# Genetic Diversity and Population Structure of Sugarcane (*Saccharum officinarum* L.) Collected from Seven Philippine Regions for Use as Breeding Stocks for Crop Improvement

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Selection of parents for hybridization relies on the information on their genetic relationship and diversity which are essential in any breeding program. This study aimed to estimate the extent of genetic diversity and population structure of 76 sugarcane accessions from seven regions in the Philippines using 57 morphological characters and 50 microsatellite markers. The sugarcane collections exhibited moderate to high diversity with mean of H' = 0.72 for qualitative and H' = 0.75 for quantitative morphological characters, respectively. This is corroborated by the analysis of variance (ANOVA) of agronomic parameters, except for stalk length. Unweighted Pair Group Method with Arithmetic Mean (UPGMA) cluster analysis based on morphology subdivided the accessions into 31 clusters which reveal phenotypic variability among sugarcane samples. The fingerprints of the 76 accessions were also evaluated using 45 Saccharum-based genomic SSR and 5 EST-SSR primer pairs to measure genetic diversity and population structure. Based on UPGMA, a total of six clusters were generated with a 0.65 coefficient of dissimilarity, and the sugarcane accessions were further subdivided into five major sub-populations. Out of 50 markers used, 41 (82%) were found to be highly informative with a mean PIC value of 0.69. It was also expected that Saccharum-based genomic SSRs were more polymorphic (92%) compared to EST-SSRs (82%) since the latter preferably amplify in more conserved and expressed sequences in the genome. Out of 2,850 pairwise combinations based on the Jaccard coefficient index, large diverse parental combinations (genetic dissimilarity= 0.51 -0.70) were observed, indicating substantial diversity from the existing breeding pool of IPB-UPLB for genetic improvement. Cluster analysis based on UPGMA, STRUCTURE analysis, and Principal Coordinate Analysis (PCoA) were predominantly consistent. However, no association was observed between the geographical origin and genetic distance of the genotypes based on molecular data. The results showed that accessions were grouped into five sub-populations and genetic differentiation within sub-population was higher (85%) as compared to between sub-population (15%) based on the analysis of molecular variance (AMOVA), suggesting an active exchange of genetic pool across provinces and regions of both Luzon and Visayas islands. The findings from this study will be useful for future breeding efforts by exploiting genetic variation existing in the current breeding population.

Keywords: sugarcane, SSR, genetic diversity, population structure, germplasm

Abbreviations: SSR - simple sequence repeats, EST - expressed sequenced tag, NSIC - National Seed Industry Council, Philsurin - Philippine Sugar Research Institute, PIC - polymorphic information content

## INTRODUCTION

Sugarcane is a widely cultivated cash crop in the tropical and subtropical regions and is the main source of commercial sugar contributing to 75% of global production (Sharma et al. 2014). Interest in its by-products and co-products has been increasing and has considerable effects on the sugar industry (Meyer et al. 2011). The Philippine sugarcane production from October to December 2019 was down by 14.8% compared to 4<sup>th</sup> quarter of 2018 (7-03 million metric tons - 5.99 million metric tons) where the largest producer was recorded in

Western Visayas (4.9 million metric tons) accounting for 81.8 % of the total production followed by Northern Mindanao and Central Visayas at 8.2% and 5.9% share, respectively (Philippine Statistics Authority 2019). At present, the Philippines has a low sugar yield at 5.1 tons of sugar per hectare and sugar recovery per ton of milled cane which is comparatively lower than other countries such as Brazil, Australia, and Thailand with an average of 38.6%. Factors such as cost of production from inputs, interest rates and labor, low yield and low market price that leads to small income of farmers labor shortage especially during harvesting, and adverse effect of climate change (El Niño, La Niña, and typhoons) limit productivity of sugarcane industry in the country (Mendoza 2020).

Commercially available modern sugarcane varieties are highly complex polyploids and heterozygous in nature with a chromosome number range of 100-130 (D'Hont et al. 1996). It was known to be derived from a few interspecific hybridizations between S. Saccharum officinarum (2n = 80) and Saccharum spontaneum (2n = 40)128) (Aitken et al. 2006). This hybridization event led to high linkage disequilibrium and narrow genetic base of most breeding stocks being used in breeding programs around the world (Raboin et al. 2008; Alwala et al. 2009). This adds to the breeding difficulty of the crop in increasing sugar content and improving cane yield aside from long breeding and selection cycle that gain a lot of concerns to all sugarcane breeders. Therefore, the choice of parents and germplasm diversity are the key components of a successful breeding program (Kawar et al. 2009; Sharma et al. 2014). Plant performance such as yield, adaptability, and disease resistance is not only the main focus in parental selection but also the genetic diversity of both parents (Hapsoro et al. 2015). Genetically diverse parents may be selected based on the geographical distribution of the genotypes, agronomic characters, pedigree, and diversity analysis data generated from molecular markers (Melchinger 1998). Utilization of introduced germplasm and the knowledge of genetic remoteness among them are crucial especially on locally collected germplasm, as they can provide adapted genes for better crop improvement (Malik et al. 2010; Gashaw et al. 2016). Therefore, a sufficient understanding of the genetic diversity is essential in creating new crosses and selection of best individual clones as parental materials (Alwala et al. 2006; dos Santos et al. 2012). Traditional ways to investigate genetic variation rely on agronomic and morphological characters (Skinner et al. 1972). However, some of the characters are greatly influenced by various environmental factors creating continuous variation and degree of plasticity

leading to the false positive measurement of genetic diversity (Lima et al. 2002). This makes the use of genetic markers very important since they are stable and can efficiently gauge the genetic diversity of the crop. Several molecular techniques were used in studying genetic diversity in sugarcane within and between members of the Saccharum complex. Among the PCR-based markers, microsatellites or simple sequence repeats (SSRs) have gained considerable importance in the field of plant genetics and breeding (Kalia et al. 2011) and have been extensively used in different genetic diversity studies in plants due to its various attributes. This includes high variability, wide genomic distribution, co-dominant inheritance, high reproducibility, large multi-allelic nature, and chromosome-specific location (Singh et al. 2010).

Currently, there are only few studies on intensive assessment of genetic diversity of locally collected germplasm in the Philippines using Saccharum-based and Expressed Sequenced Tag (EST) microsatellites and morphological characters. The efficient utilization of this introduced germplasm and a better estimate of the available genetic diversity among accessions are requisite to the current sugarcane breeding program of the Institute of Plant Breeding-University of the Philippines Los Baños (IPB-UPLB) with the collaboration of Sugar Regulatory Administration (SRA). The main objectives of the study were to (1) estimate the morphological diversity among sugarcane accessions based on 46 qualitative and 11 quantitative traits, (2) evaluate the genetic diversity and population structure of this collection by using 50 sets of SSR primer pairs and (3) to identify the group of accessions as parental for future breeding efforts.

