RESEARCH ARTICLE

Analysis of root system architecture in rice indicates limited varietal adaptations

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Abstract

Plant roots are the primary organs that sense and respond to soil-derived stresses. A healthy root system architecture reflects a plant's adaptive potential. In this study, we analyzed root traits of 286 rice varieties grown in hydroponic and pot culture systems. The results revealed considerable variation and significant correlations for root traits across both systems. Cluster analysis partitioned the genotypes into two clusters, with total root length, surface area and root diameter as major determinants of variation. The results highlight marginal changes in root system traits within the *indica* group, resulting in distinct behaviors under pot culture conditions. However, the *Aus/Boro* subgroup did not exhibit similar patterns. The study underscores the importance of further investigating root system traits to achieve adaptive improvements, aiming to enhance the efficiency and effectiveness of root breeding programs. Understanding these variations can lead to the discovery of desirable traits and the development of superior rice varieties with efficient root systems.

Keywords: Root system architecture, rice, diversity, adaptive grouping

Introduction

Rice (*Oryza sativa* L.) is a key food staple for the world population, significantly contributing to global food security. Approximately 90% of rice cultivation takes place in irrigated and lowland rainfed ecosystems in Asia, where it is vulnerable to several environmental challenges (Bindraban et al. 2015). Among these, soil-based abiotic stresses such as drought, nutrient starvation and soil salinization are most prominent. The impact of climate change can exacerbate soil-related abiotic stresses, making it particularly challenging to sustain field crop productivity, especially for rice (Hu et al. 2014).

Plant roots are the primary organs that sense and suffer from soil-derived stresses. Given their crucial role in the uptake and translocation of water and nutrients, a robust root system is essential for plant health (Uga et al. 2013). Root system architecture (RSA), the spatial configuration of a plant's root system in the soil, is vital for plant adaptation to the soil matrix, defining its ability to access water and nutrients, interact with soil microorganisms, and anchor itself. RSA includes root depth, length, branching, angle, density, and diameter. Similar to aerial parts of plants, RSA shows significant variation among different varieties, allowing them to adapt differently to various environmental conditions and stresses. Therefore, understanding and optimizing RSA is key to enhancing crop resilience and yield. Root developmental plasticity is an inherent adaptation of the plant that reflects its genetic potential and is crucial for modulating root system development (Malamy 2005). Governed by intrinsic constitutive pathways, root system development is both temporal and spatial as the plant grows, and stress factors influence it throughout the plant's

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growth period. A comprehensive understanding of RSA traits among rice varieties in different growing systems is critical for aiding breeding efforts aimed at enhancing climate resilience and sustaining yield under nutrient-limited conditions.

Despite the humongous success of modern plant breeding in securing food security, the genetic variability among cultivars rapidly eroded as new high-yielding cultivars replaced traditional low-yielding ones (Bhandari et al. 2017). A substantial part of the post-green revolution research was focused on above-ground agro-morphological features, particularly grain yield. The RSA has been largely ignored as a target trait in crop improvement programs, resulting in RSA diversity being less documented in rice germplasm. Additionally, the indirect impact of selection made during the green revolution era on the RSA remains poorly understood. Studying root systems is inherently challenging due to the requirement for destructive sampling. Among various methods for observing root systems, hydroponics and pot culture are widely used. Hydroponics offers a rapid, low-cost, and non-destructive means of evaluating root traits (Price et al. 1997), while pot culture provides more realistic soil-based conditions, albeit being more challenging, manual, destructive, and expensive (Vejchasarn et al. 2016). This study, while exploring the root phenotypic variation among a large panel of rice genotypes, also compares the RSA under both the above culture systems to delineate the relationships between root traits and growing environments.

