., Hassan, M.U., Wang, R., Diao, X., Li, X., 2020. Adaptation of foxtail millet (*Setaria italica* L.) to abiotic stresses: a special perspective of responses to nitrogen and phosphate limitations. *Front. Plant Sci.* 11, 187. <https://doi.org/10.3389/fpls.2020.00187>
- Nyquist, W.E., Baker, R.J., 1991. Estimation of heritability and prediction of selection response in plant populations. *Crit. Rev. Plant Sci.* 10, 235-322. <https://doi.org/10.1080/07352689109382313>
- Pan, J., Li, Z., Dai, S., Ding, H., Wang, Q., Li, X., Ding, G., Wang, P., Guan, Y., Liu, W., 2020. Integrative analyses of transcriptomics and metabolomics upon seed germination of foxtail millet in response to salinity. *Sci. Rep.* 10, 13660. <https://doi.org/10.1038/s41598-020-70520-1>
- Patel, R.R.S., Sharma, D., Das, B.K., Mondal, S., Sahu, P.K., Vishwakarma, G., Kumar, V., Sao, R., Khute, I.K., 2021. Study of coefficient of variation (GCV & PCV), heritability, and genetic advance in advanced generation mutant line of rice (*Oryza sativa* L.). *Pharma Innov. J.* 10, 784-787.
- Ramesh, P., Juturu, V.N., Yugandhar, P., Pedersen, S., Hemasundar, A., Yolcu, S., Reddy, P.C.O., Reddy, C.V.C.M., Veerabramha C.P., Mohan, R., Chandra, S.A., 2023. Molecular genetics and phenotypic assessment of foxtail millet (*Setaria italica* (L.) P. Beauv.) landraces revealed remarkable variability of morpho-physiological, yield, and yield-related traits. *Front. Genet.* 14, 1052575. <https://doi.org/10.3389/fgene.2023.1052575>

- Ratnawati, S., Jannah, R.M., Dewi, Y.I., Rizqullah, R., Suwarno, W.B., Ardie, S.W., 2024. The genetic variability of Indonesian local foxtail millet accession based on agromorphological traits and early salinity tolerance evaluation utilizing *SiDREB2*-Based SNAP marker. *Hayati J. Biosci.* 31, 82-93. <https://doi.org/10.4308/hjb.31.1.82-93>
- Reaz, A.H., Abedin, M.J., Abdulla, A.T.M., Satter, M.A., Farzana, T., 2023. Physicochemical and structural impact of CMC-Hydrocolloids on the development of gluten-free foxtail millet biscuits. *Heliyon*. 9, e17176. <https://doi.org/10.1016/j.heliyon.2023.e17176>
- Sakinah, A.I., Musa, Y., Farid, M., Anshori, M.F., Arifuddin, M., Laraswati, A.A., 2021. Cluster heatmap for screening the drought tolerant rice through hydroponic culture. *IOP Conf. Ser. Earth Environ. Sci.* 807, 042045. <https://doi.org/10.1088/1755-1315/807/4/042045>
- Singh, R.K., Chaudhary, B.D., 1985. *Biometrical Methods in Quantitative Genetic Analysis*. Kalyani Publisher, New Delhi.
- Singh, D., Lawrence, K., Marker, S., Bhattacharjee, I., Lawrence, R., Choudhary, R., Ercisli, S., Karunakaran, R., 2023. Rainfed assessment of foxtail millet (*Setaria italica* L. Beauv) germplasms through genotyping and principal component analysis. *Front. Plant Sci.* 14, 1017652. <https://doi.org/10.3389/fpls.2023.1017652>
- Sintia, M., Ardie, S.W., Suwarno, W.B., 2023. Genetic variability of F2 foxtail millet population derived from ICERI-5 and Botok-10 cross. *Biodiversitas*. 24, 3559-3567. <https://doi.org/10.13057/biodiv/d240655>
- Stanfield, W.D., 1983. *Theory and Problem of Genetics*, second ed. McGraw-Hill, New York.
- [UPOV] International Union for the Protection of New Varieties of Plants. 2013. Foxtail Millet: Guidelines for the Conduct of Test for Distinctness, Uniformity and Stability. 20, 3-27.
- Wang, J., Sun, Z., Wang, X., Tang, Y., Li, X., Ren, C., Ren, J., Wang, X., Jiang, C., Zhong, C., Zhao, S., Zhang, H., Liu, X., Kang, S., Zhao, X., Yu, H., 2023. Transcriptome-based analysis of key pathways relating to yield formation stage of foxtail millet under different drought stress conditions. *Front. Plant Sci.* 13, 1110910. <https://doi.org/10.3389/fpls.2022.1110910>
- Wu, X., Tang, Y., Li, C., Wu, C., 2018. Characterization of the rate and duration of grain filling in wheat in Southwestern China. *Plant Prod. Sci.* 21, 358-369. <https://doi.org/10.1080/01343943X.2018.1518722>
- Yang, X., Tian, Q., Yan, J., Chen, Y., 2022. Characterizing root morphological traits in 65 genotypes of foxtail millet (*Setaria italica* L.) from four different ecological regions in China. *Agronomy*. 12, 1472. <https://doi.org/10.3390/agronomy12061472>
- Zhang, W., Wang, B., Liu, B., Chen, Z., Lu, G., Ge, Y., Bai, C., 2022. Trait Selection for Yield Improvement in Foxtail Millet (*Setaria italica* Beauv.) under Climate Change in the North China Plain. *Agronomy*. 12, 1500. <https://doi.org/10.3390/agronomy12071500>
- Zhao, C.F., Chen, T., Zhao, Q.Y., Zhou, L.H., Zhao, L., Zhang, Y.D., Zhu, Z., Yao, S., Wang, C.L., 2016. Analysis of QTLs for panicle exertion and its relationship with yield and yield-related traits in rice (*Oryza sativa* L.). *Genet. Mol. Res.* 15, 1-12. <https://doi.org/10.4238/gmr.15027423>
- Zhi, H., He, Q., Tang, S., Yang, J., Zhang, W., Liu, H., Jia, Y., Jia, G., Zhang, A., Li, Y., Guo, E., Gao, M., Li, S., Li, J., Qin, N., Zhu, C., Ma, C., Zhang, H., Chen, G., Zhang, W., Wang, H., Qiao, Z., Li, S., Cheng, R., Xing, L., Wang, S., Liu, J., Liu J., Diao, X., 2021. Genetic control and phenotypic characterization of panicle architecture and grain yield-related traits in foxtail millet (*Setaria italica*). *Theor. Appl. Genet.* 134, 3023-3036. <https://doi.org/10.1007/s00122-021-03875-2>