ORIGINAL ARTICLE

Genetic diversity analysis of intraspecifc hybridization between *Plumbago auriculata* **and** *Plumbago auriculata* **f.** *alba* **based on horticultural traits and molecular markers**

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Abstract

Plumbago auriculata Lam. is an ornamental plant native to South Africa and widely cultivated in China, but the cultivated plants are dominated by a single variety. The development of new varieties is of great commercial interest, and genetic diversity is the foundation of breeding programs. In this study, 85 progenies were obtained by crosses between *Plumbago auriculata* and *Plumbago auriculata* f. *alba*. The genetic diversity of these hybrids was evaluated using horticultural traits and ISSR and SRAP markers. Of the 25 horticultural traits evaluated, the largest variation was found in the beginning of the blooming period, and sepal length was the least variable trait. Correlation analysis showed that the wider the plant, the greater the number of inforescences and the earlier the fowering. Seven factors explained 65.171% of the total variance; the frst factor was leaf morphology, and the second factor was fower morphology. The genetic diversity of the 85 progenies was analyzed using seven pairs of SRAP primers and eight ISSR primers. The average number of efective alleles for 85 hybrids was 1.638, and the average Shannon index value was 0.507. The Nei genetic similarity coefficient indicated that the similarity between $W_L B_S$ and $W_S B_L$ was the highest, while that between $B_L W_S$ and $B_S W_L$ was the lowest. Analysis of molecular variance (AMOVA) indicated that the main variation was within populations. Cluster analysis based on horticultural traits and molecular markers divided all progenies into seven and fve groups, respectively, and there were obvious diferences between the two clusters. In this study, we created intermediate materials for future breeding, taking the frst step in the cross-breeding of *P. auriculata*.

Keywords Genetic diversity · Horticultural traits · Hybridization · ISSR · *Plumbago auriculata* · SRAP

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Introduction

The development and utilization of plant germplasm resources are at the core of the commercial ornamental plant industry, especially for plants that are naturally both robust and beautiful (De Souza et al. [2017](#page-11-0)). *Plumbago auriculata* Lam., a perennial shrub originating from South Africa, belongs to the family Plumbaginaceae (Jaradat et al. [2016](#page-11-1)). *P. auriculata* is the most popular ornamental plant of the genus Plumbago because of its blue fowers and blooming period from early summer to late autumn. *P. auriculata* f. *alba* is a form of *P. auriculata* whose fowers are white. Both of these species are heterostylous and self-incompatible (Ferrero et al. [2009](#page-11-2); Lakshmanan et al. [2016\)](#page-11-3). Plumbagin is a secondary metabolite existing in *P. auriculata* with high biological activity, so previous research focused almost exclusively on the medicinal value of this species (Van de

Vijver and Lötter [1971;](#page-11-4) Deshpande et al. [2014\)](#page-11-5). However, as an excellent ornamental plant, nearly no commercial cultivars exist in *P. auriculata*, so the breeding of new varieties of this plant should not be neglected.

Although genetic engineering is a current hot topic in ornamental plant breeding, cross-breeding is a traditional breeding method that has long been useful for the development of new varieties (Afkhami-Sarvestani et al. [2012](#page-10-0); Kishi-Kaboshi et al. [2018](#page-11-6)). Genetic diversity is the foundation of breeding programs and is essential for selecting parents and justifying the potential value of new varieties. In research, genetic diversity has generally been evaluated using phenotypic characteristics and molecular markers for efficiency. The combined analysis of morphological traits and molecular markers has been successfully applied to the study of genetic diversity in plants such as bitter gourd (Dey et al. [2006](#page-11-7)), pepper (Rivera et al. [2016](#page-11-8)) and chrysanthemum (Baliyan et al. [2014](#page-10-1)).

Morphological examination is a powerful method for the estimation of genetic diversity, and it is essential for selecting, evaluating and certifying the cultivars obtained through breeding programs (Govindaraj et al. [2015;](#page-11-9) Yazdanpour et al. [2018](#page-11-10)). Mutation and correlation analysis can reveal the internal relationships between characteristics, so we can choose those traits that have a large degree of variation and achieve early selection for some traits (Pluta et al. [2012](#page-11-11); Rakonjac et al. [2010\)](#page-11-12).

Molecular markers are considered important tools for providing data on genetic polymorphisms between diferent individuals in a population (Barbosa et al. [2018](#page-11-13)). This compensates for the fact that morphological characteristics are vulnerable to environmental infuence. Among the various types of molecular markers, analysis of inter simple sequence repeats (ISSRs) and sequence-related amplifed polymorphisms (SRAPs) does not require prior knowledge of the genome of a species (Li and Quiros [2001](#page-11-14); Reddy et al. [2002](#page-11-15); Zietkiewicz et al. [1994](#page-11-16)). In addition, these methods have simple technical requirements, and only a small amount of DNA can be analyzed, so these methods are widely used in genetic analysis (Wang et al. [2009\)](#page-11-17).