Materials and methods

Plant material

The study utilized 281 rice germplasm of Indian origin included in the 3K rice genome project that had rice accessions from 89 countries (3000 Rice Genome Project, 2014). The Indian subset consisted of 60 *aus*, 13 Basmati, 171 *indica*, 21 tropical *japonica*, three temperate *japonica*, 12 intermediate types, and one unclassified *japonica* genotype. Additionally, five checks—Kalinga III (*indica*), Salumpikit (*indica*), IR64 (*indica*), Nagina 22 (*aus*), and Dagad Deshi (*indica*)—were also used. Among these, Salumpikit (Comas et al. 2013), Nagina 22 (Poli et al. 2013), and Dagad Deshi (Sinha et al. 2015) are drought-tolerant landraces with large and deep root systems, while Kalinga III (Steel et al. 2006) and IR64 (Uga et al. 2015) possess shallow root systems. All plant materials were sourced from the Genetics Division of ICAR-Indian Agricultural Research Institute (IARI), New Delhi. Details of the accessions are provided in Supplementary Table S1.

Growth environments

Two cultivation systems were used in the study: hydroponics and pot culture. Hydroponic cultivation was conducted at the National Phytotron Facility at IARI during the wet seasons of 2020 and 2021. Seeds of 286 lines were surface sterilized with 1% sodium hypochlorite (Sauer and Burroughs 1986) and pre-germinated in petri dishes for 3 days at 37°C. Germinated seedlings were carefully transferred into 100 mm² punch wells made in 25 mm thick rectangular expanded polystyrene sheets layered with nylon mesh underneath and floating on modified Yoshida nutrient solution (Supplementary Table S2) in rectangular plastic crates. The nutrient solution was replaced every seven days, maintaining a constant pH of 5.5 for 35 days under natural light. The experiment was designed as a completely randomized trial with two replications.

In the pot culture system, 286 genotypes were initially fieldgrown in raised bed nurseries as practiced in wetland rice cultivation and maintained for 21 days. Then, 21-day-old seedlings were transplanted into plastic pots filled with puddled sandy loam wetland soil. Each pot received one plant, which was allowed to grow until the flowering stage at the Nanaji Deshmukh Plant Phenomics Centre at IARI. The pots were arranged in a completely randomized design with three replications per genotype. The experiment was repeated twice during the *kharif* seasons of 2020 (June-September) and 2021 (June-September).

Phenotyping

After 35 days of hydroponic culture, individual plants were carefully removed from the wells, ensuring all roots remained intact. These plants were then placed on a plain glass surface, and the maximum root and shoot lengths were measured using a ruler; the sum of these measurements was taken as the plant height (PH). Subsequently, the roots were separated at the collar region and positioned in a transparent acrylic tray placed atop a desktop scanner (EPSON 11000 XL) for image acquisition. Images obtained from the scanner were analyzed using the WinRHIZO® system (Arsenault et al. 1995). RSA traits, such as primary root length (PRL) total root length (TRL), projected area (PA), surface area (SA), average diameter (AD), and root volume (RV) were measured (Bauhus and Messier 1999). The roots and shoots were then separately oven-dried at 55°C for 72 hours. The dry weights of the roots (RDW) and shoots (SDW) were determined. The combined weight of these components represented the total dry biomass (BM) of the seedlings.

Phenotyping from the pot culture system was conducted at the reproductive phase while the root system was fully active. Plants that had reached panicle initiation were carefully removed from the pots to ensure no damage to the roots. Prior to removal, agro-morphological data, including PH and number of tillers (NT), were recorded. The uprooted plants were then soaked overnight in a container filled with water. The following morning, the plant roots were meticulously rinsed under running water to remove any adhering soil. The shoot portion was carefully excised from the collar region while keeping the root system intact. The lengths of the shoot (SL) and root (RL) were measured from the collar region to their respective ends using a ruler and summed to obtain the PH. The RSA of the mature plants was also determined using digital scans, as previously described. Given the extensive root system of mature plants, the roots were radially dissected into smaller segments for easier handling. Data from these segments were aggregated to deduce the total RSA parameters for individual plants. Following root data acquisition, samples were oven-dried to determine their biomass traits, such as RDW and SDW.

