RESEARCH ARTICLE

Understanding genetic relationship and population structure of Indian soybean varieties using microsatellite markers

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Abstract Thirty-nine simple sequence repeat markers have been used to estimate the genetic diversity and population structure of 78 soybean varieties released in India. A total of 140 alleles were detected and an average of 3.59 alleles per locus was recorded. Polymorphism information content values for all the polymorphic markers across 78 soybean varieties ranged from 0.073 (Satt415) to 0.931 (Satt084), with an average value of 0.59. Mean similarity coefficient was recorded as 0.41 for all the genotypes. Marker index values ranged from 0.051 (Satt498) to 5.556 (SOYSHP176) with an average value of 2.54. The resolving power value ranged from 0.102 (satt498) to 2.086 (GMABABE) with an average value of 1.64. Both the phylogenetic and population structure analysis classified soybean varieties into five main clusters and five subpopulations, respectively. Principal coordinate analysis results are in agreement with both of these methods, which grouped the varieties on the basis of their origin, pedigree and releasing centre.

Keywords Genetic diversity - Soybean - Simple sequence repeat markers - Polymorphism

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Introduction

Soybean (Glycine max L. Merrill; $2n = 40$), a "miracle legume'' native from China, is currently one of the most important crop worldwide. In India, this is the major contributor of edible oil after groundnut, with a cultivated area of 10 million ha and 10.44 million ton production [\[1](#page-8-0)]. However, the average productivity of this crop is one ton/ ha, which is very low to meet the ever increasing demand of edible oil in India. Development of improved and new varieties is the main aspect for increasing the overall production and productivity of this very important oilseed crop. In India, 78 varieties have been developed from various breeding centres and this figure is increasing every year, but no significant improvement in yield or resistance/tolerance to various biotic and abiotic stresses has been achieved so far. After the implementation of ''Protection of Plant Varieties and Farmers Rights Act-2001'', varietal identification got much more attention. When referring to the necessary requirement for the protection of new cultivars, it states that the cultivar should be reliably ''New, Distinct, Uniform and Stable''. Along with the development of new varieties, there has been a growing interest in genetic characterization for protection of varieties provided by PPV and FR Act. Also for the breeding and genetic improvement of crop species, a thorough knowledge of the genetic diversity is necessary to decide the breeding strategies involving the selection of parents to maximize genetic improvement. More accurate and complete descriptions of existing soybean varieties and patterns of genetic diversity could facilitate introgression of diverse germplasm into current commercial soybean genetic base.

Plant breeders have traditionally used morphological and biochemical markers for the genetic diversity analysis and the registration of varieties under PPV and FR Act.

These are limited in numbers, highly influenced by the environment and are growth stage-specific. These traits create difficulty particularly in closely related cultivars. In plants with a narrow genetic base in their gene pool such as soybean, they may not be sufficient for the diversity analysis and identification of genotypes. So a more reliable and efficient method is required for characterisation and identification of genotypes. In such cases, molecular markers can provide additional information about the genetic characterisation, degree of diversity and genetic relationship of the existing genotypes [[2\]](#page-8-0). Plant protection office of USDA Agriculture Marketing Services now accepts microsatellite allelic profiles as supporting evidence for the uniqueness of a cultivar [[3\]](#page-8-0).

Among the class of molecular markers, microsatellite markers/simple sequence repeats (SSRs) are the sequences of a few repeated and adjacent base pairs, which are very useful for variety of applications in plant genetics and breeding. There are a number of advantages of using SSRs over various other molecular markers including their codominant and multi-allelic nature [\[4](#page-8-0)], less expensive PCRbased assay, relative abundance, uniform distribution over the eukaryotic genome [[5\]](#page-8-0) and high reproducibility, which are very suitable for accession discrimination and assessment of genetic variation. SSR markers have been useful for integrating the genetic, physical and sequence based physical maps in plant species and simultaneously have provided breeders and geneticist with an efficient tool to link phenotypic and genotypic variation [[6](#page-8-0)]. Variation in the number of repeats can be detected by polymerase chain reaction (PCR) with the development of primers (20–30 base pairs), specifically designed for amplification and complementary to single sequences flanking the microsatellite. These markers have been used for studying the genetic relationship in soybean $[7-17]$ $[7-17]$ and many other crops including rice [\[18](#page-9-0)], wheat [\[19](#page-9-0)], Indian mustard [\[20](#page-9-0)], faba bean [\[6](#page-8-0)] etc. However, no exhaustive study of genetic diversity, genetic relationship and population structure of Indian soybean cultivars had been carried out so far using SSR markers. The objective of the present study was to reveal the genetic relationship and population structure of Indian soybean varieties released from different soybean breeding centres using SSR markers.