# MATERIALS AND METHODS

## **Plant Materials**

A total of 76 sugarcane accessions – 65 collected from seven Philippine regions, and ten Sugar Regulatory Administration (SRA) commercial checks and one variety developed by the Philippine Sugar Research Institute (Philsurin) (Figure 1) were planted at the experimental field of the Institute of Plant Breeding (IPB), College of Agriculture and Food Science (CAFS), in Brgy. Tranca Bay, Laguna, Philippines from May 2017 to May 2018. The collected sugarcane accessions per region were as follows: CAR-1, Region I – 3, Region II – 4, Region III – 14, Region Iva – 17, Region V – 9 and Region VIII – 27.

### **Experimental Design and Layout**

The experiment was laid out in Randomized Complete Block Design (RCBD) with subsampling. Cane points



Fig. 1. Philippine map showing the location of the origin of the collected sugarcane (*Saccharum officinarum* L.) accessions. (a) Phillippines (b) Luzon island (c) Visayas islands.

were cut into two budded setts and planted to two rows and five hills in three replicates following the National Seed Industry Council (NSIC) guideline on sugarcane production. Standard practices on field maintenance activities i.e. weeding, fertilizer application, and irrigation were performed.

# Genomic DNA Extraction, Quantification, and Amplification

Young leaf tissues of the 76 sugarcane accessions at approximately 4 months after planting were collected and extracted at the Molecular Plant Breeding Laboratory -Institute of Crop Science (ICropS), College of Agriculture and Food Science (CAFS), UPLB using the modified CTAB extraction protocol of Doyle and Doyle (1987). The DNA samples were quantified using NanoDrop (NanoDrop 1000 Spectrophotometer<sup>™</sup>, Thermo Fisher Scientific Inc., Wilmington, USA) and the quality was checked using agarose gel electrophoresis set-up in a 1% UltraPure Agarose in 1X Tris-borate EDTA (TBE) running buffer, at a constant power of 100V for approximately 20 minutes.

Forty-five *Saccharum*-based genomic SSR markers (Sanguillosa et al. 2019) and five (5) developed ESTprimers were utilized in the study (Table 1). A 15  $\mu$ l PCR reaction was prepared containing 100 ng/ $\mu$ l of template DNA, 1X PCR buffer (10 mM Tris-HCL, *pH* 8.3, 50 mM KCl), 2 mM MgCl<sub>2</sub>, 0.15 nM dNTPs, and 0.2  $\mu$ M primers (both forward and reverse) and 0.05 U of Taq DNA polymerase. Amplification was done using optimized PCR cycle conditions: initial denaturation for 5 min. at 95° C, followed by 35 cycles of 10 sec. denaturation at 94°C, 10 sec. annealing at 55°C and 30-sec elongation at 72°C, with final elongation at 72°C for 5 min. soaking temperature is set at 4°C. Amplified fragments were resolved on 8% polyacrylamide gel which was run at 100V for 4 hours in 1X TBE using ClearPAGETM (C.B.S. Scientific Co., Del Mar, CA). All gels were stained with GelRed (Biotium, CA) and the gel image was captured using GenoSens 1000 Gel documentation system (Clinx Science Instruments Co., Ltd).

### Genotyping

The polyploid nature of sugarcane which made scoring the alleles difficult, each band resulting from the polyacrylamide gel electrophoresis was considered as a locus with two alternative alleles and scored as 1 if present and 0 if absent. The size of the amplified bands on each run was estimated using Invitrogen<sup>™</sup> 100bp DNA ladder (Thermo Fisher Scientific Inc., Wilmington, USA). The gel was then scored using gen analyzer software (GenoSens 1000 Gel documentation system).

#### **Data Analysis**

#### Morphological Characterization

Accessions were characterized morphologically using standardized sugarcane descriptor list developed by PHILSURIN and IPB (2002) sugarcane descriptors described by Moore (1987). Data were gathered at three (3) plant stages in 5 months, 7-8 months, and 10-12 months after planting following the standard genebank characterization protocol. The agronomic components (quantitative traits) were analyzed and interpreted using ProcANOVA (Analysis of Variance) of SASv9.0 (SAS Institute Inc. 2002). To further characterize the phenotypic diversity of all accessions, phenotypic frequency distribution of each qualitative and quantitative characters were used to compute the Shannon Weaver Diversity Index (H') using the formula:

$$\mathbf{H}^{'} = -\sum_{i=1}^{n} p_i(log_2p_i)$$

where p<sub>i</sub> is the proportion of the total number of entries belonging to the i<sup>th</sup> class or phenotype (I= 1, 2, ..., n). Each H' value was divided by its maximum value (log@n) and normalized to keep the values between 0 and 1 (Gashaw et al. 2016). The arbitrary rating scale adapted from Canepoint (Altoveros et al. 2006): maximum diversity (H' = 1.00), high diversity (H' = 0.67 - 0.99), moderate diversity (H' = 0.34 - 0.66), and poor or low diversity (H' = 0.00 - 0.33), was used to classify H' value on each phenotypic characters measured. The coefficient of dissimilarity between each pair of accessions was calculated using distance method correlation in R package PVCLUST. The generated genetic distance matrix was then used for cluster analysis with the Unweighted Pair Group Method based on Arithmetic Averages (UPGMA) using Rstudio v1.1.423 (R Core Team 2017).

#### **Genetic Diversity**

The data were treated as a dominant marker to create a binary matrix that serves as an input file for the analysis. The Polymorphism Information Content (PIC) was taken as a parameter to evaluate the discriminatory power of the 50 microsatellites set to recognize polymorphism and the ability to differentiate sugarcane genotypes into clusters. PIC value was calculated using the formula:

$$PIC_i = 1 - \sum_{j=1}^n {p_i}^2$$

where p<sub>i</sub> is the frequency of allele i raised to the second power for the j<sup>th</sup> marker (Nei 1973). For each SSR primer pair, the number of alleles per locus and the number of polymorphic alleles were also explored.

The genetic dissimilarity among all possible genotype combination was estimated using R function *dist* based on Jaccard's coefficient (Jaccard 1901) from the R package CLUSTER (Maechler et al. 2012). Jaccard coefficient has the advantage of disregarding the shared absence of bands in the paired comparison, thereby reducing the risk of similarity overestimation between samples (Clifford and Stephenson 1975). The dendrogram was constructed according to the Unweighted Pair Group Method with Arithmetic Mean (UPGMA) with bootstrap analysis (nboot = 1000 permutations) using package PVCLUST of RStudio v1.1.423 (R Core Team 2017).