Data analyses

The data were statistically analyzed to assess the phenotype variation and to evaluate the interrelations of various traits. All statistical analyses were performed in the R environment using various packages, as well as standalone software tools like STAR v2.0.1 (IRRI, 2014). Methods employed included mixed model analysis of variance (ANOVA), correlations, principal component analysis (PCA), and clustering. The genotypic best linear unbiased predictors (BLUEs) generated were used for performing PCA.

Results

Phenotypic variation of RSA and shoot traits

ANOVA performed separately on the phenotypic data collected under hydroponics and pot culture revealed significant variation (α = 0.05) between the genotypes for root and shoot traits under both growing systems. A descriptive summary of phenotypic variation for root and shoot traits under hydroponics and pot culture is represented in Table 1.

In hydroponics, the PH of the seedlings ranged from 29.3 to 73.5 cm, with an average of 52.6 cm. At panicle initiation, under pot culture conditions, PH ranged from 69.1 to 139.8 cm, with an average of 106.0 cm. NT of the mature plants ranged from 7.0 to 13.8, with an average of 10.2. Seedling SDW averaged 148.0 mg among all the genotypes, varying between 56.8 and 249.4 mg. The average SDW of the potcultured plants was 16.2 g, varying between 6.3 and 25.2 g. Among the root characteristics, PRL, with an average of 12.4 cm, ranged from 5.3 to 19.4 cm under hydroponics and from 17.4 to 39.3 cm under pot culture, with an average of 27.7 cm. RDW ranged from 11.0 to 53.1 mg, with an average of 30.9 mg in hydroponics, and from 0.4 to 2.2 g under pot culture, with an average of 1.3 g. TRL under hydroponics averaged 209.1 cm, ranging from 72.5 to 378.9 cm, while under pot culture, the average was 4913.9 cm, ranging from 1674.6 to 8214.6 cm. PA averaged 8.6 cm², falling between 3.3 and 15.0 cm² under hydroponics, and 223.6 cm², ranging from 76.6 to 413.8 cm² under pot culture. SA among the tested genotypes ranged from 10.4 to 47.1 cm² under hydroponics and from 240.8 to 1300.1 cm² under pot culture, with corresponding averages of 27.0 and 701.7 cm², respectively. AD ranged from 306.0 to 535.3 µm, with an average of 415.9 µm in hydroponics, and from 300.0 to 595.6 µm under pot culture, with an average of 452.0 μ m. RV ranged from 90.6 to 556.4 mm³, with an average of 283.3 mm³ in hydroponics, and from 265.0 to 1626.0 mm³ under pot culture, with an average of 810.0 $mm³$. The coefficient of variation (CV) for the traits under hydroponic screening ranged between 2.5% for SDW and 9.9% for RV, while CV under pot culture ranged between 3.1% for PH and 12.08% for NT.

Association among RSA and shoot traits

Pearson's correlation coefficients were found to be significant and positive among most of the traits under both hydroponic and pot culture screenings (Fig. 1). The magnitude of correlation was relatively higher under hydroponics than under pot culture. The shoot traits, PH and SDW, were strongly correlated with each other in both screenings and showed high positive correlations with several root traits, except for AD. The association of PH with AD was negative and significant under hydroponics, while they were uncorrelated under pot culture. Other RSA traits—primary root length (PRL), RDW, TRL, PA, SA and RV—indicated positive relationships among themselves, with very strong associations under hydroponics compared to pot culture. AD, however, showed weak negative to no correlations with RSA traits such as PRL, RDW, and TRL. The relation of AD with PA and SA was positive under pot culture but uncorrelated under hydroponic screening. No significant correlations were, however, found between both systems for any of the traits.