This study aimed to evaluate the diversity of progenies between *P. auriculata* and *P. auriculata* f. *alba* as well as to evaluate the potential of these hybrids in the cross-breeding of *P. auriculata*.

Materials and methods

Plant materials

Eighty-fve seeds were produced by crosses between *P. auriculata* and *P. auriculata* f. *alba* and sown in 21-cell trays on February 26, 2019 (Table [1\)](#page-1-0). The plants were transplanted into 15-cm-diameter pots when 5–6 true leaves had developed. The four genitors used in this work were seed-propagated seedlings planted in 35-cm-diameter pots in a plastic greenhouse on campus. The experiment was conducted at Sichuan Agricultural University in Chengdu, Sichuan Province, China (30°42′19″N, 103°51′28″E, 608 m elevation).

Because both of the parents are heterostylous and only compatible with diferent style types, the parents were distinguished for artifcial hybridization by style type (Fig. [1\)](#page-2-0).

Phenotypic evaluation

A total of 25 horticultural traits were evaluated in the 85 hybrids. The 25 traits are defned in Table [2](#page-3-0). The traits include fower, leaf blade and plant characteristics. The plant height and width were evaluated 3 months after seeds were sown on May 27, 2019. All the other traits were evaluated in the blooming period in July 2019 except for the time of the frst fower bloom.

Measurements of inflorescence length, inflorescence diameter, fower diameter, fower length, pedicel length, sepal length, leaf length, leaf width, stipule width, stipule

Table 1 Crossings and progenies number of *P.auriculata* and *P. auriculata* f. *alba*

a BS indicates short style type of *P. auriculata*

b WL indicates long style type of *P. auriculata* f. *alba*

c BL indicates long style type of *P. auriculata*

d WS indicates short style type of *P. auriculata* f. *alba*

e S indicates short style type plants which style beneath the anther

f L indicates long style type plants which style above the anther

length, stem thickness and internode length were taken using a Vernier caliper. Plant height and width were measured by a fexible rule. The other qualitative characteristics were measured by visualization. To reduce the error, all experiments are carried out by one person. The beginning of the blooming period was graded in the range of 1–4 based on cluster analysis. Mutation analysis and Pearson correlation coefficients were calculated to analyze the traits with large variation and the relationship between pairs of the 25 horticultural traits. Factor analysis was applied to extract information from the multivariate dataset. Standard deviation transformation was used to standardize the morphological traits, and cluster analysis of 85 hybrids based on morphological traits was performed using the intergroup connectivity Euclidean distance method. All analyses were performed using SPSS 22.0.

DNA extraction

Total genomic DNA of 85 progenies was extracted from a 0.1 g mixture of young leaves for each individual following the CTAB procedure in May 2019 (Doyle [1991](#page-11-18)). DNA quality was checked on a 1% agarose gel, and DNA

Table 2 Descriptive statistical analysis of 25 horticultural traits in the 85 hybrids

a Minimum value

^bMaximum value

c Maximum value—minimum value

d Standard deviation

eCoefficient of variation expressed in percentage

quantity was measured by a Nanodrop 2000 (Thermo Scientifc, USA) and diluted to 50 ng/μL.

ISSR analysis

We used 10 progenies to screen the 100 ISSR primers (Table S1) published by the University of British Columbia collection (developed by the Biotechnology Laboratory at the University of British Columbia, collection number 9). The screening criteria were that the amplifed bands were both clear and polymorphic in the 10 progenies.

The PCR mixture contained the following: DNA (100 ng), *Taq* DNA polymerase 1 U, dNTPs 0.15 mmol/L, primer 0.4 μ mol/L, Mg²⁺ 0.5 mmol/L, 10 × PCR buffer 2 μL, and ultrapure water for a final volume of $25 \mu L$. DNA amplifcation was conducted using a T100 thermocycler (BIO-RAD, Cambridge, MA, USA). PCR conditions included the following: 1 cycle at 94 °C for 5 min, followed by 35 cycles at 94 °C for 30 s, 55 °C for 50 s, and 72 °C for 90 s and 1 cycle at 72 °C for a fnal extension of 10 min. The amplifed fragments were then separated using electrophoresis on a 1% (w/v) agarose gel at 150 V for 30 min in a horizontal tank, and subsequent imaging in a gel scanner (Universal HoodII, BIO-RAD, USA) under ultraviolet light revealed the DNA fragments for analysis.

SRAP analysis

According to the SRAP primer design standard published by Li and Quiros (Li and Quiros [2001\)](#page-11-14), we designed 9 forward primers and 10 reverse primers (Table S1), with a total of 90 pairs of SRAP primers. Similarly, 10 progenies were used to screen the 90 pairs of primers for polymorphism.