#### **Population Differentiation and Structure**

Analysis of the population structure of 76 sugarcane genotypes was estimated under the Markov Chain Monte Carlo (MCMC) algorithm with the Bayesian model-based clustering method implemented in STRUCTURE software v2.3.4 (Pritchard et al. 2000). For each analysis, given no prior population information, K value was set from 2 to 8 with five iterations for each value of K. For each run, the length of the burnin period was set to 50,000 with 200,000 MCMC iterations. The final K value was then estimated using both Delta ( $\Delta$ ) K calculated using the online program STRUCTURE Harvester (Earl 2012) and the maximum value of L(K) against the given K value. The gene flow (Nm) or the effective number of migrants entering a population per generation was also calculated using the formula  $N_m = 0.25 \times (1 - F_{ST})/F_{ST}$  as described by Zhou et al. (2015). Other genetic statistics for measuring genetic variation within sub-population/cluster such as the number of private/specific alleles, percentage of polymorphic loci, Nei's diversity (h), and Shannon's index diversity (I) were employed in GenAlEx v6.3 (Peakall and Smouse 2006).

The non-parametric analysis of molecular variance (AMOVA) was performed using GenALex v6.3 to detect genetic variance within and among populations based on STRUCTURE analysis (K = 5). The genetic differentiation between populations was determined using PHI<sub>PT</sub> ( $\Phi_{PT}$ ) value (an analogue of Fst) that allows the withinpopulation variance to be suppressed and calculate population differentiation using binary data. To further analyze the genetic relationship of the accessions and compare clustering patterns obtained in UPGMA cluster analysis and population structure, principal coordinate analysis (PCoA) of the binary genetic distance matrix used for AMOVA was carried out using the covariance distance matrix method in GenALEx v6.3. The first three PCoA values were used to create a three-dimensional scatter plot using PAleontological STatistics (PAST v4.02) (Hammer et al. 2001) to further validate the subpopulation grouping.

### **RESULTS AND DISCUSSION**

#### Morphological Characterization

# Morphological Diversity in Qualitative and Quantitative Characters

Phenotyping is an important work in doing plant genetic conservation to maximize the utilization of the germplasm collection, especially in breeding programs. Seventy-six accessions presently conserved at IPB were assessed using 46 qualitative and 11 quantitative morphoagronomic characters following the Philsurin - IPB descriptor. The Shannon-Weaver diversity index is a statistical parameter that was used to determine species diversity in this population with an overall mean qualitative diversity index of 0.72 (Table 2a). Out of the 46 qualitative characters, 32 or 70% were highly diverse and most of this characters were stool and leaf blade-related. Most of the genotypes observed in the population have erect to intermediate plant habit, more compact with 5 - 8 number of tillers, less waxy stalks, and trichomes, and with intermediate trashiness. Moderately diverse traits were observed for 8 (17%) descriptors with indices ranging between 0.43 - 0.66. Two of these traits, split/ growth cracks (H' = 0.63) and corky cracks (H' = 0.60) are important characters to consider during selection since presence of these characters allows infection and infestation of diseases and pests (i.e. spittlebug) that leads to low level of sucrose content and percent soluble solids (Brix) (Garcia et al. 2010). This is the reason why farmers and sugarcane breeders avoid selecting genotypes with these traits. Moreover, six of the 46 characters had a low diversity with an average of 0.15 that includes stool stripes on the cane, leaf scar, dewlap (waxiness and hair),

	e characters.	н'	т	RAIT	н'
IIVAII				Leaf Margin	
Stool	Plant Habit	0.88	Leaf-blade	Pubescence Presence of	0.69
	Tillering Habit	0.97		Genetic Freckles	0.66
	Tillering Density	0.79		Waxiness	0.72
	Tops	0.99		Primary Color	0.93
	Leaf Carriage	0.98		Secondary Color	0.96
	Color	0.81		Presence of trichomes	0.81
	Texture	0.35		Trichome Quality	0.88
	Erectness	0.85	Auricle	Outer Shape	0.87
	Trashiness	0.95		Inner Shape	0.84
	Waxiness	0.79	Dewlap	Waxiness	0.31
	Predominant Internode Color	0.92		Primary Color	0.83
	Secondary Internode Color	0.94		Secondary Color	0.92
	Stripes on Cane	0.18		Shape	0.80
	Splits/growth cracks	0.63		Margin Undulation	0.88
	Corky Cracks	0.60		Hair	0.18
	Corky Patch	0.97	Ligule	Shape	0.43
	Internode Shape	0.65		Hairness	0.95
	Alignment	0.60	Bud	Shape	0.93
	Swelling	0.47		Prominence	0.69
	Growth Ring	0.81		Bud Germ Pore Posi- tion	0.13
	No. of Rows of Root Primordia	0.77		Bud Hair	0
	Leaf Scar	0.10		Bud Tip Position	0.99
	Root Band	0.91		Bud Base Position	1.00
				Mean	0.72

Table 2a. Shannon-Weaver Diversity Index (H') on 46 qualitative characters.

Diversity level adapted from Altoveros et al. (2006) : Maximum (H '= 1.00), high (H' = 0.67 - 0.99), moderate (H' = 0.34 - 0.66), low (H '= 0.00 - 0.33).

and bud (germ pore position and hair). Two qualitative traits were observed to be of extreme indices- 1.0 and 0.0. The bud base position having a diversity index of 1.0 has an equal frequency of genotypes having bud base position (a) at leaf scar and position (b) above a leaf scar. On the contrary, all genotypes exhibited no prominent bud hair (H' = 0). Like most of any crops, presence of hair or trichomes is one of the resistance mechanisms of sugarcane against pathogens such *U. scitaminea* that causes smut in sugarcane as studied and discussed by Da Gloria et al. (1995). Hair serves as barrier in the basal region of the bud thus hindering immediate penetration

of spores and other pathogens to the host plant. This suggests that the introduction of clones with wide phenotypic distribution on those poorly diverse characters is something to look at to improve the average genetic diversity of the collection. However, increasing its variability by introducing clones to your breeding population does not guarantee a genetic gain in the breeding program unless it is positively and directly correlated to yield and sugar-related components.