Stratification of total variation for genotype grouping

The PCA identified the first two principal components (PCs) accounting for 96.2% of total variation under the hydroponic and 76.5% of variation under pot culture (Fig. 2). Under the hydroponic system, the first PC accounted for 81.3% and the second PC, 14.9%. Major traits contributing to the PC1 were agronomic and root system traits such as PH, BM, PRL, TRL, PA, SA and RV, while AD alone was found to significantly contribute to the PC2. Under pot culture, the PC1 explained 61.5% of the total phenotypic variation, followed by 15% by PC2. The trait contributions trend was similar to that of the hydropic system but relatively with a lesser degree of influence (Supplementary Table 3). Among the PC1 contributing traits, PRL and PH had relatively less influence under both screening systems. Additionally, NT did not contribute significantly to PC1 under pot culture screening.

K-means clustering of the PC scores of the genotypes revealed two clusters each within the test panel, both the growth systems. In both the screening systems, cluster I comprised 119 genotypes. In comparison, cluster

Traits	Unit	System	Min	Max	Mean	Variance components			SE	CV%	
						σ^2_{σ}	$\sigma^2_{\ S}$	σ^2_{GS}	σ^2_{ε}		
PH	cm	H	29.3	73.5	52.6	$202.9**$			4.9	0.6	4.2
	cm	P	69.1	139.8	106.0	993.7**	14586.0	199.3	11.0	0.9	3.1
NT		P	7.0	13.8	10.2	$9.3***$	79.7	1.4	1.5	0.1	12.1
SDW	mq	н	56.8	249.4	148.0	4662.6**			13.9	2.9	2.5
	g	P	6.3	25.2	16.2	$84.2**$	73.7	11.1	1.5	0.3	7.4
RDW	mg	H	11.0	53.1	30.9	$232.7**$			4.3	0.6	6.7
	g	P	0.4	2.2	1.3	$0.7*$	4.3	0.1	0.0	0.0	6.4
PRL	cm	H	5.3	19.4	12.4	$17.1***$			0.4	0.2	5.2
	cm	P	17.4	39.3	27.7	84.8**	26.6	15.8	4.2	0.3	7.4
TRL	cm	H	72.5	378.9	209.1	9966.3**			81.8	4.2	4.3
	cm	P	1674.6	8214.6	4913.9	9403228.8**	15547148.5	665803.0	116891.2	90.8	7.0
PA	cm^2	H	3.3	15.0	8.6	$15.9***$			0.3	0.2	5.8
	cm ²	P	76.6	413.8	223.6	21547.7**	18723.3	2215.5	289.5	4.4	7.6
SA	cm ²	H	10.4	47.1	27.0	$156.6**$			2.4	0.5	5.8
	cm ²	P	240.8	1300.1	701.7	212038.5**	166655.1	21060.4	2798.5	13.6	7.5
AD	μm	н	306.0	535.3	415.9	$0.0**$			0.0	2.7	4.8
	μm	P	300.0	595.6	452.0	$0.0**$	0.0	0.0	0.0	3.4	3.1
RV	mm ³	H	90.6	556.4	283.3	$0.0**$			0.0	0.0	9.9
	mm ³	P	265.0	1626.0	810.0	$38.1**$	20.9	6.3	0.6	0.2	9.3

Table 1. Summary statistics of root and shoot traits under hydroponic (H) and pot culture (P) systems

PH = Plant height in cm; NT = number of tillers; SDW = Shoot dry weight in mg; RDW = Root dry weight in g; PRL = Primary root length in cm; TRL = Total = oot length in cm; PA = Projected root area in cm²; SA = Surface area in cm²; AD = Average root diameter in mm; RV = Root volume in mm³; H = Hydroponic; P = Pot culture; $\sigma_{\rm c}^2$, $\sigma_{\rm s}^2$, $\sigma_{\rm s}^2$ are variance components respectively for genotypes (G), seasons (S), genotype:season (GS) and residual (E); SE = Standard error of mean and CV% = coefficient of variation in %.

Fig. 1. Correlation matrices among root and shoot traits in hydroponics and in pot culture and between both systems

II contained 162 genotypes (Fig. 2). Cluster centroids indicated that, under hydroponics, cluster II genotypes had significantly higher mean values for all the traits except AD (Table 3). In the pot culture system, the cluster mean of the first cluster was found to be significantly higher than that

Fig. 2. Multivariate clustering followed by principal component analysis revealed significant contribution of traits towards major principal components in (a) hydroponics and (b) pot culture. Two clusters were identified in both the evaluation systems, (c) hydroponics and (d) pot culture, with common genotypes shared across the methods shown in a Venn diagram (e)

of cluster II for all the traits. There was a marked departure of genotypes between clusters across the culture systems.

