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Analysis of Population Structure and Genetic Diversity in Rice Germplasm Using SSR Markers: An Initiative Towards Association Mapping of Agronomic Traits in *Oryza Sativa*

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Abstract

Background: Genetic diversity is the main source of variability in any crop improvement program. It serves as a reservoir for identifying superior alleles controlling key agronomic and quality traits through allele mining/ association mapping. Association mapping based on LD (Linkage dis-equilibrium), non-random associations between causative loci and phenotype in natural population is highly useful in dissecting out genetic basis of complex traits. For any successful association mapping program, understanding the population structure and assessing the kinship relatedness is essential before making correlation between superior alleles and traits. The present study was aimed at evaluating the genetic variation and population structure in a collection of 192 rice germplasm lines including local landraces, improved varieties and exotic lines from diverse origin.

Results: A set of 192 diverse rice germplasm lines were genotyped using 61 genome wide SSR markers to assess the molecular genetic diversity and genetic relatedness. Genotyping of 192 rice lines using 61 SSRs produced a total of 205 alleles with the PIC value of 0.756. Population structure analysis using model based and distance based approaches revealed that the germplasm lines were grouped into two distinct subgroups. AMOVA analysis has explained that 14 % of variation was due to difference between with the remaining 86 % variation may be attributed by difference within groups.

Conclusions: Based on these above analysis viz., population structure and genetic relatedness, a core collection of 150 rice germplasm lines were assembled as an association mapping panel for establishing marker trait associations.

Keywords: Rice; Genetic diversity; Population structure; Polymorphism information content; Molecular variance; Association mapping

Background

Rice, being the staple food crop for more than 50 % of the world population is cultivated in 163 million hectares with the production of 491 million tonnes. About 90 % of the world's rice is produced in Asia and India contributes 20 % of the world's production. This record level production and productivity is due to the availability

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and exploitation of rich genetic diversity existing in rice germplasm of India. For precise genetic manipulation of complex quantitative traits like, yield, tolerance against biotic/abiotic stresses, quality etc., understanding the genetic/molecular basis of target traits needs to be investigated thoroughly.

The genetic basis of important agronomic traits has been unraveled through Quantitative Trait Loci (QTL) mapping either through linkage mapping (bi-parental mapping populations) or through LD mapping (natural populations). Although traditional linkage based QTL-

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mapping has become an important tool in gene tagging of crops, it has few limitations viz., 1) classical linkage mapping involves very high cost; 2) it has low resolution as it can resolve only a few alleles and 3) it has limitations towards fine mapping of QTLs as it needs BC-NILs. These limitations can be overcome by the LD based approach of "Association Mapping" using the natural populations. Association mapping serves as a tool to mine the elite genes by structuring the natural variation present in a germplasm. It was successfully exploited in various crops such as rice, maize, barley, durum wheat, spring wheat, sorghum, sugarcane, sugarbeet, soybean, grape, forest tree species and forage grasses (Abdurakhmonov and Abdukarimov 2008).

Before performing an association analysis in a population, it is essential to determine the population structure which can reduce type I and II errors in association mapping due to unequal allele frequency distribution between subgroups that causes spurious association between molecular markers and trait of interest (Pritchard et al. 2000). Similar attempts were recently undertaken to define population structure in rice using different germplasm lines and by developing core collection from national collections and international collections (Ebana et al. 2008; Jin et al. 2010; Zhang et al. 2011; Agrama et al. 2010 and Liakat Ali et al. 2011). Simple Sequence repeat (SSR) markers have been commonly used in genetic diversity studies in rice because of high level of polymorphism which helps to establish the relationship among the individuals even with less number of markers (McCouch et al. 1997). For similar studies, SSR markers were used alone by Jin et al. (2010); Hesham et al. (2008); Sow et al. (2014); Das et al. (2013) and Choudhury et al. (2013) or along with SNP markers by Courtois et al. (2012) and Zhao et al. (2011). The objectives of this present study were to evaluate the genetic variation and to examine the population structure of 192 rice germplasm accessions that comprises of local landraces, improved varieties and exotic lines from diverse origin.

Results

Genetic Diversity

All the 192 rice germplasm lines were genotyped using 61 SSR (microsatellite) markers which produced a total of 205 alleles (Additional file 1: Figure S1). Among these 205 alleles, 5 % were considered as rare (showed an allele frequency of < 5 %). The number of alleles per loci varied from 2 to 7 with an average of 3 alleles per locus. The highest number of alleles were detected for the loci RM316 (7) and the lowest was detected for a group of markers viz., RM171, RM284, RM455, RM514, RM277, RM 5795, HvSSR0247, RM 559, RM416 and RM1227. PIC value represents the relative informativeness of each marker and in the present study, the average PIC value was found to be 0.468. The highest genetic diversity is explained by the landraces included in this study with the mean PIC value of 0.416. PIC values ranged between 0.146 for RM17616 to 0.756 for RM316. Heterozygosity was found to be very low which may be due to autogamous nature of rice. Expected heterozygosity or Gene diversity (H_e) computed according to Nei (1973) varied from 0.16 (RM17616) to 0.75 (RM287) with the average of 0.52 (Table 1).

STRUCTURE Analysis

Population structure of the 192 germplasm lines was analysed by Bayesian based approach. The estimated membership fractions of 192 accessions for different values of k ranged between 2 and 5 (Fig. 1). The log like-lihood revealed by structure showed the optimum value as 2 (K = 2). Similarly the maximum of adhoc measure ΔK was found to be K = 2 (Fig. 2), which indicated that the entire population can be grouped into two subgroups (SG1 and SG2). Based on the membership fractions, the accessions with the probability of ≥ 80 % were assigned to corresponding subgroups with others categorized as admixture (Fig. 3).

SG1 consisted of 134 accessions with most of the landraces and varieties of Indian origin and SG2 consisted of 38 accessions which composed of non Indian accessions. Twenty accessions were retained to be admixture. The subgroup SG1 was dominated by indica subtype whereas the subgroup SG2 consisted mostly of japonica group. When the number of subgroups increased from two to five, the accessions in both the subgroups were classified into sub-sub groups (Table 2). As SG1 consisted of 134 accessions mostly of Indian origin, an independent STRUCTURE analysis was performed for this subgroup. ΔK showed its maximum value for K =3 which indicated that SG1 could be further classified into three sub-sub groups (Fig. 4). The differentiation in origin and seasonal differentiation of rice varieties contributed for this clustering.

Clustering analysis based on Unweighted Pair Group Method with Arithmetic Mean (UPGMA) method using DARwin separated the accessions into two main groups which showed similar results as STRUCTURE analysis. The group I in UPGMA tree consists of both indigenous and agronomically improved varieties whereas the other group consists of exotic accessions. In UPGMA tree, the accessions within group 1 and 2 clustered into smaller sub groups based on their origin and types. Most of the landraces and varieties have been clustered in upper branches of the tree whereas the exotic accessions have been clustered in lower branches of the tree (Fig 5). Hence the clustering analysis by two classification methods revealed high level of similarity in clustering the genotypes. PCoA was used to characterize the

Table 1 Details of SSR loci used for genotyping in the 192 rice accessions and their genetic diversity parameters	eters
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S. no	Marker	Chromosome no.	SSR MOTIF	Min molecular weight	Maximum molecular weight	Number of alleles	Gene diversity	Heterozygosity	PIC value
1	RM237	1	(CT)18	110	143	4	0.61	0.89	0.545
2	RM1	1	(GA)26	70	105	3	0.63	0.12	0.552
3	RM5	1	(GA)14	105	115	3	0.64	0.6	0.557
4	RM312	1	(ATTT)4(GT)9	95	105	3	0.3	0.03	0.281
5	RM283	1	(GA)18	149	155	3	0.42	0.02	0.377
6	RM452	2	(GTC)9	195	245	3	0.54	0.83	0.448
7	HvSSR0247	2		395	400	2	0.5	0.18	0.373
8	RM555	2	(AG)11	135	145	3	0.59	0.04	0.517
9	RM211	2	(TC)3A(TC)18	140	160	3	0.52	0.08	0.463
10	RM324	2	(CAT)21	135	180	5	0.74	0.06	0.695
11	RM514	3	(AC)12	245	252	2	0.19	0	0.171
12	RM55	3	(GA)17	220	225	3	0.44	0.07	0.4
13	RM231	3	(CT)16	170	200	3	0.59	0.12	0.511
14	RM416	3	(GA)9	110	115	2	0.42	0.01	0.335
15	RM442	3	(AAG)10	260	275	3	0.5	0.03	0.448
16	RM 16643	4	(GGGA)5	165	200	5	0.73	0.05	0.685
17	RM 559	4	(AACA)6	160	165	2	0.39	0.01	0.311
18	RM17377	4	(AG)25	140	175	4	0.67	0.04	0.625
19	RM7585	4	(TCTT)6	140	160	4	0.46	0.02	0.422
20	RM17616	4	(TC)14	165	180	3	0.16	0	0.146
21	RM413	5	(AG)11	75	100	4	0.59	0.25	0.548
22	RM178	5	(GA)5(AG)8	110	115	3	0.39	0.04	0.35
23	RM 161	5	(AG)20	160	180	3	0.29	0.04	0.258
24	RM7293	5	(ATGT)6	140	150	3	0.64	0.1	0.558
25	RM1024	5	(AC)13	125	140	3	0.32	0.02	0.298
26	RM 162	6	(AC)20	220	240	3	0.37	0.03	0.34
27	RM7434	6	(GTAT)10	120	145	5	0.66	0.19	0.614
28	RM19620	6	(GTG)7	160	177	3	0.21	0.03	0.204
29	RM5963	6	(CAG)9	160	175	3	0.48	0.15	0.38
30	RM11	7	(GA)17	120	150	4	0.71	0.72	0.661
31	RM118	7	(GA)8	155	185	4	0.62	0.77	0.543
32	RM125	7	(GCT)8	105	130	4	0.61	0.89	0.544
33	RM455	7	(TTCT)5	130	135	2	0.24	0.02	0.208
34	HvSSR0740	7		340	400	4	0.7	0.21	0.65
35	RM44	8	(GA)16	95	107	4	0.62	0.77	0.559
36	RM433	8	(AG)13	235	270	3	0.55	0.81	0.446
37	RM447	8	(CTT)8	105	120	4	0.64	0.16	0.572
38	RM284	8	(GA)8	140	145	2	0.21	0.02	0.189
39	RM408	8	(CT)13	120	125	3	0.52	0.01	0.465
40	RM25	8	(GA)18	120	140	4	0.73	0.37	0.679
41	RM256	8	(CT)21	125	140	4	0.73	0	0.681
42	RM105	9	(CCT)6	100	140	3	0.41	0.48	0.37
43	RM107	9	(GA)7	280	300	3	0.48	0	0.425