Sugarcane accessions showed diverse quantitative phenotypes in terms of cane yield, percent Brix, millable canes, plant height, stalk length, internode (length and diameter), leaf blade and bud (length and width) having an average diversity index of 0.75 (Table 2b). The majority of these characters have a moderate to high diversity index. Stool-related characters, the number of millable canes, and stalk length all had a moderate diversity index of H' = 0.64 and H' = 0.65, respectively. Cane yield/plot, leaf blade (length and width), and bud length showed the highest diversity index which ranged from 0.77 to 0.91. The Analysis of Variance (ANOVA) of the mean square of selected quantitative characters resulted in highly significant variations (P < 0.01) but was found nonsignificant for stalk length where P = 0.079 (Table 3). The non-significant variation observed in stalk length is consistent with the result from Muhammad et al. (2014) and Mohammed et al. (2019), who assessed sixteen sugarcane varieties in Pakistan and Nigeria. At the IPB, UP Los Baños condition, the majority of the quantitative characters also performed differently. Both the number of millable cane and stalk length were classified as less variable in the population. Future collection travel and selection of these characters must be considered, as they are important parameters for improving crop biomass.

Overall, it was observed that most of the characters assessed across all accessions were moderate to highly variable based on Canepoint classification. This result Table 2b. Shannon-Weaver Diversity Index (H') on 11 quantitative characters.

	TRAIT	H'
	Cane weight/ plot (kg)	0.77
	% Brix (12 mon)	0.74
	No. of millable Cane	0.64
Stool	Plant Height (m)	0.72
	Stalk length (cm)	0.65
	Internode Diameter (cm)	0.73
	Internode Length (cm)	0.70
l eaf Blade	Length (cm)	0.81
Lear Diade	Width (cm)	0.86
Bud	Length (cm)	0.91
Duu	Width (cm)	0.70
	Mean	0.75

Diversity level adapted from Altoveros et al. (2006) : maximum (H' = 1.00), high (H' = 0.67 - 0.99), moderate (H' = 0.34 - 0.66), low (H' = 0.00 - 0.33).

Table	3.	Analy	sis	of	varian	ce d	of	differ	ent	agronor	nic
compo	nent	s in	76	suga	arcane	(Sac	cha	arum	offic	inarum	L.)
access	ions	-									

	S					
TRAITS	BLOCK	GENO- TYPES	(EE) <sup>1</sup>	(SE)²	CV 3(%)	MEAN
Plant Height (m)	3.81**	1.27**	0.41	0.11	7.89	4.02
No. of Milla- ble Cane	16.92 <sup>ns</sup>	12.20**	6.73	4.73	12.94	6.30
Stalk Length (cm)	55832.50**	6652.53 <sup>ns</sup>	5045.98	1995.77	21.63	147.42
Internode Length (cm)	144.19**	28.54**	12.05	4.66	14.33	10.96
Internode Diameter (cm)	17.00**	6.43**	3.28	1.03	9.48	9.14
% Brix (TOP)	288.16**	45.86**	7.64	3.48	5.15	22.87
% Brix (MIDDLE)	188.30**	40.79**	9.60	4.06	5.91	22.99
% Brix (BOTTOM)	117.19**	35.80**	8.38	3.85	5.23	23.48
Total % Brix	189.73**	38.25**	6.44	1.39	5.60	23.15
Cane Yield	10151.07*	6107.46**	2918.04	1189.58	25.25	95.05

t, \*\*significant at 0.05 and 0.01 probability levels, respectively.

ns no significance, <sup>1</sup>Experimental Error, <sup>2</sup>Sampling Error, <sup>3</sup>Coeifficent Variation.

would provide future strategic research plan to sugarcane breeders emphasizing on conservation and exploitation of existing genetic variability of the collection. Also, it provides insights on the geographic distribution of the morphological characteristics of the sugarcane accessions throughout the regions of origin of collection.

#### **Cluster Analysis**

The association among the 76 sugarcane accessions as revealed in the Unweighted Pair Group Method with Arithmetic Mean (UPGMA) cluster analysis is shown in Figure 3. The analysis divided the accessions into 31 clusters using the 57 morphological markers at 0.8 coefficient of similarity. It was observed that nine clusters had three to eight accessions and more than half (69%) of the clusters were composed of one to two accessions. This observation already reveals the genetic diversity of the collected accessions. Among the single-accession cluster, most of those accessions were collected from regions I, III, IVA, VI, and VIII particularly the provinces of Leyte, Negros Occidental, Aurora, Batangas, Samar, Romblon, and Ouezon. The biggest cluster - cluster I was composed of eight accessions coming from five geographically distant regions. The same clustering pattern was observed in clusters II, III, XI, XIV, XVII, and XXVIII having three accessions collected from all sampling regions. Two next

large clusters were groups of Luzon regions, cluster V and XX with seven and five accessions, respectively. This showed that there was no distinctive clustering pattern according to their place of collection. Some accessions collected from different regions tend to group together and likewise, accessions from Luzon were sometimes clustered to accessions from the Visayas. This indicates the likelihood of having a shared pool of conserved alleles among collected accessions and also disclosing the possibility of the close similarity between their evolutionary courses. Similar findings were observed from the work of Ftwi et al. (2016) and Gashaw et al. (2016) from their cluster analysis using the phenotypic data set. Out of the 13 clusters composed of pairedaccessions, four clusters were collected in the same provinces or regions. FIC-34 and FIC-51 of Cluster IV, for example, were both collected at Brgy. Putlan, Carrangalan, Nueva Ecija. Similarly with FIC-41 and FIC-76 (cluster XVIII) which were both commercial checks developed by Sugar Regulatory Administration having a trait to survive under drought stress condition. Cluster VII (FIC-39 and FIC-49) and cluster XXIX (FIC-14 and FIC-69) also contained paired-accession from region VIII and IVA, respectively. Having samples collected from the same province or regions, the presence of duplicates was not observed thereby explaining that the collected accessions from the same geographic regions or province had different genetic backgrounds. Thus, genetic variation between local sugarcane clones within the region suggests some degree of genetic diversity due to variability in farmer's field condition and the possibility of human-mediated gene flow apart from artificial selection.