Visually illustrating the relationships and overlaps between the different clusters, the Venn diagram (Fig. 2e) under both growing systems indicated that cluster I

PH = Plant height in cm; NT = Number of tillers; SDW = Shoot dry weight in mg; RDW = Root dry weight in g; PRL = Primary root length in cm; TRL = Total root length in cm; PA = Projected root area in cm²; SA = Surface area in cm²; AD = Average root diameter in mm and RV = Rroot volume in mmª

of hydroponics shared 48 genotypes with cluster I of pot culture. Similarly, cluster II of both the culture systems had 91 genotypes in common. The overlapping region between cluster I in hydroponics and cluster II in pot culture and vice-versa contained 71 genotypes, making a total of 142 genotypes (50.5%) getting cross-classified among the clusters between both the screening systems.

Varietal and spatial patterns among the root system clusters

Based on root system traits, the two genotype clusters each contained six varietal patterns, equally distributed except for the *indica* group in pot culture. The chi-square probability indicated no significant difference in class frequency (Table 4). Both clusters comprised 21% *Aus*/*Boro* types, 5% Basmati/ Sadri types, 61% *indica*, 4% intermediates, 1% temperate *japonica*, and 8% tropical *japonica* types.

A similar pattern emerged when genotypes were grouped by their place of origin (Fig. 3). The current assembly's genotypes originated from 32 locations, including four outside India. Each foreign location had one genotype. Of the remaining 28 Indian locations, one group was labeled 'Location uncertain,' and another broadly as 'Northeast India' without assigning to a specific state. The remaining 86% of genotypes came from 26 Indian states. Under both screening systems, the distribution of cluster I and cluster II genotypes across the states was nonsignificant, except for a few states such as Assam, Manipur, and Meghalaya under hydroponic culture, and the genotype groups from location uncertain, Chhattisgarh, and Kerala under pot culture (Supplementary Table S4).

Discussion

Root system architecture is a crucial heritable trait that must be emphasized in breeding programs. Unlike shoot phenotyping, root phenotyping presents significant challenges (Uga 2021). As the root system is the primary sensor of water and nutrient imbalances in the soil, as well as other edaphic factors such as salinity, acidity, metal toxicity, oxygen status, and soil temperature, understanding root system variability, is essential for determining genotypes' plasticity in confronting challenging soil conditions. By evaluating the diversity of root system architectural traits in various rice accessions, breeders can identify and select the most promising genotypes for future breeding and improvement (Guimarães et al. 2020). Although identified as a priority area, research on root adaptive mechanisms (Panda et al. 2021) has a relatively short history in crop improvement.

*Significant at 5% level

Fig. 3. Distribution of cluster I and cluster II genotypes at their geographical origins in India. Red pies indicate the proportion of cluster I genotypes under hydroponic culture, and green pies indicate the same under pot culture. The white sector indicates cluster II proportions

This is particularly significant in semi-aquatic crops like rice, where the root system adapts to a broad range of growth conditions, from upland to lowland, aerobic to submerged, and various cropping systems, such as direct seeding to transplanting.

The current investigation, therefore, scrutinizes the phenotypic diversity among the genotype panel and examines the pattern of diversity among different varietal groups and locations of origin. The panel itself was random but were members of an already existing 3K rice genome assembly. Only Indian origin genotypes were selected and were spread across all the regions of India. It was hypothesized that if adaptive patterns exist within the varietal groups or spatial regions, root system diversity would show deviations aligning with such patterns. Such alignment would be phenotypic rather than genotypic. If no alignment pattern emerges, it suggests that no adaptive root system changes have been introduced through breeding, at least within the varietal or spatial origin of the genotypes.