44	RM 215	9	(CT)16	140	150	3	0.6	0.01	0.528
45	RM 316	9	(GT)8-(TG)9(TTTG)4(TG)4	160	235	7	0.79	0.75	0.756
46	RM205	9	(CT)25	110	140	4	0.72	0	0.665
47	RM171	10	(GATG)5	320	330	2	0.24	0.02	0.211
48	RM271	10	(GA)15	90	99	3	0.66	0.19	0.588
49	RM590	10	(TCT)10	120	140	4	0.57	0.04	0.516
50	RM474	10	(AT)13	240	280	3	0.61	0	0.537
51	RM222	10	(CT)18	200	220	3	0.63	0.02	0.557
52	RM144	11	(ATT)11	160	240	5	0.69	0.18	0.644
53	RM287	11	(GA)21	95	110	5	0.75	0.2	0.706
54	RM 536	11	(CT)16	240	270	5	0.74	0.06	0.701
55	RM224	11	(AAG)8(AG)13	120	155	5	0.65	0.07	0.617
56	RM206	11	(CT)21	130	145	4	0.34	0	0.319
57	RM277	12	(GA)11	115	120	2	0.45	0.08	0.35
58	RM 5795	12	(AGC)8	140	145	2	0.5	0.03	0.374
59	RM1227	12	(AG)15	160	180	2	0.31	0.02	0.262
60	RM20A	12	(ATT)14	220	240	3	0.54	0	0.476
61	RM2197	12	(AT)23	135	140	2	0.44	0	0.341
	Average		· · · /			3	0.52	0.18	0.468
						5	0.02	00	000

Table 1 Details of SSR loci used for genotyping in the 192 rice accessions and their genetic diversity parameters (Continued)

subgroups of the germplasm set. A two- dimensional scatter plot involving all 192 accessions has shown that the first two PCA axes accounted for 12.6 and 4.9 % of the genetic variation among populations (Fig 6).

Genetic Variance Analysis

The hierarchial distribution of molecular variance by AMOVA and pair-wise analysis revealed highly significant genetic differentiation among the groups. It revealed that 14 % of the total variation was between the groups, while 86 % was among individuals within groups (Tables 3 and 4). Calculation of Wright's F statistic at all SSR loci revealed that F_{IS} was 0.50 and F_{IT} was 0.56. Determination of F_{ST} for the polymorphic loci across all accessions has shown F_{ST} as 0.14 which implies high genetic variation (Table 4). The pairwise F_{ST} estimate among sub-groups has indicated that the two groups are significantly different from each other (Table 3).

Discussion

Genetic diversity is the key determinant of germplasm utilization in crop improvement. Population with high level of genetic variation is the valuable resource for broadening the genetic base in any breeding program. The panel of 192 accessions in this study with landraces, varieties as well as breeding lines has different salient agronomic traits. Few landraces included in this study *i.e.*, Mappillai samba (Krishnanunni et al. 2015), Jyothi, Njavara (Deepa et al. 2008), Kavuni (Valarmathi et al. 2015) derived breeding line has therapeutic properties. Many lines included in this study are drought tolerant (Nootripathu, Norungan, Vellaikudaivazhai, kallundaikar, kodai, kalinga 3, Kinandang patong, azucena, mattaikar, IR65907-116-1, karuthakar, mattakuruvai, manavari, kalundai, kodaikulathan, kattikar, poongar, thogai samba, vellaikattai, kattukuthalam, kalvalai, chivapu chithiraikar, vellai chithiraikar, kudaivazhai and murugankar). Few lines have significant level of micronutrients in it (Nachimuthu et al. 2014). This panel has its importance because of its major component as traditional landraces with valuable agronomic traits that are cultivated in the small pockets of Tamil Nadu, India.

Molecular markers help us to understand the level of genetic diversity that exists among traditional races, varieties and exotic accessions which can be exploited in rice breeding programs. The genetic architecture of diverse germplasm lines can be precisely estimated by assessing the STRUCTURE of the population using molecular markers viz., SSRs or SNPs etc., (Horst and Wenzel 2007; Powell et al. 1996; Varshney et al. 2007). In this study, the genetic diversity among the accessions was evaluated by model based clustering and distance based clustering approach using the SSR genotypic data.

Regarding genetic divergence of the population consisting of local landraces, exotic cultivars and breeding lines, 61 polymorphic markers have detected a total of 205



alleles across 192 individuals. The number of alleles varied from 2 to 7 per locus and the average was 3 alleles per locus. Several previous reports have indicated the number of alleles per locus, polymorphic information content and gene diversity of 4.8-14.0, 0.63-0.70 and 6.2-6.8 respectively (Garris et al. 2005; Ram et al. 2007). In the current study, the average number of alleles (3 alleles/locus) is slightly lesser than the average number of alleles (3.88 alleles/ locus) reported by Zhang et al. (2011) in rice core collection with 150 rice varieties from south Asia and Brazil and Jin et al. (2010) who has reported the average alleles per locus as 3.9 in 416 rice accessions collected from China. Using three sets of germplasm lines (Thai (47), IRRI germplasm (53) amd other Oryza species (5)), Chakhonkaen et al. (2012) has reported 127 alleles for all loci, with a mean of 6.68 alleles per locus, and a mean Polymorphic Information Content (PIC) of 0.440 by screening with 19 InDel markers.

Chen et al. (2011) has reported the average gene diversity of 0.358 and polymorphic information content of 0.285 from 300 rice accessions from different rice growing areas of the world with 372 SNP markers. The gene diversity detected in this study (0.52) is comparable to overall gene diversity of rice core collection (0.544) from China, North Korea, Japan, Philippines, Brazil, Celebes, Java, Oceanina and Vietnam (Zhang et al. 2011) and it is higher than US accession panel with average gene diversity of 0.43 (Agrama and Eizenga 2008) and Chinese rice accession panel by Jin et al. (2010) with the average gene diversity of 0.47. The gene diversity reported in our study is lesser than gene diversity (0.68) reported by (Liakat Ali et al. 2011). Most of the diversity panel with global accessions has the gene diversity of 0.5 to 0.7 (Garris et al. 2005; Liakat Ali et al. 2011; Ni et al. 2002). These results on global accessions help to infer that this diversity panel of 192 germplasm lines represents a large proportion of the genetic diversity that exists in major rice growing Asian continent.

The PIC value was 0.468 which varied from 0.146 for RM17616 with only 2 two alleles to 0.756 for RM316





RG43

RPHP 129

G. no.	Genotypes	Inferred ance	stry	Structure group	Subtype	
		Q1	Q2			
RG1	Mapillai samba	0.977	0.023	SG1	Indica	
RG2	CK 275	0.991	0.009	SG1	Indica	
RG3	Senkar	0.992	0.008	SG1	Indica	
RG4	Murugankar	0.964	0.036	SG1	Indica	
RG5	CHIR 6	0.811	0.189	SG1	Indica	
RG6	CHIR 5	0.989	0.011	SG1	Indica	
RG7	Kudai vazhai	0.975	0.025	SG1	Indica	
RG8	CHIR 8	0.759	0.241	SG1	Indica	
RG9	Kuruvai kalanjiyam	0.971	0.029	SG1	Indica	
RG10	Nava konmani	0.99	0.01	SG1	Indica	
RG11	CHIR 10	0.869	0.131	SG1	Indica	
RG12	Vellai chithiraikar	0.802	0.198	SG1	Indica	
RG13	CHIR 2	0.983	0.017	SG1	Indica	
RG14	Jothi	0.992	0.008	SG1	indica	
RG15	Palkachaka	0.962	0.038	SG1	indica	
RG16	Thooyala	0.934	0.066	SG1	indica	
RG17	Chivapu chithiraikar	0.994	0.006	SG1	indica	
RG18	CHIR 11	0.976	0.024	SG1	indica	
RG19	Koolavalai	0.99	0.01	SG1	indica	
RG20	Kalvalai	0.982	0.018	SG1	indica	
RG21	Mohini samba	0.963	0.037	SG1	indica	
RG22	IR 36	0.989	0.011	SG1	indica	
RG23	Koombalai	0.975	0.025	SG1	indica	
RG24	Tadukan	0.674	0.326	AD	indica	
RG25	Sorna kuruvai	0.986	0.014	SG1	indica	
RG26	Rascadam	0.637	0.363	AD	indica	
RG27	Muzhi karuppan	0.991	0.009	SG1	indica	
RG28	Kaatukuthalam	0.828	0.172	SG1	indica	
RG29	Vellaikattai	0.987	0.013	SG1	indica	
RG30	Poongar	0.987	0.013	SG1	indica	
RG31	Chinthamani	0.985	0.015	SG1	indica	
RG32	Thogai samba	0.975	0.025	SG1	indica	
RG33	Malayalathan samba	0.701	0.299	AD	indica	
RG34	RPHP 125	0.986	0.014	SG1	indica	
RG35	CK 143	0.993	0.007	SG1	indica	
RG36	Kattikar	0.913	0.087	SG1	indica	
RG37	Shenmolagai	0.994	0.006	SG1	indica	
RG38	Velli samba	0.887	0.113	SG1	indica	
RG39	Kaatu ponni	0.975	0.025	SG1	indica	
RG40	kakarathan	0.989	0.011	SG1	indica	
RG41	Godavari samba	0.941	0.059	SG1	indica	
RG42	Earapalli samba	0.978	0.022	SG1	indica	