#### **Genetic Diversity**

# Descriptive Statistics of 50 Simple Sequence Repeats (SSR) Markers

Microsatellite markers have been successfully used in assessing the genetic relationships of individuals within a population. One consideration in selecting a genetic marker is its polymorphic information content (PIC) which is a measure of marker's informativeness. A total of 259 alleles were amplified using the 50 SSR markers across accessions with a mean of 5.40 alleles per genotype (Table 1). The number of alleles amplified per locus by one primer pair varied from one (Sach28 and Sach33) to ten (Sach1, Sach7, and Sach16) with fragment size ranging from 65 - 610 bp, indicating a high level of heterozygosity and polyploidy nature of sugarcane that led to amplification of more number alleles per locus. Among the 50 SSR markers, only 41 (82%) were highly informative with a mean PIC value of 0.69. The highest

	Code	SSP Motif	Orientation	Drimers (5' to 3')	ΛΤ2	DD (	NR4	
	Code		Chemand			Г Т (бр)-	ND.	FIQ.
	Sach 1	(TCGA)₃	Forward		54.6	130-300	10(9)	0.91
Conomia CCDa			Ferward					
Genomic SSRS	Sach 2	(CT)19	Poverse	CETACTCACACCOTTCAATT	55.3	105-215	5(5)	0.91
			Forward	TCGTAATCTCCGTCTACTTTT				
	Sach 3	(CAAA) <sub>3</sub>	Polyaraa		54.7	135-235	3(2)	0.37
			Forward	ATCATCATCACACCACATCA				
	Sach 4	(TTC) <sub>4</sub>	Reverse		55.3	155-195	4(4)	0.76
			Forward	GTAAAATGTTTTTCCCCCTTA				
	Sach 6	(AATA) <sub>4</sub>	Reverse	TGTGTCAAAAGATTTGATGTG	55.5	105-220	4(3)	0.81
			Forward	CTTTCCCTGCAAGATTTTC				
	Sach 7	(AGAAA)₃	Reverse	ATGATCACAGTCTGAGAAAGG	55.5	190-340	10(10)	0.94
			Forward	TCGTAGACTGCGTACAACCA				
	Sach 8	(CAGG)₃	Reverse	CGCGTAGACATAGCAACTAAC	54.7	145-195	4(4)	0.79
			Forward	GAATTTCTACTCCACCCATCT				
	Sach 9	(AAG)4	Reverse	TTAGCTITCTTTTGTCCCTTT	54.0	145-160	3(3)	0.72
			Forward	ATATAAAAACCACTCCCGAAC				
	Sach 12	(CCAG) <sub>3</sub>	Reverse	GTTACCGGTGGTGATGAG	57.0	160-195	5(5)	0.72
		(	Forward	GGTGCTGATTTGTTATGAGAG				
	Sach 14	(ACTG)₃	Reverse	GAACATACTCCAGCGTTCAT	52.1	125-250	9(9)	0.94
	<u> </u>	(070)	Forward	ATATGTCAACCGAGTGTTTTG			- (-)	
	Sach 15	(CTC) <sub>4</sub>	Reverse	CTGAGTTGGAGAAGAAGAGG	55.0	125-240	7(7)	0.89
	<u> </u>	(1000)	Forward	CCTCTTTCTTCTCCAACTCAG		o		
	Sach 16	(AGGC)₃	Reverse	GCTGCCATCTTCTTTAACTC	50.8	210-495	10(10)	0.97
	0 1 40	(0.4.0.0)	Forward	TCGTTAGAACTTGCTTTTTGT	0	440.000	0(0)	0.00
	Sach 18	(CACG)4	Reverse	GAGATAGGCTCAATCTTGAAA	55.0	110-360	9(9)	0.86
	0		Forward	AGCCTATCTCCTATGGCTATG	<b>F</b> 4 <b>7</b>	05.00	2(2)	0.50
	Sach 19	(CATG) <sub>3</sub>	Reverse	TCGTAGACTGCGTACATGAG	54.7	65-90	3(3)	0.59
	Cash 00	(	Forward	TAAAATGTTGTTCCAACCATC	F0 4	110.050	C(4)	0.04
	Sach 20	(AATA) <sub>3</sub>	Reverse	TCTGCTCATTTTGTTTGTTCT	52.1	110-250	6(4)	0.81
	Cash 01		Forward	GGAAGTAGAGGTGGTTCTTGT	FF 0	90.040	0(0)	0.01
	Sachzi	(GAGGAC)3	Reverse	CTGTTGTCGCTATCGTAATG	0.00	00-240	9(9)	0.91
	Sach 22	(004)	Forward	GGCGACTAACTCTATCAACAA	56 A	100 200	6(6)	0.96
	Sacinzz	(GCA)5	Reverse	TAGCAGCAAAGAGATGAATGT	30.4	100-200	0(0)	0.00
	Sach 23	(TATT).	Forward	ATTTCACTGAACACGTATGCT	55 /	140 360	6(5)	0.68
	5801125	(17,11)3	Reverse	TTGTTTAGCTTCAAAATGGAC	55.4	140-500	0(3)	0.00
	Sach25	(ATT) <sub>c</sub>	Forward	TATGAAAAGGCAGGCATACTA	55 3	160-320	7(7)	0.80
	0001120	(711)5	Reverse	GTCAACTTGTCAGAACCATGT	00.0	100-520	(1)	0.00
	Sach 26	(CATG) <sub>2</sub>	Forward	GCACGTAAATCAAGTGAATAAA	56.0	180-360	4(3)	0 97
	Cuchi Ec	(6/110)3	Reverse	CCACACAACTGATGAAGAGAT	00.0	100 000	1(0)	0.01
	Sach 27	(TTCTTT) <sub>3</sub>	Forward	TAGAAAGACACTTGGAGATGC	54.8	160-230	5(3)	0 70
	00001121	(	Reverse	GGTAACGGGTTTGGAATATAA	0.110		0(0)	0.1.0
	Sach 28	(TTC)₄	Forward	TIGGCAGACACCITCTIG	55.2	120	1(0)	0
		( ).	Reverse	GGTCAGAGCAATTTCAACC			( )	
	Sach 29	(TGCA) <sub>3</sub>	Forward		55.3	140-380	7(7)	0.86
		. ,	Reverse					
	Sach 32	(AT) <sub>6</sub>	Polwaru		54.6	140-380	8(8)	0.92
			Forward	ATCTATCTCATTCTCCTCCTT				
	Sach 33	(CTG)4	Povorso		56.5	140	1(0)	0
			Forward	CCTTACTTCATCCTTCTTCA				
	Sach 36	(TTGT)₃	Reverse		55.1	200-430	6(6)	0.67
			Forward	GAATTTCTACTCCACCCATCT				
	Sach 38	(AAG)4	Reverse	TIAGCITICITITGICCCITI	55.0	80-180	6(6)	0.55
			Forward	TIGGGICIGCATGCIACT				
	Sach 39	(TGT)4	Reverse	ATGCGTAGACCTAGCAACAG	55.5	80-200	4(4)	0.70
			Forward	CAAGCTCTTCCTCTCTCTGTTT				
	Sach 40	(TTTC) <sub>4</sub>	Reverse	CATGCAGACCCAACAGTAG	55.5	150-260	5(5)	0.83
	<b>_</b>	/ <b>- -</b> :	Forward	ATAATTAGCGGAGCACACTTT				
	Sach 41	(GCCG)₃	Reverse	GTGGTGAGCCTCCTCTTC	56.0	140-180	4(3)	0.62
	0 1 10	(700)	Forward	GAGGTTTGACTCATGGATACC		440.450	0(1)	0.00
	Sach 42	(IGGA) <sub>3</sub>	Reverse	GAAATTTTTGCTCGTTTCC	55.5	110-150	2(1)	0.29
	0	(4 4 6 4)	Forward	GCTTTGAATACCAGCACATAG	<b>FF A</b>	00.040	0(0)	0.07
	Sach 43	(AACA)3	Reverse	ATGTACGTTGTGCTCTTCCTA	55.0	90-240	р(р)	0.87

Table 1. Microsatellite primers used in diversity analysis of sugarcane (Saccharum officinarum L.) accessions.