Two culture systems were used in the study: hydroponics and pot culture. Hydroponics, a soil-free growth management system, allows plants to grow and be managed easily under controlled environments (Gericke 1940). It is widely used for experimental and commercial cultivation of both dicots and monocots (Jones 1982). The hydroponic system offers unrestricted opportunities for plant roots to grow and access nutrients from the surrounding growth media. However, it provides minimal root anchorage since plants float over the nutrient mixture (Butler and Oebker 1962). In rice, hydroponics provides root submergence as in the semi-aquatic environment, making it ideal for root system studies, particularly at the seedling stage (Sharma et al. 2018). However, hydroponics does not replicate the actual rice-growing environment where plants are anchored to a soil matrix that remains submerged throughout the crop duration.

Pot culture is, therefore, the next best alternative to simulate field conditions while maintaining close management under a controlled environment. This system ensures maximum similarity to field conditions, including soil puddling and transplanting 35-day-old seedlings. The nutrient profile of the main field is maintained in individual pots, and standing water is retained as in open fields. The advantage of the pot culture system is the ability to harvest the total root system without any loss, which is difficult to achieve under field conditions. However, root extraction is cumbersome and requires careful washing to remove the soil adhering to the roots. By providing two different growth environments in the current study, root system responses under both conditions and at different crop growth phases could be observed. The hydroponic system provided early root responses, while pot culture facilitated responses up to the reproductive stage.

As anticipated, significant variability in the root system was observed among genotypes under both screening systems. The most substantial deviations were noted in total root length, root surface area, and root diameter across all genotypes and culture systems. This indicates that these traits exhibited the most stable expression and accounted for the greatest variation in root system architecture, regardless of the cultural environment. Notably, root diameter demonstrated a poor correlation with other root traits, signifying its independence from common root system characteristics such as root length and biomass. This phenomenon is attributed to the varying root diameters along different root lengths at various root levels, as documented in several cereals, including maize (Wu et al. 2016).

The correlation between the two screening methods was found to be weak, primarily due to significant differences in the growing environments, growth mediums, and developmental stages used during the screening procedure. These distinct characteristics were critical in minimizing potential correlations between the traits studied. Similar findings were reported by Saengwilai et al. (2018) in their study comparing the phenotypic variation of root traits in Thai rice.

The root system traits exhibited maximum variation across both culture systems, with no correlation between them, providing an ideal scenario for analyzing root system variation among genotypes. Two distinct clusters were identified under each system, with overlapping genotypes showing less consistent patterns between them. When considering the common genotypes shared between clusters in both culture systems, Cluster I of the hydroponic system had 17% of its genotypes in common with Cluster I of the pot culture and 25% with Cluster II. Similarly, Cluster II of the hydroponic system shared 33% of its genotypes with Cluster II of the pot culture and 25% with Cluster I. This highlights significant deviations between the pot culture and hydroponic systems, likely influenced by the crop growth stage and growth conditions. The root system pattern in hydroponics primarily reflected the seedling stage, whereas in pot culture, it reflected the reproductive stage, characterized by a more robust root system compared to the former. Root system plasticity is a characteristic feature of the adaptive response in rice, where root patterns adjust to phenological stages, cultivation environments, and stress factors (Sandhu et al. 2016). Thus, in this study, we integrated responses from two growth stages and two different cultivation systems to maximize the variability among genotypes for root system traits. Previous studies have shown that increasing total root length, root dry weight, and root volume can enhance plant growth under reduced nitrogen conditions (Guan et al. 2022) and improve the ability of plants to extract water and nutrients from complex soils (Kawai et al. 2022). In our study, genotypes Bokdel, Ratnagiri 45-2, Kanpuri, ARC 12067, Dodgui, Dhaniya Phool, Banikat, and Lal Taura exhibited high total root length and root dry weight in both systems while also expressing finer roots indicated by low root diameter. Genotypes Chundi, ARC 10799, Perunel, ARC 10028, W 398, ARC 18112, and ARC 10100 were found to have thicker and longer roots. Genotypes with robust root systems are known for their tolerance to various abiotic stresses (Khan et al. 2016). It would be valuable to evaluate the potential tolerance of these genotypes to different stress factors. Understanding these genotype patterns is essential for advancing plant breeding applications. Liao et al. (2022) reported that fine root diameters with long specific root lengths can penetrate dry, compacted soils, allowing root systems to grow deeper and maintain plant productivity under drought stress (Comas et al. 2013).