The PCR mixture contained the following: DNA (50 ng), *Taq* DNA polymerase 1.25 U, dNTPs 0.25 mmol/L, forward primer 0.6 μmol/L, reverse primer 0.6 μmol/L Mg^{2+} 1.0 mmol/L, 10 × PCR buffer 2 µL, and ultrapure water for a fnal volume of 25 μL. DNA amplifcation was conducted using a T100 thermocycler (BIO-RAD, Cambridge, MA, USA). PCR conditions are as follows: one cycle at 94 °C for 5 min, followed by five cycles at 94 °C for 1 min, 35 °C for 1 min, and 72 °C for 1 min. This was followed by 35 cycles of 94 °C for 1 min, 50 °C for 1 min, and 72 °C for 1 min and one cycle at 72 °C for a fnal extension of 10 min. The amplifed fragments were then separated using electrophoresis on a 2% (w/v) agarose gel at 150 V for 30 min in a horizontal tank, subsequent imaging in a gel scanner (Universal HoodII, BIO-RAD, USA) under ultraviolet light revealed the DNA fragments for analysis.

Molecular marker data analysis

ISSR and SRAP bands in all of the gel profles were scored visually as present (1) or absent (0) at least twice for each individual. Only reproducible and unambiguous bands were used for scoring. Data were compiled in a binary data matrix using Excel 2016. The genetic diversity, Nei genetic similarity coefficient, genetic distance and AMOVA of four populations were computed using GenALEx 6.502 (Peakall and Smouse [2010](#page-11-19)). According to the obtained molecular marker data, cluster analysis for the hybrids was performed. The SimQual program in the NTSYS 2.10e software was used to calculate the Nei-Li similarity coefficient between the offspring, then the UPGMA (Unweighted Pair Group Method Analysis) method in the SHAN program was used for cluster analysis, and fnally, the tree plot was used to generate the clustering diagram.

Results

Phenotypic variation

Descriptive statistical analysis of 25 horticultural traits for the 85 hybrids included the minimum, maximum, mean, range, standard deviation and coefficient of variation for the traits recorded (Table [2\)](#page-3-0). The specifc morphological data of 85 hybrids are shown in Table S2. The results showed that the coefficient of variation of these traits ranged from 5.95% to 61.22%. The variation range of the beginning of the blooming period was the largest, with the earliest and the latest fowering occurring 44 d apart. The sepal length showed the lowest variation coefficient at just 5.95%. The inforescence number, pedicel length, petal apex shape, style type, leaf apex shape, stipule shape, branch number, and degree of divergence of plants also had high variation coefficients of more than 30%. Most of these traits are related to ornamental value.

The correlation coefficient between pairs of 25 horticultural traits showed that the inforescence number was positively correlated with plant width but negatively correlated with the beginning of the blooming period $(p < 0.01)$ (Table S3). The beginning of the blooming period was extremely significantly negatively correlated with style type, plant width and internode length. Flower length and flower diameter were positively correlated with inflorescence length, inforescence diameter, and sepal length, but flower diameter was negatively correlated with flower number per inforescence. The leaf traits evaluated included leaf length, leaf width, stipule length, and stipule width, which are positively correlated with each other and correlated with the thickness of the stem and the length of the internode. The degree of divergence of the plant, which infuenced the whole plant type, was negatively correlated with plant height and branch number.

In factor analysis, seven factors explained 65.171% of the total variance among the 85 hybrids, and each factor explained more than 5% of the total variance (Table [3](#page-5-0)). Factor 1 represented leaf traits such as stipule length (*r*=0.926), stipule width $(r=0.916)$, internode length $(r=0.799)$ and leaf length $(r=0.546)$, which accounted for 15.049% of the total variance. Factors 2 and 3 represented the fowers, such as inforescence length, inforescence diameter, fower length and fower diameter, which accounted for 12.908% and 10.279% of the total variance, respectively. Factor 4 represented the whole plant type, such as the degree of divergence of the plant and the number of branches, which explained 8.158% of the total variance. Factors 5, 6 and 7 represented the qualitative characteristics of fowers and leaves, which accounted for 6.848%, 6.397% and 5.531% of the total variance, respectively.