Material and Methods

Plant Material and DNA Isolation

Seventy-eight soybean varieties developed by different breeding centres and released by central/state varieties release committees for different agro climatic regions were taken up for the present study. Detailed description of pedigree and releasing centres has been shown in Table [1.](#page-2-0) Genomic-DNA was extracted from young and tender leaves of soybean varieties using the cetyl trimethyl ammonium bromide (CTAB) method [\[21](#page-9-0)] and purified by RNAase treatment. DNA quality and concentration were evaluated on 0.8% agarose gel electrophoresis stained with ethidium bromide in the presence of different concentrations of undigested λ -DNA and a final concentration of 50 ng μl^{-1} was used for PCR.

SSR Genotyping

Simple sequence repeats markers (39 primer pairs), previously developed [[22\]](#page-9-0), distributed across all the 20 linkage groups of soybean genome, with at least 2 markers from each linkage group were selected and custom synthesized (Table [2\)](#page-4-0). Detailed description of the primers is available at soybean website USDA-ARS Soybean Genome Database ([http://129.186.26.94/SSR.html\)](http://129.186.26.94/SSR.html). Primers were chosen because of their trinucleotide nature and presented polymorphism in the previous studies. The PCR reaction (25 μ I) contained 1X reaction buffer (20 mM Tris-Cl, pH 8.4, 50 mM KCl), 10 nM dNTPs, 50 mM $MgCl_2$, 5 pM primer, 1.0 Unit of Taq DNA polymerase and 50 ng genomic DNA. For standardization of annealing temperatures of SSR primers, gradient PCR was carried out in a gradient thermal cycler. Initial denaturation at $94 \degree C$ for 5 min was followed by 35 cycles at 94 \degree C for 2 min, 47 \degree C for 1 min and 72 \degree C for 1 min. The final extension was carried out at 72 °C for 10 min. The SSR amplified fragments were resolved in 3% metaphore agarose gel in a 1X TBE buffer. The gels were stained with ethidium bromide (0.5 µg/ml) and visualized under UV light.

Statistical Analysis

The prominent DNA bands that were amplified by a given primer, were scored as present (1) or absent (0) for all of the samples under investigation. To determine the utility of the SSR markers, number of amplicons per marker, Polymorphic Information Content (PIC), Major allelic frequency, Marker Index (MI), Resolving power (Rp) and Discrimination power (Dp) were calculated for each pair of primers. The Polymorphism Information Content (PIC) value of individual primer pair was calculated based on the following formula [[23\]](#page-9-0).

$$
PIC = 1 - \sum_{i=1}^{n} P_{ij}^2
$$

Marker index, a product of information content, as measured by PIC, Effective multiplex ratio [\[5](#page-8-0)] and Resolving power (Rp) of each primer combination was

Table 1 continued

calculated [\[24](#page-9-0)]. The Jaccard's similarity index was calculated using NTSYS-pc version 2.02e (Applied Bio-Statistics, Inc., Setauket, NY, USA) package to compute pairwise Jaccard's similarity coefficients [[25\]](#page-9-0) and this similarity matrix was used in cluster analysis using an Unweighted Pair-Group Method with Arithmetic averages (UPGMA) to obtain a dendrogram. NTSYS pc version 2.02 [\[26](#page-9-0)] was also used to perform Principal Coordinate Analysis (PCoA) to identify multidimensional relationship that describes portions of the genetic variance in the data set. Genetic similarity coefficient was calculated for each pair of cultivars [\[3](#page-8-0)] to determine the effectiveness of the group of SSR loci in distinguishing each of the 78 varieties.

Model-based cluster analysis was performed to infer genetic structure and to define the number of clusters (gene pools) in the dataset using the software STRUCTURE version 2.3.4 [\[27](#page-9-0)]. The membership of each genotype was run for range of genetic clusters from value of $K = 2{\text -}10$ using a model without admixture and correlated allele frequencies. The authors used the burn-in period of 100,000 and Monte Carlo Markov Chain replicates of 100,000 [\[28](#page-9-0)] and the analysis was repeated five times. Ln (PD) was derived for each K and then plotted to find the plateau of the K values [\[29](#page-9-0)].