Having maximized the root diversity expression, we examined whether any adaptation pattern exists within the panel when classified into varietal groups or based on locations of origin. If adaptation is present, a skewed distribution of clusters within these classes would be observed; otherwise, an equal distribution is expected. Chisquare analyses on the frequency distribution of clusters within each class revealed predominantly insignificant variation, indicating no specific adaptation associated with either varietal classes or locations of origin. However, there were exceptions, such as the *indica* group in pot culture, which showed a skewness towards cluster II, and certain classes based on original locations, such as Kerala, Chhattisgarh, and locations marked as uncertain. The root system among cluster I and cluster II genotypes, comprising 61% and 39% of the *indica* group, respectively, indicated selective adaptation to pot culture, which was absent under hydroponics. Surprisingly, cluster I exhibited better average root system performance than cluster II. This implies that there have been marginal changes in root system traits within the *indica* group, resulting in a slight but distinct behavior under pot culture conditions. Although this was the largest subgroup in the panel, the next largest subgroup, *Aus/Boro*, did not exhibit similar behavior. The variations found among the location classes appeared random or could be attributed to factors such as low genotype representation for these classes.

Understanding root system architecture diversity can uncover desirable traits and lead to the development of novel rice varieties with efficient root systems through plant breeding. These enhanced root systems improve resource utilization, plant growth, drought tolerance, and adaptability. Our study suggested that germplasm exhibited considerable variation in root traits under both hydroponics and pot culture but with limited improvements over time. This highlights significant opportunities for the enhancement of these traits. The findings from this study call for further investigation into root system traits to achieve adaptive improvements in response to temporal enhancements in above-ground plant biomass. This requires examining a larger panel and associating molecular patterns with these variations to improve the efficiency and effectiveness of root breeding programs.

Supplementary material

Supplementary Tables S1 to S4 are provided, which can be accessed at www.isgpb.org

Authors' contribution

Conceptualization of research (KKV, AKS); Designing of the experiments (KKV, KNG, VC); Contribution of experimental materials (RKE, AK); Execution of field/lab experiments and data collection (KNG, PKB, RP, SK); Analysis of data and interpretation (KNG, KKV, GKS, RKE, HP); Preparation of the manuscript (KNG, KKV).

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Supplementary Table S1. Particulars of genotypes used in the study

Supplementary Table S2*.* **Composition of Modified Yoshida (stock and culture) nutrient solution**

Traits		Hydroponic screen	Pot culture screen		
	PC ₁	PC ₂	PC ₁	PC ₂	
PH	11.47	0.26	11.59	3.06	
NT	\sim	٠	1.33	4.44	
PRL	12.24	1.62	4.02	0.02	
RDW	13.07	1.69	13.01	2.02	
SDW	13.12	1.67	12.90	5.72	
TRL	13.12	1.84	14.46	3.18	
PA	13.16	2.12	15.24	2.39	
SA	13.16	2.11	15.25	2.35	
AD	0.13	72.77	0.15	61.52	
RV	10.53	15.93	12.05	15.29	

Supplementary Table S3. Contribution of traits towards the major principal components derived from the root and morphological data from principal component analysis

PH = Plant height in cm; NT = Number of tillers; SDW = Shoot dry weight in mg; RDW = Root dry weight in g; PRL = Primary root length in cm; TRL = Total root length in cm; PA = Projected root area in cm²; SA = Surface area in cm²; AD = Average root diameter in mm and RV = Rroot volume in mmª

Prop, proportion of Cluster 1 to the total