0.01

0.99

SG2

indica

 Table 2 Population structure group of accessions based on Inferred ancestry values

Table 2 Population structure group of accessions based on Inferred ancestry values (Continued)

	5		,		
RG44	Mangam samba	0.968	0.032	SG1	indica
RG45	RPHP 105	0.943	0.057	SG1	indica
RG46	IG 4(EC 729639- 121695)	0.977	0.023	SG1	indica
RG47	Machakantha	0.976	0.024	SG1	indica
RG48	Kalarkar	0.992	0.008	SG1	indica
RG49	Valanchennai	0.972	0.028	SG1	indica
RG50	Sornavari	0.957	0.043	SG1	indica
RG51	RPHP 134	0.909	0.091	SG1	indica
RG52	ARB 58	0.987	0.013	SG1	indica
RG53	IR 68144-2B-2-2-3-1-127	0.708	0.292	AD	indica
RG54	PTB 19	0.981	0.019	SG1	indica
RG55	IG 67(EC 729050- 120988)	0.957	0.043	SG1	indica
RG56	RPHP 59	0.031	0.969	SG2	Aromatic
RG57	RPHP 103	0.656	0.344	AD	Aromatic
RG58	Kodaikuluthan	0.828	0.172	SG1	indica
RG59	RPHP 68	0.981	0.019	SG1	indica
RG60	Rama kuruvaikar	0.985	0.015	SG1	indica
RG61	Kallundai	0.939	0.061	SG1	indica
RG62	Purple puttu	0.994	0.006	SG1	indica
RG63	IG 71(EC 728651- 117588)	0.823	0.177	SG1	aus
RG64	Ottadaiyan	0.994	0.006	SG1	indica
RG65	IG 56(EC 728700- 117658	0.435	0.565	AD	Aromatic
RG66	Jeevan samba	0.876	0.124	SG1	indica
RG67	RPHP 106	0.915	0.085	SG1	indica
RG68	IG 63(EC 728711- 117674)	0.049	0.951	SG2	Tropical Japonica
RG69	RPHP 48	0.025	0.975	SG2	Aromatic
RG70	Karthi samba	0.987	0.013	SG1	indica
RG71	IG 27(IC 0590934- 121255)	0.444	0.556	AD	indica
RG72	Aarkadu kichili	0.99	0.01	SG1	indica
RG73	Kunthali	0.969	0.031	SG1	indica
RG74	ARB 65	0.83	0.17	SG1	indica
RG75	IG 21(EC 729334- 121355)	0.091	0.909	SG2	japonica
RG76	Matta kuruvai	0.934	0.066	SG1	indica
RG77	Karuthakar	0.994	0.006	SG1	indica
RG78	RPHP 165	0.99	0.01	SG1	indica
RG79	Manavari	0.704	0.296	AD	indica
RG80	IG 66(EC 729047- 120985)	0.992	0.008	SG1	indica
RG81	CB-07-701-252	0.977	0.023	SG1	indica
RG82	Thooyamalli	0.994	0.006	SG1	indica
RG83	RPHP 93	0.153	0.847	SG2	indica
RG84	Velsamba	0.99	0.01	SG1	indica
RG85	RPHP 104	0.898	0.102	SG1	indica
RG86	RPHP 102	0.993	0.007	SG1	indica
RG87	IG 40(EC 728740- 117705)	0.98	0.02	SG1	indica
RG88	Saranga	0.988	0.012	SG1	indica

Table 2 Population structure group of accessions based on Inferred ancestry values (Continued)

RG89	IR 83294-66-2-2-3-2	0.125	0.875	SG2	japonica
RG90	IG 61(EC 728731- 117696)	0.843	0.157	SG1	indica
RG91	IG 23(EC 729391- 121419)	0.852	0.148	SG1	Aus
RG92	IG 49(EC 729102- 121052)	0.945	0.055	SG1	indica
RG93	uppumolagai	0.987	0.013	SG1	indica
RG94	Karthigai samba	0.993	0.007	SG1	indica
RG95	Jeeraga samba	0.685	0.315	SG1	indica
RG96	RP-BIO-226	0.833	0.167	SG1	indica
RG97	Varigarudan samba	0.975	0.025	SG1	indica
RG98	IG 5(EC 729642- 121698)	0.012	0.988	SG2	japonica
RG99	IG 31(EC 728844- 117829)	0.813	0.187	SG1	indica
RG100	IG 7(EC 729598- 121648)	0.008	0.992	SG2	japonica
RG101	RPHP 52	0.991	0.009	SG1	indica
RG102	Varakkal	0.958	0.042	SG1	indica
RG103	Mattaikar	0.732	0.268	AD	indica
RG104	IG 53(EC 728752- 117719)	0.005	0.995	SG2	Temperate japonica
RG105	IG 6(EC 729592- 121642)	0.204	0.796	SG2	Temperate japonica
RG106	Katta samba	0.872	0.128	SG1	indica
RG107	RH2-SM-1-2-1	0.606	0.394	AD	indica
RG108	Red sirumani	0.93	0.07	SG1	indica
RG109	Vadivel	0.977	0.023	SG1	indica
RG110	Norungan	0.991	0.009	SG1	indica
RG111	IG 20(EC 729293- 121310)	0.113	0.887	SG2	indica
RG112	IG 35(EC 728858- 117843)	0.027	0.973	SG2	japonica
RG113	IG 45(EC 728768- 117736)	0.017	0.983	SG2	japonica
RG114	RPHP 159	0.008	0.992	SG2	aromatic rice
RG115	IG 43(EC 728788- 117759)	0.992	0.008	SG1	indica
RG116	RPHP 27	0.52	0.48	AD	Tropical Japonica
RG117	IG 65(EC 729024- 120958)	0.974	0.026	SG1	indica
RG118	Ponmani samba	0.973	0.027	SG1	indica
RG119	Ganthasala	0.993	0.007	SG1	indica
RG120	Thattan samba	0.949	0.051	SG1	indica
RG121	IG 74(EC 728622- 117517)	0.16	0.84	SG2	japonica
RG122	Kaliyan samba	0.245	0.755	AD	indica
RG123	IG 2(EC 729808-121874)	0.56	0.44	AD	japonica
RG124	IG 29(EC 728925- 117920)	0.059	0.941	SG2	Tropical Japonica
RG125	RPHP 55	0.963	0.037	SG1	indica
RG126	Kallimadayan	0.984	0.016	SG1	indica
RG127	IG 10(EC 729686- 121743)	0.066	0.934	SG2	aromatic
RG128	IG 75(EC 728587- 117420)	0.008	0.992	SG2	japonica
RG129	IG 38(EC 728742 - 117707)	0.02	0.98	SG2	Tropical japonica
RG130	IG 39(EC 728779-117750)	0.012	0.988	SG2	indica
RG131	RPHP 90	0.991	0.009	SG1	indica
RG132	IG 33(EC 728938- 117935)	0.162	0.838	SG2	Tropical Japonica
RG133	IG 42(EC 728798- 117774)	0.495	0.505	AD	indica

Table 2 Population structure group of accessions based on Inferred ancestry values (Continued)

RG134	IG 9(EC 729682- 121739)	0.019	0.981	SG2	indica
RG135	RPHP 161	0.849	0.151	SG1	indica
RG136	IG 8(EC 729601- 121651)	0.883	0.117	SG1	indica
RG137	IG 37(EC 728715- 117678)	0.005	0.995	SG2	Tropical Japonica
RG138	Sigappu kuruvikar	0.979	0.021	SG1	indica
RG139	RPHP 138	0.917	0.083	SG1	indica
RG140	Raja mannar	0.989	0.011	SG1	indica
RG141	IG 44(EC 728762- 117729)	0.134	0.866	SG2	indica
RG142	Sasyasree	0.989	0.011	SG1	indica
RG143	IG 46(IC 471826- 117647)	0.073	0.927	SG2	indica
RG144	Chetty samba	0.993	0.007	SG1	indica
RG145	IG 60(EC 728730- 117695)	0.033	0.967	SG2	indica
RG146	IR 75862-206	0.013	0.987	SG2	Tropical Japonica
RG147	IG 58(EC 728725- 117689)	0.011	0.989	SG2	japonica
RG148	Chinna aduku nel	0.798	0.202	SG1	indica
RG149	RH2-SM-2-23	0.296	0.704	AD	indica
RG150	IG 14(IC 517381- 121422)	0.775	0.225	AD	indica
RG151	IG 32(EC 728838- 117823)	0.065	0.935	SG2	japonica
RG152	RPHP 47	0.989	0.011	SG1	indica
RG153	Sembilipiriyan	0.933	0.067	SG1	indica
RG154	IG 48(EC 729203- 121195)	0.006	0.994	SG2	indica
RG155	Sona mahsuri	0.889	0.111	SG1	indica
RG156	IG 12(EC 729626- 121681)	0.405	0.595	AD	indica
RG157	Karungan	0.602	0.398	AD	indica
RG158	IG 13(EC 729640- 121696)	0.143	0.857	SG2	indica
RG159	Sembala	0.934	0.066	SG1	indica
RG160	IG 72(EC 728650- 117587)	0.992	0.008	SG1	indica
RG161	Panamarasamba	0.978	0.022	SG1	indica
RG162	IR 64	0.995	0.005	SG1	indica
RG163	Mikuruvai	0.992	0.008	SG1	indica
RG164	Thillainayagam	0.939	0.061	SG1	indica
RG165	ARB 64	0.843	0.157	SG1	indica
RG166	RPHP 140	0.959	0.041	SG1	indica
RG167	IG 70(EC 729045- 120983)	0.989	0.011	SG1	indica
RG168	Haladichudi	0.993	0.007	SG1	indica
RG169	IG 24(EC 728751- 117718)	0.725	0.275	AD	Aus
RG170	RPHP 42	0.981	0.019	SG1	indica
RG171	RPHP 44	0.951	0.049	SG1	indica
RG172	IG 25(EC 729728- 121785)	0.903	0.097	SG1	Tropical Japonica
RG173	IG 73(EC 728627- 117527)	0.991	0.009	SG1	indica
RG174	IG 51(EC 728772- 117742)	0.008	0.992	SG2	Tropical Japonica
RG175	Vellai kudaivazhai	0.786	0.214	SG1	indica
RG176	Kodai	0.906	0.094	SG1	indica
RG177	Kallundaikar	0.951	0.049	SG1	indica
RG178	IG 17(EC 728900- 117889)	0.993	0.007	SG1	indica