#### Table 1. Continuation...

	Code	SSR Motif	Orientation	Primers (5' to 3')	AT <sup>2</sup>	PR <sub>(bp)</sub> <sup>3</sup>	NB <sup>4</sup>	PIC⁵
	Sach 11	(CCA)-	Forward	ACATTTTTCAGCTTTGTTCAC	55 <b>5</b>	160 220	3(2)	0.20
	Saci1 44	(CCA)5	Reverse	ACCTTTCAGACCATCTGTTTC	55.5	100-220	J(Z)	0.20
	Sach 15	(TCCA)	Forward	CACGCACATCATGTTCATAC	55 <b>5</b>	00 170	5(1)	0.76
	Saci145	(100A)3	Reverse	GTACCTGGCCATCTCCTAC	55.5	30-170	5(4)	0.70
	Sach 16		Forward	GTCTCAATGCTCTGCTCTG	54.5	160 200	2(2)	0.40
	Saci140	(1110)3	Reverse	TCCCATCGTTGTACAGATTAC	54.5	100-200	2(2)	0.49
	Sach 17		Forward	CTGCATTTCTTTCTTTCTTTG	55.0	160-170	3(2)	0.41
	5461147	(1101)3	Reverse	TCCCATCGTTGTACAGATTAC	55.0	100-170	J(Z)	0.41
	Sach 18		Forward	GCTCGTAGACTGCGTACAA	55.0	130-210	6(6)	0.82
	5401140	(010010)3	Reverse	CATCTGCAGAGGATCTCG	55.0	130-210	0(0)	0.02
	Sach 10	(ΔΤΔ).	Forward	CCCCTAAAAACTTAGGTCTGA	55.0	150 100	4(4)	0.71
	Saci1 45	(ATA)4	Reverse	CGTTAATTTGTTAGTGCCTGT	55.0	130-190	4(4)	0.71
	Sach 50		Forward	TTTCTCGATGAAGGAATATGA	55.0	240 540	7(7)	0 00
	Sacinou	(ATGA)3	Reverse	GCCTCTTTTCCTTGTTTATGT	55.0	240-340	I(I)	0.90
	Sach 52	(TTCC)	Forward	GTCACCTTTCTGACTTCACTG	54.5	150 210	4(4)	0.70
	Sach Jz	(1100)3	Reverse	TTCTAGCAGAATCCTCAAAAG	54.5	130-210	4(4)	0.70
	Sach 53		Forward	TACCAAATACAAACGAAATGC	55.0	130-170	1(3)	0.71
	Saci 55	(0044)3	Reverse	TAAGCTGAAACAAGCTGAAAC	55.0	130-170	4(0)	0.71
	Sach 5/		Forward	CAAGTACAGCGTCGTCAGT	55.0	1/0-170	3(2)	0.46
	54611 54	(010000)4	Reverse	GGACAAACAAACAGAGAACAG	55.0	140-170	J(Z)	0.40
	Sach 55		Forward	CAAGCTATGGTCTTTCTTTGA	55 5	120-200	8(8)	0 02
	54611 55	(1111)3	Reverse	CTAGAACTTGATGCCAAGTCA	55.5	120-200	0(0)	0.52
	Sach 56	$(\Delta\Delta\Delta\Delta\Delta\DeltaG)_{2}$	Forward	AGGTAACGGGTTTGGAATA	54 5	340-400	2(2)	0.48
	0001100	(//////0)3	Reverse	AGACACTTGGAGATGCTCTTA	04.0	040-400	2(2)	0.40
	Sach 57	(GAAG)	Forward	TGAAAATGGGAAAACAGACTA	55.0	140-175	5(5)	0 79
	Oddin 07	(GAAG)3	Reverse	AGTAGTGCTGGTGAACAGGTA	00.0	140-175	0(0)	0.75
EST SSBS	SOD 6		Forward	GCTGTTGGGGATTGATGTCT	60.0	100-200	4(3)	0.62
LOT CONO	000		Reverse	ATGGTCAAACAGCCGAAAAC	00.0	100-200	+(J)	0.02
	136057		Forward	GGATCGCGTCCTCAAGATAG	60 5	430-610	5(5)	0.82
	1501 5		Reverse	TCGCTCACAACCTGTATTCG	00.5	430-010	5(5)	0.02
			Forward	CCGTCTCGTGAACCATCC	50 5	410-560	6(6)	0.56
			Reverse	GCAACAACACTGCCACAAAC	55.5	410-300	0(0)	0.00
			Forward	GCACCACGAGAAGAAGAAGG	60.0	100 200	4(4)	0.74
	WKKY-IF <sup>®</sup>		Reverse	GCCCACCTCTCAGTCTCTCA	00.0	100-300	4(1)	0.74
			Forward	GCATGATCTTCGTCCTCGTC	04.0	440.040		0.07
	Aqua <sup>10</sup>		Reverse	CGCCGTACCTGTCGAAGTAG	61.0	140-340	7(7)	0.87

<sup>1</sup> repeat type , <sup>2</sup> annealing temperature, <sup>3</sup> product range, <sup>4</sup> no. of bands (No. of polymorphic band), <sup>5</sup> polymorphic information content, <sup>6</sup>super oxide dismutase, <sup>7</sup> indole-3-glycerol phosphate synthase, <sup>8</sup> late embryogenesis abundant protein, <sup>9</sup>WRKY transcription factor, <sup>10</sup> aquaporin.

PIC value (0.97) was observed on SSR markers Sach15 and Sach25, whereas the lowest PIC value (0.20) was observed on primer set Sach55. A PIC value of 0.7 and 92% polymorphism was observed between genomic SSRs while PIC value and percent polymorphism for EST-SSRs observed were 0.72 and 82%, respectively. It is expected that genomic SSRs are more polymorphic compared to EST-SSRs since the latter amplified more in regions of the sugarcane genome that are conserved (Parthiban et al. 2018).