Results and Discussion

SSR Polymorphism

In the present study, 39 STMS markers were used to genotype 78 soybean varieties. The authors have used single locus SSR markers since they provide more reliable scoring of genotypes as compared to multi-locus SSRs. Reproducibility of the amplification patterns was checked

Table 2 Locus, linkage group, chromosome number, range of allele size, no. of alleles per locus, PIC values, major allelic frequency, Dp, MI and Rp

| S. no. | Locus | Linkage group | Chromosome number | Range of alleles size | No. of alleles | PIC values | Major allelic frequency | Discrimination power | Marker index | Resolving power |
|--------------|----------------|------------------|----------------------|--------------------------|--------------------------|------------------|----------------------------|-------------------------|------------------|--------------------------|
| $\mathbf{1}$ | Satt211 | A ₁ | 5 | $150 - 190$ | 3 | 0.628 | 0.438 | 0.637 | 1.885 | 1.999 |
| 2 | Satt276 | A ₁ | 5 | 310-400 | $\overline{4}$ | 0.685 | 0.378 | 0.697 | 2.743 | 1.999 |
| 3 | Satt493 | A ₂ | $\,$ 8 $\,$ | 250-275 | 4 | 0.678 | 0.467 | 0.687 | 2.714 | 1.999 |
| 4 | Satt415 | \mathbf{B}_1 | 11 | 300-380 | 3 | 0.073 | 0.962 | 0.038 | 0.219 | 0.151 |
| 5 | Satt426 | B_1 | 11 | $200 - 230$ | $\overline{\mathcal{A}}$ | 0.653 | 0.513 | 0.652 | 2.613 | 1.955 |
| 6 | Satt063 | \mathbf{B}_2 | 14 | $100 - 155$ | τ | 0.735 | 0.218 | 0.851 | 5.149 | 1.999 |
| 7 | Satt126 | \mathbf{B}_2 | 14 | $125 - 155$ | \overline{c} | 0.813 | 0.703 | 0.399 | 1.626 | 1.081 |
| 8 | Satt194 | \mathbf{C}_1 | $\overline{4}$ | 210-250 | $\overline{\mathcal{A}}$ | 0.401 | 0.75 | 0.406 | 1.602 | 0.999 |
| 9 | Satt524 | C_1 | 4 | 175 | $\mathbf{1}$ | $\boldsymbol{0}$ | $\mathbf{1}$ | $\boldsymbol{0}$ | $\boldsymbol{0}$ | $\qquad \qquad -$ |
| 10 | Satt100 | \mathbf{C}_2 | 6 | $140 - 165$ | 3 | 0.578 | 0.461 | 0.583 | 0.192 | 1.998 |
| 11 | Satt170 | \mathbf{C}_2 | 6 | $75 - 90$ | 3 | 0.184 | 0.911 | 0.165 | 0.554 | 0.352 |
| 12 | Sat_114 | D_2 | 17 | 260-315 | 4 | 0.668 | 0.426 | 0.669 | 2.673 | 1.998 |
| 13 | Satt498 | D_2 | 17 | $200 - 250$ | \overline{c} | 0.025 | 0.974 | 0.506 | 0.051 | 0.102 |
| 14 | Satt129 | D_1a | $\mathbf{1}$ | $110 - 150$ | 4 | 0.672 | 0.387 | 0.678 | 2.688 | 1.999 |
| 15 | Satt184 | D_1a | $\mathbf{1}$ | 150-180 | $\overline{4}$ | 0.597 | 0.583 | 0.567 | 2.389 | 1.666 |