DC170					
KG179	Avasara samba	0.939	0.061	SG1	indica
RG180	IG 59(EC 728729- 117694)	0.093	0.907	SG2	Tropical Japonica
RG181	IG 52(EC 728756- 117723)	0.026	0.974	SG2	Tropical Japonica
RG182	ARB 59	0.779	0.221	SG1	indica
RG183	RPHP 163	0.995	0.005	SG1	indica
RG184	IG 18(EC 728892- 117880)	0.994	0.006	SG1	indica
RG185	RPHP 36	0.915	0.085	SG1	indica
RG186	IG 28(EC 728920- 117914)	0.009	0.991	SG2	Tropical Japonica
RG187	Vadakathi samba	0.986	0.014	SG1	indica
RG188	RPHP 80	0.986	0.014	SG1	indica
RG189	IG 41(EC 728800- 117776)	0.016	0.984	SG2	Tropical japonica
RG190	IG 26(IC 0590943- 121899)	0.422	0.578	SG2	aromatic
RG191	IG 15(EC 728910- 117901)	0.755	0.245	AD	indica
RG192	Nootri pathu	0.943	0.057	SG1	indica

Table 2 Population structure group of accessions based on Inferred ancestry values (Continued)

that allowed the amplification of 7 alleles. The PIC value was found to be 0.418 for SG1 which had the majority of indica accessions. The subgroup SG2 dominated by japonica accessions had the PIC value of 0.414. Hence, both the subgroups contribute in a major way for population diversity. As this population encompass different rice materials i.e., landraces, varieties and breeding lines, the molecular diversity is contributed majorly by landraces. These values are similar to those found by Courtois et al. (2012) who reported the PIC value from 0.16 to 0.78 with the average of 0.49 in European rice germplasm collection and in Chinese rice collection of 416 accessions by Jin et al. (2010), who has given similar PIC value of 0.4214. It is also consistent with PIC value (0.48) attained by Zhang et al. (2011). In this study, significant amount of rare alleles was identified which indicates that these rare

alleles contribute well to the overall genetic diversity of the population.

Model based approach by STRUCTURE is implemented frequently for studying population structure by various researchers (Agrama et al. 2007, Agrama and Eizenga 2008; Garris et al. 2005; Zhang et al. 2007, 2011; Jin et al. 2010; Liakat Ali et al. 2011, Chakhonkaen et al. 2012 Courtois et al. 2012, Das et al. 2013). Courtois et al. (2012) has successfully detected two subgroups in their study population and assigned rice varieties into two groups with few admixture lines. Jin et al. (2010) has identified seven sub populations among 416 rice accessions from China. Das et al. (2013) has grouped a collection of 91 accessions of rice landraces from eastern and north eastern India into four groups.

Assigning of genotypes to the subgroups based on ancestry threshold vary between different research groups.



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Zhao et al. (2010) and Courtois et al. (2012) used an ancestry threshold of 80 % to identify accessions belonging to a specific subpopulation. Liakat Ali et al. (2011) has steup the threshold as 60 % and identified 33 accessions as admixtures as the threshold of 80 % consider more genotypes as admixtures. In the current study, a stringent threshold of 80 % ancestry value leaves only 20 genotypes as admixtures.

Population structure analysis in different rice diversity panel has indicated the existence of two to eight sub population in rice (Zhang et al. 2007, Zhang et al. 2009, Zhang et al. 2011, Garris et al. 2005, Agrama et al. 2007, Liakat Ali et al. 2011, Chakhonkaen et al. 2012 and Das et al. 2013). In the current rice diversity panel of 192 accessions based on the criterion of maximum membership probabilities, 134 accessions were assigned to SG1 which is dominated by *indica* subtype with most of the landraces and varieties of Indian origin and SG2 consisted of 38 accessions which composed mostly of japonica accessions of exotic origin. Similar population structure of two subgroups was observed in previous research by Zhang et al. (2009) in a collection of 3024 rice landraces in China. Zhang et al. (2011) has reported two distinct subgroups in a rice core collection. Courtois et al. (2012) has successfully classified two subgroups as japonica and non japonica accessions in European core collection of rice. The results indicated that two subgroups are due to the different adaptation behavior of accessions to different ecological environment as *indica* and *japonica* accessions has independent evolution frame and the origin of Indian rice accessions from *indica* cultivars. Hence the major criterion for population structure in this panel is *indica* – *japonica* subtype. This study includes large number of traditional landraces and varieties from Indian Subcontinent and few exotic accessions randomly selected from IRRI worldwide collection. It clarifies the relationship between Indian germplasm and exotic accessions which indicates that germplasm lines varies based on its ecology and also shows higher level of genetic diversity exists within this population.

Further structure analysis of SG1 that consisted of 134 lines indicated that it can be further subdivided in to three sub sub-groups. The three sub sub-groups classification has the factor of ecosystem and seasonal variation as the major factors for population structure. This results is in accordance with the inference that indica group has higher genetic diversity than japonica accessions which was given by various researchers (Gao et al. 2005; Lu et al. 2005; Lapitan et al. 2007; Caicedo et al. 2007; Liakat Ali et al. 2011; Garris et al. 2005; Qi et al. 2006; Qi et al. 2009); as this subgroup has indica accessions. Liakat Ali et al. (2011) has substantiated this statement with the reason of the indica subpopulation occupying the largest rice growing region which has a varied environments, ecological conditions and soil type.



The result of model based analysis is in accordance with the clustering pattern of Neighbour joining tree and Principal Coordinate Analysis. The first two principal coordinates explained 12.6 and 4.8 % of the molecular variance. Similar pattern of molecular variance explanation was observed by Zhang et al. (2011) for two population subgroups.

Calculation of Wright's F Statistic at all loci revealed the deviation from Hardy- Weinberg law for molecular variation within the population. The result of $F_{\rm st}$

Table 3 AMOVA between groups and Pair wise comparison

 using Fst values (GenAlEx)

Source	df	SS	MS	Est. var.	Percent			
Among the population	2	971.922	485.961	9.631	14 %			
Within Pops	189	10961.256	57.996	57.996	86 %			
Total	191	11933.177		67.627	100 %			
Pairwise population Fst	values							
	SG2		AD					
SG1	0.128		0.040					
SG2			0.061					

indicates higher divergence existing between subgroups of the population. Higher $F_{\rm IT}$, which is measured at subgroup level in whole population, has indicated lack of equilibrium across the groups and lack of heterozygosity most likely due to the inbreeding nature of rice.

The present study revealed that several unexploited landraces of Tamil Nadu, India which is widely cultivated

Table 4 AMOVA between groups and accessions and Fixation indices (Arlequin software)

Source of variation	d.f.	Sum of	Variance	Percentage
		squares	components	of variation
Among Populations	2	200.013	1.01840 Va	13.82
Among individuals within Populations	189	1794.771	3.14391 Vb	42.65
Within Individuals	192	616	3.20833 Vc	43.53
	383	2610.784	7.37064	
Fixation Indices				
FIS	0.494	93		
FST	0.138	17		
FIT	0.564	71		