# Genetic Relatedness Among Accessions and Phylogenetic Analysis

Based on the estimated genetic dissimilarity (GD) (Jaccard's coefficient index) values as shown in the pie chart, a total of 2850 pairwise combinations were created from 76 accessions (Figure 2). Analysis of SSR data showed that the pairwise genetic dissimilarity values ranged from 0.301 (between FIC-14 and FIC-15) to 0.688 (between FIC-05 and FIC-27) with a mean of 0.564. Five hundred forty four combinations were highly diverse

with a GD index between 0.61 – 0.69, for example, FIC-05 (Cluster II) and FIC-27 (Cluster VI), were both genetically diverse and geographically apart from each other. High level of dissimilarity was also recorded between FIC-10 and FIC-63 (0.685), FIC-10 and FIC-65 (0.684), and FIC-05 and FIC-57 (0.684) (data not shown). GD values ranging from 4.7 to 53.8% were reported by Zeni Neto et al. (2019) using 36 SSR markers in 82 sugarcane accessions that are parental materials of the Sugarcane Breeding Program of



Fig. 2. A pie chart depicting the number of crosscombination across each set of genetic distance values.



Fig. 3. Phylogenetic tree of 76 sugarcane (Saccharum officinarum L.) accessions and varieties using 57 morphological markers.

Brazil. A large chunk of combinations (1896) exhibited moderate diversity was in the range of GD of 0.51 - 0.60, which reflects a substantial level of diversity among experimental material studied. On the contrary, 14% (410) of the total combinations were with GD between 0.30 - 5, and these groups of highly similar combinations of accessions need to be avoided during artificial hybridization. According to previous research, using these highly similar combinations for breeding resulted in less genetic gain (Hemaprabha et al. 2013; Padmanabhan and Hemaprabha 2018). The result of the study opens up a selection of highly diverse parental materials from the present-day breeding pool for guided hybridization. This will serve as an advantageous step to the current breeding program of IPB-UPLB for varietal development of the crop. Strategic utilization of these large diverse combinations in the breeding program will establish a good transgressive population with a wide array of good agronomic characters such as biomass and sugar-related traits and expedite the breeding process in planning crosses for hybridization.

At 0.65 coefficient of dissimilarity, a total of six clusters were generated based on Jaccard's coefficient and Unweighted Pair Group Method with Arithmetic Mean (UPGMA) as shown in Figure 4. Out of which, two singletons, FIC-04 and FIC-39 were observed as distinct from each other and the rest of the clusters based on the molecular marker data. The FIC-04 of cluster I was considered distinct based on its phenotype due to its good tillering density (> 8) with compact tillering habit while FIC-39 of cluster IV had a characteristic of recline

growing habit. Cluster III formed the largest cluster consisting of 33 locally collected accession from 13 provinces and five SRA check varieties. Cluster VI included 17 accessions where the majority were collected from regions III and VIII particularly in the provinces of Nueva Ecija and Leyte. The third-largest group cluster V contained 12 accessions followed by cluster II with 8 accessions coming from six regions of Luzon and Visayas. It was also observed that the commercial check varieties were dispersed from the four main clusters excluding the single-accession clusters. There was no distinctive trend of clustering genotypes according to their place of collection, similarly from the result of cluster analysis using morphological data where most of the samples from different regions tend to cluster frequently than samples coming from the same region. These findings are molecularly supported with the observation in sugarcane accession where materials from the same country were often clustered in different groups and likewise, materials from different countries were often in the same cluster, largely because the genetic exchange of gene pool between countries is usually observed (Tena et al. 2014; Singh et al. 2020).

#### **Genetic Structure and Population Differentiation**

The structure harvester computed the best value of K at 5 ( $\Delta$ K = 41.068), suggesting that the entire accessions set can be divided into five sub-populations viz. SP1, SP2, SP3, SP4, and SP5 (Figure 5). Based on the membership proportion for each accession with probability  $\geq$  50% were placed into the corresponding population and



Fig. 4. Dendrogram (UPGMA) of 76 sugarcane (Saccharum officinarum L.) accessions using Jaccard's coefficient dissimilarity of 0.65.

others classified as admixture indicated by bar colors (Figure 6). Both SP1 and SP5 were the biggest population comprised of 17 accessions and followed by SP2, SP4, and SP2 with 16, 14, and 12 accessions respectively. The 13 accessions across five sub-populations except SP3 were considered as an admixture with a membership proportion of less than 50% including three SRA commercial checks (FIC-22, FIC-41, and FIC-45). An admixture of sugarcane samples between two-subpopulations was normally observed aside from the fact that different sugarcane breeders have a certain specific trait of interest that contributes to the structure of the breeding population (Luo et al. 2019; Wu et al. 2019). It was found out that there was high genetic variability among sub-population as revealed by the percentage of polymorphic bands (60%), where the highest mean percentage of polymorphic bands was recorded in SP2 (66.93%), and SP4 (58.76%) as the least. The number of private bands among sub-populations ranged from 7 (SP4) to 19 (SP2). The mean genetic diversity among subpopulation was estimated using Shannon's information index (*I*) and Nei's gene diversity (*h*) was recorded as 0.282 and 0.183, respectively. Among the sub-population, the highest degree of variability was exhibited by sub-population, SP2 (h = 0.197 and I = 0.306), and the lowest was recorded in a sub-population, S4 (h = 0.182 and I = 0.280) (Table 6). The studied population was genetically less diverse compared with the study on exotic sugarcane cultivars (h = 0.214 and I = 0.321) in Ethiopia by Tena et al. (2014), mainly because of the difference in the number of accessions evaluated and most of their accessions were coming from 15 different sources in 14 countries.

Analysis of molecular variance (AMOVA) analysis was also used to assess the level of genetic variation among five sub-populations and within them based on defined grouping from structure analysis (Table 4). AMOVA with  $\Phi_{PT}$  calculation showed genetic variance among and within sub-population was statistically significant with a value of  $\Phi_{PT}$  = 0.152 (*P* value < 0.001) and the variation within a population (85%) was



Fig. 5. Population structure of 76 collected sugarcane (*Saccharum officinarum* L.) accessions with a value of K at 5 based on 50 SSR markers (left) and the maximum adhoc measure  $\Delta K$  determined by STRUCTURE HARVESTER with a sharp peak at K = 3.