| 16 | Satt216 | D_1b | \overline{c} | 140-220 | $\overline{4}$ | 0.632 | 0.5 | 0.633 | 2.531 | 1.999 |
| 17 | Satt459 | D_1b | \overline{c} | 200 | $\mathbf{1}$ | $\boldsymbol{0}$ | $\mathbf{1}$ | $\boldsymbol{0}$ | $\boldsymbol{0}$ | \equiv |
| 18 | Satt231 | Ε | 15 | $100 - 110$ | \overline{c} | 0.496 | 0.544 | 0.502 | 0.992 | 1.818 |
| 19 | Satt411 | $\mathbf E$ | 15 | $100 - 165$ | 6 | 0.795 | 0.359 | 0.781 | 4.77 | 1.999 |
| 20 | Satt072 | F | 13 | 200 | $\mathbf{1}$ | $\boldsymbol{0}$ | $\mathbf{1}$ | $\boldsymbol{0}$ | $\boldsymbol{0}$ | $\qquad \qquad -$ |
| 21 | SOYHSP176 F | | 13 | $110 - 150$ | 7 | 0.793 | 0.328 | 0.806 | 5.556 | 1.999 |
| 22 | Satt038 | $\mathbf G$ | 18 | 155-190 | 4 | 0.609 | 0.545 | 0.617 | 2.436 | 1.817 |
| $23\,$ | Sat_187 | ${\bf G}$ | 18 | | $\mathbf{1}$ | $\overline{0}$ | $\mathbf{1}$ | $\boldsymbol{0}$ | $\boldsymbol{0}$ | |
| 24 | Sat_127 | H | 12 | 210-300 | 6 | 0.759 | 0.381 | 0.771 | 4.558 | 1.999 |
| 25 | Satt434 | H | 12 | 310-360 | 6 | 0.749 | 0.351 | 0.759 | 4.499 | 1.999 |
| 26 | Sat_105 | \bf{I} | 20 | 220-275 | 4 | 0.851 | 0.375 | 0.721 | 3.403 | 1.994 |
| 27 | Satt587 | Ι | 20 | 125 | $\mathbf{1}$ | $\boldsymbol{0}$ | $\mathbf{1}$ | $\boldsymbol{0}$ | $\boldsymbol{0}$ | $\qquad \qquad -$ |
| 28 | Satt046 | J | 16 | 180 | $\mathbf{1}$ | $\boldsymbol{0}$ | $\mathbf{1}$ | $\boldsymbol{0}$ | $\boldsymbol{0}$ | $\overline{}$ |
| 29 | Satt431 | J | 16 | 190-260 | 6 | 0.778 | 0.302 | 0.797 | 4.671 | 1.999 |
| 30 | Satt539 | K | 9 | $175 - 195$ | 5 | 0.721 | 0.407 | 0.725 | 3.604 | 1.999 |
| 31 | SOYPRP1 | K | 9 | $120 - 150$ | 3 | 0.338 | 0.8 | 0.342 | 1.015 | 0.799 |
| 32 | Sat_099 | L | 19 | 210-285 | 5 | 0.481 | 0.417 | 0.659 | 2.407 | 1.999 |
| 33 | Satt278 | L | 19 | $200 - 280$ | $\overline{2}$ | 0.264 | 0.842 | 0.268 | 0.529 | 0.628 |
| 34 | Satt346 | M | 7 | 195-210 | $\boldsymbol{2}$ | 0.396 | 0.739 | 0.391 | 0.793 | 1.041 |
| 35 | Sat_084 | ${\bf N}$ | \mathfrak{Z} | $175 - 195$ | 5 | 0.931 | 0.553 | 0.637 | 4.659 | 1.783 |
| 36 | GMABABE | N | 3 | $155 - 180$ | 4 | 0.591 | 0.536 | 0.579 | 2.364 | 2.086 |
| 37 | Satt109 | $\mathbf O$ | $10\,$ | $170 - 300$ | 6 | 0.773 | 0.3 | 0.801 | 4.639 | 1.997 |
| 38 | Satt132 | $\mathbf O$ | $10\,$ | 150-200 | 3 | 0.53 | 0.521 | 0.52 | 1.591 | 1.912 |
| 39 | GMSC51 | | | $150 - 180$ | 3 | 0.616 | 0.421 | 0.637 | 1.848 | 1.999 |
| Average | | | | | 3.59 | 0.59 | 0.54 | 0.59 | 2.54 | 1.64 |