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G. no	Genotypes	G. no	Genotypes	G. no	Genotypes	G. no	Genotypes	G. no	Genotypes	G. no	Genotypes
RG1	Mapillai samba	RG58	Kodaikuluthan	RG113	IG 45(EC 728768- 117736)	RG154	IG 48(EC 729203- 121195)	RG39	Kaatu ponni	RG95	Jeeraga samba
RG2	CK 275	RG59	RPHP 68	RG114	RPHP 159	RG156	IG 12(EC 729626- 121681)	RG41	Godavari samba	RG96	RP-BIO-226
RG3	Senkar	RG60	Rama kuruvaikar	RG115	IG 43(EC 728788- 117759)	RG157	Karungan	RG42	Earapalli samba	RG98	IG 5(EC 729642- 121698)
RG4	Murugankar	RG62	Purple puttu	RG116	RPHP 27	RG158	IG 13(EC 729640- 121696)	RG43	RPHP 129	RG99	IG 31(EC 728844- 117829)
RG5	CHIR 6	RG63	IG 71(EC 728651- 117588)	RG117	IG 65(EC 729024- 120958)	RG159	Sembala	RG44	Mangam samba	RG100	IG 7(EC 729598- 121648)
RG6	CHIR 5	RG65	IG 56(EC 728700- 117658	RG118	Ponmani samba	RG160	IG 72(EC 728650- 117587)	RG45	RPHP 105	RG101	RPHP 52
RG7	Kudai vazhai	RG66	Jeevan samba	RG120	Thattan samba	RG161	Panamarasamba	RG46	IG 4(EC 729639- 121695)	RG102	Varakkal
RG8	CHIR 8	RG67	RPHP 106	RG121	IG 74(EC 728622- 117517)	RG162	IR 64	RG48	Kalarkar	RG103	Mattaikar
RG9	Kuruvai kalanjiyam	RG68	IG 63(EC 728711- 117674)	RG122	Kaliyan samba	RG163	Mikuruvai	RG50	Sornavari	RG104	IG 53(EC 728752- 117719)
RG12	Vellai chithiraikar	RG69	RPHP 48	RG123	IG 2(EC 729808-121874)	RG164	Thillainayagam	RG51	RPHP 134	RG105	IG 6(EC 729592- 121642)
RG14	Jothi	RG70	Karthi samba	RG124	IG 29(EC 728925- 117920)	RG165	ARB 64	RG52	ARB 58	RG106	Katta samba
RG15	Palkachaka	RG71	IG 27(IC 0590934- 121255)	RG126	Kallimadayan	RG166	RPHP 140	RG53	IR 68144-2B-2-2-3-1-127	RG107	RH2-SM-1-2-1
RG17	Chivapu chithiraikar	RG72	Aarkadu kichili	RG127	IG 10(EC 729686- 121743)	RG168	Haladichudi	RG54	PTB 19	RG108	Red sirumani
RG18	CHIR 11	RG74	ARB 65	RG128	IG 75(EC 728587- 117420)	RG169	IG 24(EC 728751- 117718)	RG55	IG 67(EC 729050- 120988)	RG109	Vadivel
RG20	Kalvalai	RG76	Matta kuruvai	RG129	IG 38(EC 728742 - 117707)	RG170	RPHP 42	RG56	RPHP 59	RG110	Norungan
RG22	IR 36	RG77	Karuthakar	RG130	IG 39(EC 728779- 117750)	RG172	IG 25(EC 729728- 121785)	RG57	RPHP 103	RG112	IG 35(EC 728858- 117843)
RG25	Sorna kuruvai	RG80	IG 66(EC 729047- 120985)	RG131	RPHP 90	RG173	IG 73(EC 728627- 117527)	RG143	IG 46(IC 471826- 117647)	RG184	IG 18(EC 728892- 117880)
RG26	Rascadam	RG81	CB-07-701-252	RG132	IG 33(EC 728938- 117935)	RG174	IG 51(EC 728772- 117742)	RG145	IG 60(EC 728730- 117695)	RG185	RPHP 36
RG31	Chinthamani	RG82	Thooyamalli	RG133	IG 42(EC 728798- 117774)	RG175	Vellai kudaivazhai	RG146	IR 75862-206	RG186	IG 28(EC 728920- 117914)
RG32	Thogai samba	RG83	RPHP 93	RG134	IG 9(EC 729682- 121739)	RG176	Kodai	RG147	IG 58(EC 728725- 117689)	RG187	Vadakathi samba
RG33	Malayalathan samba	RG85	RPHP 104	RG135	RPHP 161	RG178	IG 17(EC 728900- 117889)	RG148	Chinna aduku nel	RG188	RPHP 80
RG34	RPHP 125	RG86	RPHP 102	RG136	IG 8(EC 729601- 121651)	RG180	IG 59(EC 728729- 117694)	RG149	RH2-SM-2-23	RG189	IG 41(EC 728800- 117776)
RG35	CK 143	RG89	IR 83294-66-2-2-3-2	RG137	IG 37(EC 728715- 117678)	RG181	IG 52(EC 728756- 117723)	RG150	IG 14(IC 517381- 121422)	RG190	IG 26(IC 0590943- 121899)
RG36	Kattikar	RG91	IG 23(EC 729391- 121419)	RG141	IG 44(EC 728762- 117729)	RG182	ARB 59	RG151	IG 32(EC 728838- 117823)	RG191	IG 15(EC 728910- 117901)
RG37	Shenmolagai	RG92	IG 49(EC 729102- 121052)	RG142	Sasyasree	RG183	RPHP 163	RG152	RPHP 47	RG192	Nootri pathu

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Table 6	Germplasm	accessions	used	in	the	study	
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G. no.	Genotype	Parentage	Origin	Type – traditional/ Improved	Subtype	Ecosystem IR = irrigated, RL = rainfed lowland; UP = upland	Maturity class: E = early, M = medium, L = late;	Donors/Original providing count
RG1	Mapillai samba	Landrace	Tamil Nadu, India	Т	indica	IR	L	India
RG2	CK 275	CO50 X KAVUNI	Tamil Nadu, India	I	indica	IR	L	India
RG3	Senkar	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG4	Murugankar	Landrace	Tamil Nadu, India	Т	indica	UP	L	India
RG5	CHIR 6	Improved chinsurah	West Bengal	I	indica	IR	E	India
RG6	CHIR 5	Improved chinsurah	West Bengal	I	indica	IR	E	India
RG7	Kudai vazhai	Landrace	Tamil Nadu, India	Т	indica	UP	E	India
RG8	CHIR 8	Improved chinsurah	West Bengal	I	indica	IR	E	India
RG9	Kuruvai kalanjiyam	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG10	Nava konmani	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG11	CHIR 10	Improved chinsurah	West Bengal	I	indica	IR	Μ	India
RG12	Vellai chithiraikar	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG13	CHIR 2	Improved chinsurah	West Bengal	I	indica	IR	Μ	India
RG14	Jyothi	Variety	Kerala, India	Т	indica	IR	E	India
RG15	Palkachaka	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG16	Thooyala	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG17	Chivapu chithiraikar	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG18	CHIR 11	Improved chinsurah	West Bengal	I	indica	IR	Μ	India
RG19	Koolavalai	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG20	Kalvalai	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG21	Mohini samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG22	IR 36	IR 1561 X IR 24 X Oryza nivara x CR 94	IRRI, Philippines	Ι	indica	IR	E	Philippines
RG23	Koombalai	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG24	Tadukan	Landrace	Philippines	Т	indica	UP	Μ	Philippines
RG25	Sorna kuruvai	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG26	Rascadam	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG27	Muzhi karuppan	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG28	Kaatukuthalam	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG29	Vellaikattai	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG30	Poongar	Landrace	Tamil Nadu, India	Т	indica	RL	L	India

RG31	Chinthamani	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG32	Thogai samba	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG33	Malayalathan samba	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG34	RPHP125	NDR 2026 (RICHA)	UTTAR PRADHESH	I	indica	IR	E	India
RG35	CK 143	CO50 X KAVUNI	Tamil Nadu, India	I	indica	IR	L	India
RG36	Kattikar	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG37	Shenmolagai	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG38	Velli samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG39	Kaatu ponni	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG40	kakarathan	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG41	Godavari samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG42	Earapalli samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG43	RPHP 129	Kamad	JAMMU & KASHMIR	Т	indica	Scented	E	India
RG44	Mangam samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG45	RPHP 105	Moirang phou	MANIPUR	Т	indica	IR	E	India
RG46	IG 4(EC 729639- 121695)	TD2: :IRGC 9148-1	IRRI, Philippines	I	indica	IR	Μ	Philippines
RG47	Machakantha	Landrace	Orissa, India	Т	indica	scented	E	India
RG48	Kalarkar	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG49	Valanchennai	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG50	Sornavari	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG51	RPHP 134	NJAVARA	Kerala	Т	indica	RL	E	India
RG52	ARB 58	Variety	Karnataka	I	indica	IR	E	India
RG53	IR 68144-2B-2-2-3-1-127	IR 72 X ZAWA BONDAY	IRRI, Philippines	I	indica		E	Philippines
RG54	PTB 19	Variety	Kerala, India	I	indica	IR	Μ	India
RG55	IG 67(EC 729050- 120988)	IR 77384-12-35-3-12-I-B::IRGC 117299-1	IRRI, Philippines	I	indica	IR	E	Philippines
RG56	RPHP 59	Taroari Basmati/karnal local	HARYANA	Т	Aromatic	scented	L	India
RG57	RPHP 103	Pant sugandh dhan -17	UTTARKHAND	I	Aromatic	scented	L	India
RG58	Kodaikuluthan	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG59	RPHP 68	Subhdra	Orissa, India	I	indica	RL	E	India
RG60	Rama kuruvaikar	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG61	Kallundai	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG62	Purple puttu	Landrace	Tamil Nadu, India	Т	indica	IR	E	India

RG63	IG 71(EC 728651- 117588)	TEPI BORO::IRGC 27519-1	IRRI, Philippines	I	aus	IR	E	Philippines
RG64	Ottadaiyan	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG65	IG 56(EC 728700- 117658	BICO BRANCO	Brazil	Т	Aromatic	UP	E	Philippines
RG66	Jeevan samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG67	RPHP 106	akut phou	MANIPUR	1	indica	IR	Μ	India
RG68	IG 63(EC 728711- 117674)	CAAWA/FORTUNA	IRRI, Philippines	Ι	Tropical Japonica	IR	Μ	Philippines
RG69	RPHP 48	Bindli	UTTARKHAND	Т	Aromatic	Scented	L	India
RG70	Karthi samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG71	IG 27(IC 0590934- 121255)	ARC 11345::IRGC 21336-1	IRRI, Philippines	I	indica	IR	Μ	Philippines
RG72	Aarkadu kichili	Landrace	Tamil Nadu, India	Т	indica	IR	М	India
RG73	Kunthali	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG74	ARB 65	Variety	Karnataka	I	indica	IR	E	India
RG75	IG 21(EC 729334- 121355)	HONGJEONG::IRGC 73052-1	IRRI, Philippines	I	japonica	IR	E	Philippines
RG76	Matta kuruvai	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG77	Karuthakar	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG78	RPHP 165	Tilak kachari	West Bengal	Т	indica	IR	E	India
RG79	Manavari	Landrace	Tamil Nadu, India	Т	indica	U	E	India
RG80	IG 66(EC 729047- 120985)	IR 71137-243-2-2-3-3::IRGC 99696-1	IRRI, Philippines	Ι	indica	IR	E	Philippines
RG81	CB-07-701-252	White ponni X Rasi	Tamil Nadu, India	I	indica	IR	E	India
RG82	Thooyamalli	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG83	RPHP 93	Type-3 (Dehradooni Basmati)	UTTARKHAND	I	indica	Scented	Μ	India
RG84	Velsamba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG85	RPHP 104	Kasturi (IET 8580)	UTTARKHAND	I	indica	IR	М	India
RG86	RPHP 102	Kanchana	Kerala, India	I	indica	Semi Deep Water	L	India
RG87	IG 40(EC 728740- 117705)	DEE GEO WOO GEN	TAIWAN	Т	Indica	IR	Μ	Philippines
RG88	Saranga	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG89	IR 83294-66-2-2-3-2	DAESANBYEO X IR65564-44-5-1	IRRI, Philippines	I	japonica	RL	М	Philippines
RG90	IG 61(EC 728731- 117696)	CRIOLLO LA FRIA	Venezuela	1	Indica	IR	E	Philippines
RG91	IG 23(EC 729391- 121419)	MAHA PANNITHI::IRGC 51021-1	IRRI, Philippines	I	Aus	IR	Μ	Philippines
RG92	IG 49(EC 729102- 121052)	MENAKELY ::IRGC 69963-1	Madagascar	I	Indica	RL	М	Philippines
RG93	Uppumolagai	Landrace	Tamil Nadu, India	Т	Indica	IR	М	India
RG94	Karthigai samba	Landrace	Tamil Nadu, India	Т	Indica	RL	Μ	India