Fig. 6. Membership proportion of each sugarcane (*Saccharum officinarum* L.) accession based on STRUCTURE analysis at K value = 5.

significantly higher than that among sub-population (15%).  $\Phi^{\text{PT}}$  (analogous to fixation index, Fst) measures the genetic variation within the population showed SP4 ( $\Phi_{PT}$ = 0.134) to be more variable, while among the population, SP1 and SP4 ( $\Phi_{PT}$  = 0.216) exhibited more variability (Table 5). According to Peakall and Smouse (2006), the Fst value of zero indicates no differentiation between the sub-populations, otherwise when the value is one it indicates complete differentiation. Also, the Fst value greater than (> 0.15) is considered significant in differentiating populations (Wright 1965), where the present study exhibits a considerable amount of genetic differentiation among studied populations. Gene flow (N<sub>m</sub>) is the migration of genetic variation from one population to another. The rate of gene flow among the population ranged from 0.24 (SP4) - 0.57 (SP2) with an average of 0.39 (Table 6). It was reported that gene flow value less than one suggest limited genetic exchange between sub-populations (Deng and Li 2007). The average Nm value from the five sub-populations supports the previous result from the AMOVA where there is high genetic differentiation within sub-population (85%) as compared within sub-population (15%). These results corroborate from the previous studies that reported genetic differentiation in the sugarcane population (Wu et al. 2019; Zeni Neto et al. 2020; Singh et al. 2020). Despite that sugarcane is clonally propagated there is still substantial genetic differentiation within subpopulation among studied sugarcane collection. According to Zheng et al. (2017), perennial crop species that are vegetatively propagated and outcrossing are generally highly heterozygous and maintain high levels of genetic variation within populations. To estimate the genetic relationship among sub-population principal coordinates analysis (PCoA) was carried out, which was based on the covariance matrix with data standardization using GenALEx software (Figure 7). Two and threedimensional scatter plots revealed that the first three principal coordinates accounted for total variations of 17.98%. According to PC-1 explaining 8.36% of the variability expressed among accessions, samples were somehow grouped into clusters isolated from the others except for P1 and P5. Looking at PC-2 accounting for 4.97% variation, similar observation were revealed showing accessions from P3, P4, and P2 can be distinctively separated as a unique group while P1 and P5 were both concentrated in the middle between 3<sup>rd</sup> and 4th quadrant. To further characterize the relationship of the populations, three-dimensional PCoA was employed. The PC-3 accounted for 4.64% of the total variation, allows the accessions from the later population to be discretely separated as shown in Figure 7. PCoA results showed that the genetic distance between samples does not correlate with the geographical location where the accessions being collected. FIC-14 and FIC-15 for example were collected from geographically distant provinces of Luzon. Present findings were analogous with the recent studies on sugarcane diversity (Singh et al. 2020). Also, the analysis was comparable in terms of their genetic relationship and structure with the UPGMA clustering using molecular marker data set, AMOVA, and STRUCTURE analysis.

### CONCLUSION

Sugarcane despite being asexually propagated exhibited moderate to highly variable morphological characteristics. The UPGMA cluster analysis, in which sugarcane accessions were morphologically subdivided into 31 clusters, backed up this variability. When compared to molecular data, clustering based on



Fig. 7. Two (left) and three (right) - dimensional principal coordinates analysis (PCoA) scatter plots of 76 sugarcane (*Saccharum officinarum* L.) accessions based on 50 SSR markers. Red, green, blue, yellow, and pink colors represent the population P1, P2, P3, P4, and P5, respectively.

morphological parameters gives an indication of how phenotypically diverse the experimental samples analyzed are, but it is ineffective in grouping the samples based on their origin. Fingerprints of the 76 accessions using 45 genomic-SSR and 5 EST-SSR primer pairs were

Table 4. Analysis of molecular variance (AMOVA) between five sub-populations of sugarcane (*Saccharum officinarum* L.) accessions based on defined grouping from STRUCTURE analysis.

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Source	df	SS	MS	Est. Var.	%	P-Value
Among Pops	4	1096.167	274.042	13.220	15%	<0.001
Within Pops	71	5248.518	73.923	73.923	85%	<0.001
Total	75	6344.684		87.142	100%	

Table 5. Pairwise (PHI<sub>PT</sub>) genetic distance between sub-population of sugarcane (*Saccharum officinarum* L.) accessions based on defined grouping from STRUCTURE analysis.

Sub-Pop	SP1	SP2	SP3	SP4	SP5	
SP1	0					
SP2	0.122	0				
SP3	0.183	0.150	0			
SP4	0.216	0.116	0.138	0		
SP5	0.093	0.129	0.191	0.201	0	
Mean	0.123	0.103	0.132	0.134	0.123	

Table 6. Summary of diversity	estimates for each of the five
sub-populations of sugarcane	e (Saccharum officinarum L.)
accessions based on defined	grouping from STRUCTURE
anaiysis.	

Sub-Pop	NGS	PPB (%)	NPB	Ave. h	Ave. /	Ave. F <sub>st</sub>	Ave. Nm
SP1	17	58.96	14	0.181	0.278	0.4099	0.3599
SP2	16	66.93	19	0.197	0.306	0.3058	0.5675
SP3	12	50.60	17	0.168	0.254	0.3844	0.4004
SP4	14	58.76	7	0.182	0.280	0.5104	0.2398
SP5	17	64.74	19	0.186	0.291	0.3992	0.3763

<sup>1</sup>number of genotypes, <sup>2</sup>percentage of polymorphic bands, <sup>3</sup>number of private bands, <sup>4</sup>mean of Nei's diversity (*h*), <sup>5</sup>mean of Shannon's information index (*I*), <sup>6</sup>mean of F<sub>st</sub> value, <sup>7</sup>mean of gene flow (N<sub>m</sub>).

subjected to different bioinformatics tools to identify the genetic relationship, diversity, phylogeny, population structure, and principal coordinate analysis. The results showed a large portion of moderate to highly diverse (GD = 0.51 - .70) pairwise combination based on the Jaccard coefficient index which can be successfully exploited through molecular selection- and hybridization -guided approach. The clustering based on UPGMA, structure, and PCoA was predominantly consistent with minor differences due to observed admixtures. However, no association was observed between geographical and genetic distance. Clustering revealed that accessions from the different regions or provinces were generally, but not totally, clustered into the same cluster and more so with accessions from the same region or province normally falls into different clusters. Current results showed that accessions were clustered into five sub-populations and genetic differentiation within sub-population was high than that among sub-population. Among the subpopulations, SP2 (comprising of FIC-24, FIC-25, FIC-26, FIC-28, FIC-29, FIC-30, FIC-31, FIC-33, FIC-34, FIC-35, FIC-36, FIC-37, FIC-38, FIC-39, FIC-63, and FIC-64) would be the best group for selecting candidate parents for hybridization having moderately high genetic variation (h = 1.82, I = 28, Fst = 0.51) with minimal gene flow ( $N_m = 0.23$ ) and also intercrossing these with the accessions from SP1 and SP5 will also broaden the genetic pool of IPB-UPLB sugarcane germplasm. In summary, the results of the study serve as a baseline for future breeding efforts and expedite the breeding processes in selecting parents for crosses while maintaining genetic diversity in the breeding population.

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