by performing two independent reactions for each primer pair. The amplification profile of these markers was consistent uniformly and no new differences were detected. A total of 140 alleles were scored from these 39 primer pairs and 84.61% were found polymorphic. The number of alleles per locus varied from 2 to 7, with an average of 3.59 alleles per marker (Table 2). The highest number of alleles was detected at locus Satt063 and SOYSHP176 with a total of 7 alleles. The respective values for overall genetic variability for Polymorphism Information Content (PIC), Resolving Power (Rp), Major allelic frequency, Marker index (MI) and Discrimination Power (Dp) across all the

78 genotypes are given in Table [2](#page-4-0). PIC values ranged from 0.073 (Satt415) to 0.932 (Satt084), with an average value of 0.59. The present study reported that the genetic diversity index is positively correlated with the number of alleles at a given locus, similar to that earlier reported [\[30](#page-9-0)]. The genetic diversity observed in the present study is comparable to those reported in earlier studies [[31\]](#page-9-0), 4 alleles per locus were detected with an average PIC value of 0.58. In another study, an average of 4.78 alleles per locus was observed among 92 soybean accessions of Hubei using SSR markers [[32\]](#page-9-0). A slightly higher SSR diversity among soybean accessions was also reported, where 6.91 and 6.3 alleles per locus and an average polymorphic information content of 0.68 and 0.63, respectively, were reported [\[33](#page-9-0), [34](#page-9-0)]. In another study, a lower SSR diversity was observed, where they detected 3.23 alleles per locus and an average PIC value of 0.38 in 48 vegetable soybean accession using 22 polymorphic EST-SSRs [\[35](#page-9-0)]. The possible explanation for this observation is that ESR-SSRs are mostly conserved sequences and show lesser variations across genotypes, whereas, in the present study, genomic-SSRs for genetic diversity evaluation were used. MI values ranged from 0.051 (Satt498) to 5.556 (SOYSHP176) with an average value of 2.54. In the present study, the average genetic similarity (GS) among the 78 soybean genotypes was found to be 0.41 and most of the values lied between 0.2 and 0.5, reflecting relatively high degree of genetic diversity among the genotypes. The levels of average GS observed was lower as compared to those earlier reported [\[31](#page-9-0)], where an average GS value of 0.70 was observed and 42% of the accessions were having values higher than 0.75 among 23 soybean genotypes representing several independent breeding sources from Southeastern Europe and five plant introductions from Western Europe and Canada, using 20 SSR markers. A slightly higher average genetic similarity values were also reported [\[36](#page-9-0)], where the average genetic similarities of 0.44 and 0.50 were observed for 40 plant introductions from several Asian and European countries and 39 North American elite cultivars, respectively. On the other hand, an average genetic dissimilarity coefficient of 0.63 and 0.815 was reported for 186 Brazilian soybean cultivars, and for 45 Canadian soybean cultivars and 37 exotic germplasm accessions, respectively [\[34](#page-9-0), [37](#page-9-0)], which was similar to GS reported in the present study. Similar results based on AFLP were reported earlier [\[38](#page-9-0)], where they recorded an average GS of 0.563.

The resolving power (Rp), a feature of marker that indicates the discriminatory potential of the primer, ranged from 0.102 (satt498) to 2.086 (GMABABE) with an average value of 1.64 (Table [2\)](#page-4-0). Rp value takes into account the number of polymorphic bands in a pattern and the informative value of each individual polymorphic band, thus provides a measure of discriminatory power of a marker. In another study, a lower mean Rp value (1.0) was reported in genetic diversity analysis in emmer wheat using SSR markers [[39\]](#page-9-0). The frequency of major alleles was also calculated which ranged from 0.218 to 1 with an average value of 0.54. Discrimination power (Dp) was calculated for all the polymorphic markers, and varied from 0.038 $(Satt415)$ to 0.851 $(Satt063)$ with an average of 0.59.

Phylogenetic Relationships Among the Soybean Varieties

The genetic relationship among the soybean varieties was assessed by a cluster analysis of the similarity matrix using SSR data. A UPGMA cluster diagram grouped all the 78 soybean varieties into five major clusters, I, II, III, IV and V (Fig. [1\)](#page-6-0) and the clusters were comprised of 19, 20, 19, 3 and 17 genotypes, respectively. The genetic similarity coefficients found in the cultivar comparison matrix were relatively low. The cluster I is further divided into two subclusters, and possesses genotypes released from different breeding centers viz., Pantnagar, Jabalpur and Pune, but their parentages were based on US introductions. Cluster II consists of all the varieties of PK, PS and NRC series released from Pantnagar and Indore, respectively and are grouped into different, but same sub-cluster of cluster II. Genotypes such as MAUS61-2, MAUS71 and MAUS81 released from Marathwada Agricultural University (MAUS), Parbhani are also grouped together in cluster II. Similarly, all the genotypes released from New Delhi, Ludhiana and Almora are grouped into different sub-clusters of cluster III, respectively. Cluster IV consists of only the genotypes released from Jabalpur (JS series). All the varieties of MACS series released from Maharashtra Academy for Cultivation of Sciences (MACS), Pune, belong to same sub-cluster of cluster V. Genotypes released from Parbhani viz., MAUS1, MAUS2, MAUS32, MAUS47 and MAUS61 are also clustered together in cluster V. Thus, genotypes released from various parts of India showed diverse clustering patterns. This may be due to the use of diverse parents and breeding material for the development of these varieties. Principal coordinate analysis (PCoA) which is used to show multiple dimensions of the distribution of the genotypes in a scatter-plot (Fig. [2\)](#page-7-0) which was at par with that of grouping as shown in dendrogram (Fig. [1\)](#page-6-0).