RG95	Jeeraga samba	Landrace	Tamil Nadu, India	Т	Indica	IR	Μ	India
RG96	RP-BIO-226	IMPROVED SAMBHA MAHSURI	ANDHRA PRADESH	I	Indica	IR	Μ	India
RG97	Varigarudan samba	Landrace	Tamil Nadu, India	Т	Indica	IR	Μ	India
RG98	IG 5(EC 729642- 121698)	IR 65907-116-1-B::C1	IRRI, Philippines	I	japonica	UP	E	Philippines
RG99	IG 31(EC 728844- 117829)	ORYZICA LLANOS 5	Colombia	Т	Indica	IR	Μ	Philippines
RG100	IG 7(EC 729598- 121648)	VARY MAINTY::IRGC 69910-1	Madagascar	I	japonica	IR	Μ	Philippines
RG101	RPHP 52	SEBATI	Orissa, India	I	Indica	IR	Μ	India
RG102	Varakkal	Landrace	Tamil Nadu, India	Т	Indica	UP	E	India
RG103	Mattaikar	Landrace	Tamil Nadu, India	Т	Indica	RL	L	India
RG104	IG 53(EC 728752- 117719)	CAROLINA RINALDO BARSANI	URUGUAY	I	Temperate japonica	IR	E	Philippines
RG105	IG 6(EC 729592- 121642)	SOM CAU 70 A::IRGC 8227-1	Vietnam	I	Temperate japonica	IR	E	Philippines
RG106	Katta samba	Landrace	Tamil Nadu, India	Т	Indica	RL	L	India
RG107	RH2-SM-1-2-1	SWARNA X MOROBERAKAN	Tamil Nadu, India	I	Indica	IR	E	India
RG108	Red sirumani	Landrace	Tamil Nadu, India	Т	Indica	RL	E	India
RG109	Vadivel	Landrace	Tamil Nadu, India	Т	Indica	IR	Μ	India
RG110	Norungan	Landrace	Tamil Nadu, India	Т	Indica	RL	E	India
RG111	IG 20(EC 729293- 121310)	CHIGYUNGDO::IRGC 55466-1	South Korea	I	Indica	UP	E	Philippines
RG112	IG 35(EC 728858- 117843)	PATE BLANC MN 1	Cote D'Ivoire	I	japonica	UP	Μ	Philippines
RG113	IG 45(EC 728768- 117736)	FORTUNA	Puerto Rico	Т	japonica	IR	Μ	Philippines
RG114	RPHP 159	Radhuni Pagal	BANGLADESH	I	aromatic rice	Scented	L	India
RG115	IG 43(EC 728788- 117759)	IR-44595	IRRI, Philippines	I	indica	IR	E	Philippines
RG116	RPHP 27	Azucena	IRRI, Philippines	Т	Tropical Japonica	RL	E	India
RG117	IG 65(EC 729024- 120958)	GODA HEENATI::IRGC 31393-1	SRILANKA	I	indica	IR	E	Philippines
RG118	Ponmani samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG119	Ganthasala	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG120	Thattan samba	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG121	IG 74(EC 728622- 117517)	KINANDANG PATONG::IRGC 23364-1	IRRI, Philippines	I	japonica	RL	Μ	Philippines
RG122	Kaliyan samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG123	IG 2(EC 729808-121874)	BLUEBONNET 50::IRGC 1811-1	IRRI, Philippines	I	japonica	UP	Μ	Philippines
RG124	IG 29(EC 728925- 117920)	TOX 782-20-1	NIGERIA	Т	Tropical Japonica	IR	E	Philippines

RG125	RPHP 55	Kalinga -3	Orissa	I	indica	RL	E	India
RG126	Kallimadayan	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG127	IG 10(EC 729686- 121743)	hasan serai	IRRI, Philippines	I	aromatic	IR	E	Philippines
RG128	IG 75(EC 728587- 117420)	AEDAL::IRGC 55441-1	Korea	Т	japonica	IR	E	Philippines
RG129	IG 38(EC 728742 - 117707)	DELREX	UNITED STATES		Tropical japonica	IR	М	Philippines
RG130	IG 39(EC 728779- 117750)	HONDURAS	HONDURAS		indica	IR	Μ	Philippines
RG131	RPHP 90	182(M)	Andhra Pradesh	I	indica	IR	E	India
RG132	IG 33(EC 728938- 117935)	WC 3397	JAMAICA		Tropical Japonica	IR	E	Philippines
RG133	IG 42(EC 728798- 117774)	KALUBALA VEE	SRILANKA	Т	indica	IR	E	Philippines
RG134	IG 9(EC 729682- 121739)	GEMJYA JYANAM::IRGC 32411-C1	IRRI, Philippines	I	indica	IR	E	Philippines
RG135	RPHP 161	Champa Khushi	Vietnam	Т	indica	UP	E	India
RG136	IG 8(EC 729601- 121651)	XI YOU ZHAN::IRGC 78574-1	China	I	indica	IR	E	Philippines
RG137	IG 37(EC 728715- 117678)	CENIT	ARGENTINA	Т	Tropical Japonica	IR	L	Philippines
RG138	Sigappu kuruvikar	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG139	RPHP 138	EDAVANKUDI POKKALI	Kerala, India	Т	indica	Deep water	L	India
RG140	Raja mannar	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG141	IG 44(EC 728762- 117729)	EDITH	UNITED STATES	Т	indica	IR	E	Philippines
RG142	Sasyasree	TKM 6 x IR 8	West Bengal	I	indica	IR	E	India
RG143	IG 46(IC 471826- 117647)	BABER	INDIA	I	indica	IR	E	India
RG144	Chetty samba	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG145	IG 60(EC 728730- 117695)	CREOLE	Belize	Т	indica	IR	Μ	Philippines
RG146	IR 75862-206	IR 75083 X IR 65600 -81-5-3-2	IRRI, Philippines	I	Tropical Japonica	IR	Μ	Philippines
RG147	IG 58(EC 728725- 117689)	CI 11011	UNITED STATES		japonica	IR	Μ	Philippines
RG148	Chinna aduku nel	Landrace	Tamil Nadu, India	Т	indica	IR	L	India
RG149	RH2-SM-2-23	SWARNA X MOROBERAKAN	Tamil Nadu, India	I	indica	IR	Μ	India
RG150	IG 14(IC 517381- 121422)	MALACHAN::IRGC 54748-1	India	I	indica	UP	E	Philippines
RG151	IG 32(EC 728838- 117823)	NOVA	United States	I	japonica	IR	Μ	Philippines
RG152	RPHP 47	Pathara (CO-18 x Hema)	India	I	indica	IR	E	India
RG153	Sembilipiriyan	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India

RG154	IG 48(EC 729203- 121195)	DINOLORES::IRGC 67431-1	IRRI, Philippines		indica	UP	Μ	Philippines
RG155	Sona mahsuri	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG156	IG 12(EC 729626- 121681)	SHESTAK::IRGC 32351-1	Iran	I	indica	IR	E	Philippines
RG157	Karungan	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG158	IG 13(EC 729640- 121696)	CURINCA::C1	BRAZIL	I	indica	IR	E	Philippines
RG159	Sembala	Landrace	Tamil Nadu, India	Т	indica	IR	L	India
RG160	IG 72(EC 728650- 117587)	TD 25::IRGC 9146-1	Thailand	I	indica	IR	Μ	Philippines
RG161	Panamarasamba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG162	IR 64	IR-5857-33-2-1 x IR-2061-465-1-5-5	IRRI, Philippines	1	indica	IR	E	Philippines
RG163	Mikuruvai	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG164	Thillainayagam	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG165	ARB 64	Variety	Karnataka	I	indica	IR	E	India
RG166	RPHP 140	VYTILLA ANAKOPON	Kerala	Т	indica	IR	E	India
RG167	IG 70(EC 729045- 120983)	IR43::IRGC 117005-1	IRRI, Philippines	I	indica	IR	Μ	Philippines
RG168	Haladichudi	Landrace	Orissa, India	Т	indica	IR	E	India
RG169	IG 24(EC 728751- 117718)	DNJ 140	BANGLADESH	I	Aus	IR	E	Philippines
RG170	RPHP 42	Salimar Rice -1	JAMMU & KASHMIR	I	indica	IR	Μ	India
RG171	RPHP 44	BR- 2655	KARNATAKA	I	indica	IR	L	India
RG172	IG 25(EC 729728- 121785)	LOHAMBITRO 224::GERVEX 5144-C1	Madagascar	I	Tropical Japonica	IR	E	Philippines
RG173	IG 73(EC 728627- 117527)	MAKALIOKA 34::IRGC 6087-1	IRRI, Philippines	I	indica	IR	E	Philippines
RG174	IG 51(EC 728772- 117742)	GOGO LEMPUK	Indonesia		Tropical Japonica	IR	Μ	Philippines
RG175	Vellai kudaivazhai	Landrace	Tamil Nadu, India	Т	indica	RL	Μ	India
RG176	Kodai	Landrace	Tamil Nadu, India	Т	indica	RL	E	India
RG177	Kallundaikar	Landrace	Tamil Nadu, India	Т	indica	UP	Μ	India
RG178	IG 17(EC 728900- 117889)	SIGADIS	INDONESIA	Т	indica	RL	L	Philippines
RG179	Avasara samba	Landrace	Tamil Nadu, India	Т	indica	IR	E	India
RG180	IG 59(EC 728729- 117694)	COPPOCINA	BULGARIA	1	Tropical Japonica	IR	Μ	Philippines
RG181	IG 52(EC 728756- 117723)	DOURADO AGULHA	BRAZIL	I	Tropical Japonica	IR	Μ	Philippines
RG182	ARB 59	Variety	Karnataka	I	indica	IR	E	India

RG183	RPHP 163	Seeta sail	West Bengal	Т	indica	Scented	Μ	India
RG184	IG 18(EC 728892- 117880)	SERATOES HARI	INDONESIA	Т	indica	IR	E	Philippines
RG185	RPHP 36	TKM-9	Tamil Nadu, India	I	indica	IR	E	India
RG186	IG 28(EC 728920- 117914)	TIA BURA	INDONESIA	Т	Tropical Japonica	IR	М	Philippines
RG187	Vadakathi samba	Landrace	Tamil Nadu, India	Т	indica	IR	Μ	India
RG188	RPHP 80	24(K)	Andhra Pradesh	I	indica	IR	E	India
RG189	IG 41(EC 728800- 117776)	KANIRANGA	Indonesia	Т	Tropical japonica	IR	М	Philippines
RG190	IG 26(IC 0590943- 121899)	BASMATI 370::IRGC 3750-1	IRRI, Philippines	I	aromatic	IR	E	Philippines
RG191	IG 15(EC 728910- 117901)	SZE GUEN ZIM	CHINA	I	indica	IR	E	Philippines
RG192	Nootri pathu	Landrace	Tamil Nadu, India	Т	indica	RL	L	India

IRRI lines - The number after hyphen inside brackets represent IRGC number

by the farmers in different parts of the state. Ecological and evolutionary history contributes for the genetic diversity maintained in a population. The varieties with diverse ecosystems and wide eco-geographical conditions contribute for the genetic diversity among rice varieties in this population.

For establishing a core collection for association studies, two step approach followed by Breseghello and Sorrells (2006) and Courtois et al. (2012) was used. This approach involves the determination of population structure and then sampling can be done based on the relatedness of the accessions in the population. Those accessions that show high magnitude of genetic relatedness can be eliminated to develop core collection with diverse representatives. Based on this idea, out of 192 accessions, 150 (Table 5) were selected to form association mapping panel which can be utilized either by genome wide or candidate gene specific association mapping for linking the genotypic and phenotypic variation.

Conclusion

This study analyze the pattern of divergence exists in a population of 192 rice accessions that constitute our rice diversity panel for association mapping. Based on various statistical methods, we identified two sub groups within 192 rice accessions selected for establishing association mapping panel. The average number of alleles per locus and gene diversity has indicated the existence of broad genetic base in this collection. The result of structure analysis is in accordance with clustering method of neighbor joining tree and principal coordinate analysis. Thus, the results of this study which indicates the genetic diversity of the accessions can be utilized to predict approaches such as association analysis, classical mapping population development; parental line selection in breeding programs and hybrid development for exploiting the natural genetic variation exists in this population.

Methods

Plant Material

A collection consisting of 192 rice accessions was used in this study, which consist of land races and varieties collected from nine different states of India as well as from Argentina, Bangladesh, Brazil, Bulgaria, China, Colombia, Indonesia, Philippines, Taiwan, Uruguay, Venezuela and United States (Table 6).

Microsatellite Genotyping

DNA Isolation and PCR Amplification

DNA was extracted from leaf tissue by grinding with liquid nitrogen using CTAB method (Saghai-Maroof et al. 1984.). It was diluted to a final concentration of 30 ng μ l⁻¹ for enabling polymerase chain reactions. DNA amplification parameters such as specificity, efficiency and fidelity

are strongly influenced by the components of the PCR reaction and by thermal cycling conditions (Caetano-Anolles and Brant 1991). Therefore, the careful optimization of reaction components and conditions will ultimately result in more reproducible and efficient amplification. The concentrations of primers, template DNA, Master Mix, and annealing temperature was optimized on eight diverse accessions for 156 SSR markers distributed on the 12 chromosomes by modified Taguchi method (Cobb and Clarkson 1994). Microsatellite primer sequences, annealing temperature and chromosomal locations are obtained from GRAMENE database (http:// archive.gramene.org/markers/microsat/). Sixty one SSR primer pairs which produce polymorphic allele amplification were chosen to genotype the entire set of germplasm collection.

The volume of the PCR reaction system was 10 µl. The PCR reaction mixture of 10 µl had 0.4 mM dNTPs, 4 mM of MgCl₂, 150 mM of Tris–HCl, 10 pmoles of forward and reverse primer and 0.05 U *Taq* polymerase with 30 ng of DNA. Polymerase chain reaction was performed in BIORAD THERMAL CYCLER using the following program: 94 °C for 2 min, 35 cycles of 94 °C for 45 sec, 50–60 °C for 1 min, 72 °C for 2 min with a final extension of 72 °C for ten min.

Polyacrylamide Gel Electrophoresis

Amplified products were size separated in native polyacrylamide gel electrophoresis using 6 % (w/v) polyacrylamide gel according to Sambrook et al. (2001) in vertical electrophoresis tank with 1X TBE at 150 V. The gel size was determined using standard molecular weight size markers after the bands were detected by silver staining.

Allele Scoring

The bands were visualized in a cluster of two to six in the stained gels for most of the markers. Based on the expected product size given in the GRAMENE website (Additional file 2: Table S1), the size of the most intensely amplified bands around the expected product size for each microsatellite marker was identified using standard molecular weight size markers (20 bp DNA ladder, GeNeI Company). Then the stained gel was dried and documented using light box. Allele score was given based on the presence of a particular size allele in each of the germplasm. The presence was denoted as 1 and absence of an allele as 0 and it was rechecked manually (Additional file 3: Table S2).

Data Analysis

A 1/0 matrix was constructed based on the presence and absence of alleles for the set of 61 markers. This SSR genotype data was analyzed for genetic diversity and population structure.

Genetic Diversity

For a set of accessions, genetic diversity parameters such as number of alleles per locus, allele frequency, heterozygosity and polymorphic information index (PIC) was estimated using the program POWERMARKER Ver3.25 (Liu and Muse 2005). Allele frequency represents the frequency of particular allele for each marker. Heterozygosity is the proportion of heterozygous individuals in the population. Polymorphic information content that represent the amount of polymorphism within a population was estimated based on Botstein et al. (1980).

To assess genetic structure, model based approach and distance based approach were used. Model based approach was utilized with Structure ver 2.3.4 software (Pritchard et al. 2000). The actual number of subpopulation which is denoted by K was identified by this method. For that, the project was run with the following parameter set: the possibility of admixture and allele frequency correlated. Run length was given as 150,000 burning period length followed by 150,000 Markov Chain Monte Carlo (MCMC) replication. Each k value was run for 10 times with k value varying from 1 to 10. The optimum k value was determined by plotting the mean estimate of the log posterior probability of the data (L (K) against the given K value. True number of subpopulation was identified using the maximal value of L (K). An adhoc quantity ΔK proposed by (Evanno et al. 2005) based on second order rate of change of the likelihood function with respect to K estimated using Structure Harvester (Earl 2012) has also shown a clear peak at the optimal K value.

Distance based approach which is based on calculating pair wise distance matrix was computed by calculating a dissimilarity matrix using a shared allele index with DARwin software (Perrier and Jacquemoud-Collet 2006). An unweighted neighbor joining tree was constructed using the calculated dissimilarity index. The genetic distance between accessions was estimated using NEI coefficient (Nei 1972) with bootstrap procedure of resampling (1000) across markers and individuals from allele frequencies. To determine the association among the accessions, unweighted pair group method with arithmetic mean (UPGMA) tree was also drawn using Powermarker and viewed in MEGA 6.0 software (Tamura et al. 2013).

The presence of molecular variance within and between hierarchical population structure estimated by Structure was assessed via Analysis of molecular variance (AMOVA) by Arlequin (Excoffier et al. 2005). F statistics which include $F_{IT,}$ deviations from Hardy-Weinberg expectation across the whole population, F_{IS} deviation from Hardy- Weinberg expectation within a population and $F_{ST,}$ correlation of alleles between subpopulation was calculated using AMOVA approach in Arlequin. AMOVA and Principal Coordinate analysis of the germplasm set was performed based on Nei (Nei 1973) distance matrix using GenAlEx 6.5 (Peakall and Smouse 2012).

Additional files

Additional file 1: Figure S1. Allelic pattern of different SSR markers used in this study. (JPG 1.03 MB)

Additional file 2: Table S1. Expected product size obtained from Gramene and observed product size for the SSR markers used in this study. (XLS 170 kb)

Additional file 3: Table S2. Allele matrix of 192 accessions x 61 SSRs. (XLSX 10 kb)

Competing interests

The authors declare that they have no competing interests.

Authors' contributions

RoS, VVN, RS and SKK prepared the samples. VVN carried out the genotyping, data analysis and drafted the manuscript. BAP, GP, KG participated in genotyping and data preparation. RoS designed the experiment and revised the manuscript. SD, RS, RM, SM participated in study design and revised the manuscript. All authors read and approve the final manuscript.