The varieties Pusa-16, Pusa-20, Pusa-22, Pusa-40, Pusa-24 and Pusa-37 released from IARI, New Delhi are clustered in the same sub sub-cluster because they have been derived either from Lee or Bragg varieties. Similarly, the varieties PK-262, PK-308, PK-472 derived from Hardee variety and released from Pantnagar are clustered in the same sub sub-cluster of dendrogram. The PS-1024, PS-1029, PS-1024, PS-1092 varieties derived

Fig. 1 UPGMA dendrogram showing genetic relationship among soybean varieties based on SSR markers

from either PK-317 or PK416 and released from Pantnagar also fall in the same sub sub-cluster. The varieties MACS-57, MACS-58, MACS-124 and MACS-450 released from Pune, derived from common parents viz., JS-2 and Improved pelican, are clustered into same subcluster of cluster V. Similarly, varieties of the MAUS, NRC, VLS, JS and SL series are clustered in same sub sub-cluster of the dendrogram based on their origin, pedigree and releasing center. It is because the concerned breeding centre has used the similar plant material for the breeding of these varieties. The seven SSR markers viz., Satt063, SOYHSP176, Satt411, Sat 127, Satt434, Satt431 and Satt109, which are reported to produce the maximum number of alleles/marker, having high discrimination potential and together are effective to differentiate, discriminate and identify all the soybean varieties used in the present study, thus providing concluding evidence about the use of SSR markers for genetic differentiation and identification of soybean varieties.

Population Structure

The SSR marker data were used for model-based clustering using the software STRUCTURE version 2.3.4 for determining the genetic structure among the 78 soybean varieties. Based on maximum likelihood and delta K (ΔK) values, the number of optimum subgroups was five. The level of genetic differentiation or Wrights fixation index (Fst) was calculated through STRUCTURE programme between the five soybean sub-populations assigned to the corresponding A–E and the inferred population structure is given in Fig. [3.](#page-8-0) The sub-populations (A–E) had an Fst value of 0.339, 0.338, 0.251, 0.275 and 0.201, respectively, with an average value of 0.281, indicating moderate population structure. The first inferred population A consists of genotypes released from Indore, Pantnagar and Parbhani. The sub-population B includes varieties belonging to VLS, PUSA and SL series released from Almora, New Delhi and Ludhiana, respectively. The sub-population C consists of varieties released from different breeding centers viz.,

Fig. 2 3-D principal component analysis depicting genetic relationship among 78 soybean varieties

Pantnagar, Jabalpur, Coimbatore and Pune, but their parentages were based on US introductions. Varieties released mostly from New Delhi and Pantnagar belong to sub-population D. Similarly, varieties released from Pune, Parbhani, Bangalore and Jabalpur are grouped into subpopulation E. Sub-population A were found to be genetically more differentiated followed by B, D, C and E, based on Fst value. The reason lies that varieties belonging to sub-population A have been developed using different breeding material having diverse origin, where as the genotypes of sub-population E have originated from similar breeding material released from Jabalpur. Thus, groupings of soybean varieties through STRUCTURE analysis are well in agreement with the distance-based clustering and PCoA, classifying the genotypes on the basis of origin, pedigree and releasing centre.

Fig. 3 The population structure of 78 soybean varieties as obtained from STRUCTURE 2.3.4 software

In summary, the results of STRUCTURE and Fst analysis were in good agreement with the results obtained through phylogenetic tree-based, similarity coefficient distribution and PCoA analyses, grouping the genotypes on the basis of origin, pedigree and releasing centre and confirmed the presence of statistically high genetic diversity and moderate population structure, which is a prerequisite and basic requirement for carrying out linkage disequilibrium (LD) based association mapping (AM) analysis.

Conclusion

The present study showed that combined analysis with both phylogenetic and population structure analysis is a powerful method for characterizing soybean varieties. Also, highly polymorphic SSR markers identified in the present study can be effectively used for accessing genetic structure, relationship and for further molecular breeding programs of soybean. The present results also showed that the polymorphic SSR loci used in the study were able to differentiate the Indian soybean varieties. Hence, there is a great scope for future improvement of soybean in India by hybridizing distant lines identified during the present study and for further selection of the desired genotypes to derive more agronomically superior varieties for commercial production.

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Compliance with Ethical Standards

Conflict of interest The authors declare that they have no conflict of interest.

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