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References

- Abdurakhmonov IY, Abdukarimov A (2008) Application of association mapping to understanding the genetic diversity of plant germplasm resources. Int J Plant Genomics 2008:574927
- Agrama H, Eizenga G (2008) Molecular diversity and genome-wide linkage disequilibrium patterns in a worldwide collection of *Oryza sativa* and its wild relatives. Euphytica 160(3):339–355
- Agrama H, Eizenga G, Yan W (2007) Association mapping of yield and its components in rice cultivars. Mol Breed 19(4):341–356
- Agrama HA, Yan W, Jia M, Fjellstrom R, McClung AM (2010) Genetic structure associated with diversity and geographic distribution in the USDA rice world collection. Nat Sci 2(04):247
- Botstein D, White RL, Skolnick M, Davis RW (1980) Construction of a genetic linkage map in man using restriction fragment length polymorphisms. Am J Hum Genet 32(3):314
- Breseghello F, Sorrells ME (2006) Association mapping of kernel size and milling quality in wheat (Triticum aestivum L.) cultivars. Genetics 172(2):1165–1177
- Caetano-Anolles G, Brant B (1991) DNA amplification fingerprinting using very short arbitrary oligonucleotide primers. Nat Biotechnol 9(6):553–557

- Caicedo AL, Williamson SH, Hernandez RD, Boyko A, Fledel-Alon A, York TL, Polato NR, Olsen KM, Nielsen R, McCouch SR (2007) Genome-wide patterns of nucleotide polymorphism in domesticated rice. PLoS Genet 3(9):e163
- Chakhonkaen S, Pitnjam K, Saisuk W, Ukoskit K, Muangprom A (2012) Genetic structure of Thai rice and rice accessions obtained from the international rice research institute. Rice 5(1):19
- Chen H, He H, Zou Y, Chen W, Yu R, Liu X, Yang Y, Gao Y-M, Xu J-L, Fan L-M (2011) Development and application of a set of breeder-friendly SNP markers for genetic analyses and molecular breeding of rice (*Oryza sativa L*.). Theor Appl Genet 123(6):869–879
- Choudhury B, Khan ML, Dayanandan S (2013) Genetic structure and diversity of indigenous rice (*Oryza sativa*) varieties in the Eastern Himalayan region of Northeast India. Springer Plus 2(1):228
- Cobb BD, Clarkson JM (1994) A simple procedure for optimising the polymerase chain reaction (PCR) using modified Taguchi methods. Nucleic Acids Res 22(18):3801–3805
- Courtois B, Frouin J, Greco R, Bruschi G, Droc G, Hamelin C, Ruiz M, Clément G, Evrard J-C, van Coppenole S (2012) Genetic diversity and population structure in a European collection of rice. Crop Sci 52(4):1663–1675
- Das B, Sengupta S, Parida SK, Roy B, Ghosh M, Prasad M, Ghose TK (2013) Genetic diversity and population structure of rice landraces from Eastern and North Eastern States of India. BMC Genet 14(1):71
- Deepa G, Singh V, Naidu KA (2008) Nutrient composition and physicochemical properties of Indian medicinal rice–Njavara. Food Chem 106(1):165–171
- Earl DA (2012) STRUCTURE HARVESTER: a website and program for visualizing STRUCTURE output and implementing the evanno method. Conserv Genet Resour 4(2):359–361
- Ebana K, Kojima Y, Fukuoka S, Nagamine T, Kawase M (2008) Development of mini core collection of Japanese rice landrace. Breed Sci 58(3):281–291
- Evanno G, Regnaut S, Goudet J (2005) Detecting the number of clusters of individuals using the software STRUCTURE: a simulation study. Mol Ecol 14(8):2611–2620
- Excoffier L, Laval G, Schneider S (2005) Arlequin (version 3.0): an integrated software package for population genetics data analysis. Evol Bioinformatics Online 1:47
- Gao L-Z, Zhang C-H, Chang L-P, Jia J-Z, Qiu Z-E, Dong Y-S (2005) Microsatellite diversity within *Oryza sativa* with emphasis on indica–japonica divergence. Genet Res 85(01):1–14
- Garris AJ, Tai TH, Coburn J, Kresovich S, McCOUCH S (2005) Genetic structure and diversity in *Oryza sativa L*. Genetics 169(3):1631–1638
- Hesham AA, Yan W, Fjellstrom R, Jia M, McClung A (2008) Genetic diversity and relationships assessed by SSRs in the USDA World-Wide Rice Germplasm Collection. In: The 2008 joint annual meeting
- Horst L, Wenzel G (2007) Molecular marker systems in plant breeding and crop improvement, vol 55. Springer, Berlin
- Jin L, Lu Y, Xiao P, Sun M, Corke H, Bao J (2010) Genetic diversity and population structure of a diverse set of rice germplasm for association mapping. Theor Appl Genet 121(3):475–487
- Krishnanunni K, Senthilvel P, Ramaiah S, Anbarasu A (2015) Study of chemical composition and volatile compounds along with in-vitro assay of antioxidant activity of two medicinal rice varieties: Karungkuravai and Mappilai samba. Journal of Food Science and Technology 52 (5):2572-2584. doi:10.1007/ s13197-014-1292-z
- Lapitan VC, Brar DS, Abe T, Redoña ED (2007) Assessment of genetic diversity of Philippine rice cultivars carrying good quality traits using SSR markers. Breed Sci 57(4):263–270
- Liakat Ali M, McClung AM, Jia MH, Kimball JA, McCouch SR, Georgia CE (2011) A rice diversity panel evaluated for genetic and agro-morphological diversity between subpopulations and its geographic distribution. Crop Sci 51(5):2021–2035
- Liu K, Muse SV (2005) PowerMarker: an integrated analysis environment for genetic marker analysis. Bioinformatics 21(9):2128–2129
- Lu H, Redus MA, Coburn JR, Rutger JN, McCOUCH SR, Tai TH (2005) Population structure and breeding patterns of 145 US rice cultivars based on SSR marker analysis. Crop Sci 45(1):66–76
- McCouch SR, Chen X, Panaud O, Temnykh S, Xu Y, Cho YG, Huang N, Ishii T, Blair M (1997) Microsatellite marker development, mapping and applications in rice genetics and breeding. Plant Mol Biol 35(1-2):89–99

- Nachimuthu W, Robin S, Sudhakar D, Rajeswari S, Raveendran M, Subramanian K, Tannidi S, Pandian BA (2014) Genotypic variation for micronutrient content in traditional and improved rice lines and its role in biofortification programme. Indian J Sci Technol 7(9):1414–1425
- Nei M (1972) Genetic distance between populations. Am Nat 106:283-292
- Nei M (1973) Analysis of gene diversity in subdivided populations. Proc Natl Acad Sci 70(12):3321-3323
- Ni J, Colowit PM, Mackill DJ (2002) Evaluation of genetic diversity in rice subspecies using microsatellite markers. Crop Sci 42(2):601–607
- Peakall R, Smouse PE (2012) GenAlEx 6.5: genetic analysis in excel. Population genetic software for teaching and research—an update. Bioinformatics 28(19):2537–2539
- Perrier X, Jacquemoud-Collet J (2006) DARwin software
- Powell W, Morgante M, Andre C, Hanafey M, Vogel J, Tingey S, Rafalski A (1996) The comparison of RFLP, RAPD, AFLP and SSR (microsatellite) markers for germplasm analysis. Mol Breed 2(3):225–238
- Pritchard JK, Stephens M, Donnelly P (2000) Inference of population structure using multilocus genotype data. Genetics 155(2):945–959
- Qi Y, Zhang D, Zhang H, Wang M, Sun J, Wei X, Qiu Z, Tang S, Cao Y, Wang X (2006) Genetic diversity of rice cultivars (*Oryza sativa L*) in China and the temporal trends in recent fifty years. Chinese Sci Bull 51(6):681–688
- Qi Y, Zhang H, Zhang D, Wang M, Sun J, Ding L, Wang F, Li Z (2009) Assessing indica japonica differentiation of improved rice varieties using microsatellite markers. J Genet Genomics 36(5):305–312
- Ram SG, Thiruvengadam V, Vinod KK (2007) Genetic diversity among cultivars, landraces and wild relatives of rice as revealed by microsatellite markers. J Appl Genet 48(4):337–345
- Saghai-Maroof MA, Soliman KM, Jorgensen AR, Allard RW (1984) Ribosomal DNA spacer length polymorphisms in barley: Mendelian inheritance, chromosomal location and population dynamics. Proc Natl Acad Sci U S A 81:8014–8018
- Sambrook J, Russell DW, Russell DW (2001) Molecular cloning: a laboratory manual (3-volume set), vol 999. Cold spring harbor laboratory press, Cold Spring Harbor, New York
- Sow M, Ndjiondjop M-N, Sido A, Mariac C, Laing M, Bezançon G (2014) Genetic diversity, population structure and differentiation of rice species from Niger and their potential for rice genetic resources conservation and enhancement. Genet Resour Crop Evol 61(1):199–213
- Tamura K, Stecher G, Peterson D, Filipski A, Kumar S (2013) MEGA6: molecular evolutionary genetics analysis version 6.0. Mol Biol Evol 30(12):2725–2729
- Thornsberry JM, Goodman MM, Doebley J, Kresovich S, Nielsen D, Buckler ES (2001) Dwarf8 polymorphisms associate with variation in flowering time. Nat Genet 28(3):286–289
- Valarmathi R, Raveendran M, Robin S, Senthil N (2015) Unraveling the nutritional and therapeutic properties of 'Kavuni' a traditional rice variety of Tamil Nadu. Journal of Plant Biochemistry and Biotechnology 24 (3):305-315. doi:10.1007/ s13562-014-0274-6
- Varshney RK, Chabane K, Hendre PS, Aggarwal RK, Graner A (2007) Comparative assessment of EST-SSR, EST-SNP and AFLP markers for evaluation of genetic diversity and conservation of genetic resources using wild, cultivated and elite barleys. Plant Sci 173(6):638–649
- Zhang D, Zhang H, Wei X, Qi Y, Wang M, Sun J, Ding L, Tang S, Cao Y, Wang X (2007) Genetic structure and diversity of *Oryza sativa L*. in Guizhou, China. Chinese Sci Bull 52(3):343–351
- Zhang D, Zhang H, Wang M, Sun J, Qi Y, Wang F, Wei X, Han L, Wang X, Li Z (2009) Genetic structure and differentiation of *Oryza sativa L*. in China revealed by microsatellites. Theor Appl Genet 119(6):1105–1117
- Zhang P, Li J, Li X, Liu X, Zhao X, Lu Y (2011) Population structure and genetic diversity in a rice core collection (*Oryza sativa L.*) investigated with SSR markers. PLoS One 6(12):e27565
- Zhao K, Tung C-W, Eizenga GC, Wright MH, Ali ML, Price AH, Norton GJ, Islam MR, Reynolds A, Mezey J (2011) Genome-wide association mapping reveals a rich genetic architecture of complex traits in *Oryza sativa*. Nat Commun 2:467
- Zhao K, Wright M, Kimball J, Eizenga G, McClung A, Kovach M, Tyagi W, Ali ML, Tung C-W, Reynolds A (2010) Genomic diversity and introgression in O. sativa reveal the impact of domestication and breeding on the rice genome. PloS one 5(5):e10780