Cluster analysis based on morphological traits divides all ofspring into seven main groups at a Euclidean distance of 20 (Fig. [2](#page-6-0)). Group I was the largest group, and most of the hybrids fowered in the frst blooming period, i.e., bloomed between May 6 and June 4. The hybrids in group II also fowered in the frst blooming period, but the inforescence length and inforescence diameter were generally smaller than those of the hybrids in group I. All the plants that fowered in the fourth blooming period (i.e., bloomed between July 6 and July 11) were concentrated in group III. Consistent with group I and group II, the hybrids in group IV also fowered in the frst blooming period, but the plants were higher than those plants in group I and group II, with obvious growth. Group V had only one individual (No. 85), and all the horticultural traits of this plant were smaller than those of the other ofspring. Similar to group V, group VI also had only one individual (No. 4), but the diference was that the foral and leaf organs of this plant were signifcantly

Table 3 Eigenvalues and proportion of the total variance in 85 hybrids, as explained by the frst seven factors for the 25 horticultural traits

Traits	Factors						
	1	\overline{c}	3	4	5	6	7
Stipule length	$0.926^{\rm a}$	0.004	-0.011	-0.038	0.006	0.063	-0.088
Stipule width	0.916	0.010	0.013	-0.037	-0.061	0.014	-0.130
Length of internode	0.799	-0.069	0.375	-0.030	0.076	0.021	0.126
Leaf length	0.546	0.286	-0.261	0.297	0.228	0.335	0.017
Inflorescence diameter	0.038	0.810	0.199	0.021	-0.097	-0.074	0.038
Flower diameter	0.147	0.781	0.054	-0.027	-0.375	-0.087	-0.068
Flower length	0.129	0.741	-0.119	0.037	0.086	0.383	-0.153
Inflorescence length	-0.195	0.702	0.043	0.014	0.266	0.032	0.133
Sepal length	-0.026	0.638	-0.065	-0.387	-0.131	-0.269	-0.107
Inflorescence numbers	-0.067	0.128	0.826	0.022	-0.112	-0.050	0.078
Plant breadth	0.118	0.060	0.801	0.028	0.005	0.056	0.009
The beginning of blooming period	-0.170	0.021	-0.564	0.012	-0.086	-0.417	0.266
Degree of divergence of plant	0.029	0.192	-0.038	-0.688	0.082	-0.028	0.012
Number of branches	-0.160	0.129	0.097	0.652	-0.290	-0.129	0.141
Leaf width	0.406	0.264	-0.305	0.605	0.278	0.071	-0.213
Leaf index	-0.023	-0.051	0.142	-0.565	-0.159	0.304	0.344
Plant height	0.103	-0.278	0.287	0.533	0.294	0.310	0.125
Flower numbers of inflorescence	-0.011	-0.047	-0.074	-0.011	0.839	-0.001	-0.090
Petal edge cleft	-0.281	0.185	-0.328	-0.073	-0.463	0.117	0.057
The style type	0.038	0.135	-0.296	-0.216	0.452	-0.009	0.439
Shape of stipule	-0.026	-0.083	0.168	-0.112	0.022	0.841	0.006
Shape of petal apex	0.204	0.102	-0.252	0.072	-0.276	0.439	-0.017
Shape of leaf apex	0.366	0.154	-0.015	0.012	0.194	-0.195	-0.634
Thickness of stem	0.035	-0.075	-0.134	0.085	-0.081	-0.067	0.623
Pedicel length	-0.012	0.117	0.271	-0.092	0.143	-0.072	0.533
Eigenvalue of correlation matrix	3.762	3.227	2.570	2.039	1.712	1.599	1.383
Explained proportion of total variance(%)	15.049	12.908	10.279	8.158	6.848	6.397	5.531
Cumulative proportion of total variance(%)	15.049	27.957	38.237	46.394	53.242	59.639	65.171

^aBold values indicate correlation coefficients greater than 0.5 in absolute value

Fig. 2 Cluster diagram of 85 progenies based on morphological traits (The abscissa is Euclidean distance, and the ordinate is number of hybrids)

larger than those of other offspring, especially in inflorescence diameter, fower length, leaf length, leaf width and stipules. Group VII had two individuals (No. 7 and No. 8), and the leaves of these two plants were wider than those of the other offspring.

Polymorphism analysis of primers

According to the primers' ability to yield clear, polymorphic, and reproducible patterns of amplifcation, eight ISSR primers and seven pairs of SRAP primers were selected for subsequent genetic diversity analysis (Table [4\)](#page-7-0). The number of efective alleles generated by the SRAP primers ranged from 1.323 (ME5-EM3) to 1.741 (ME9-EM10), with an average of 1.615 (Table [4\)](#page-7-0). The number of efective alleles of the ISSR primers ranged from 1.400 (UBC828) to 1.779 (UBC808), with an average of 1.629. The Shannon information index ranged from 0.266 (ME5-EM3) to 0.598 (ME3- EM9), with an average of 0.487 for SRAP primers. This index was higher for the ISSR primers than for the SRAP primers, with an average of 0.503. The uHe values were greater than the He values, but their variance trends were the same.

Genetic diversity analysis

A summary of the mean genetic variation statistics of all four populations as well as the mean of all loci are presented in Table [5.](#page-7-1) Under the assumption that the population is in Hardy–Weinberg equilibrium, the efective number of alleles ranged from 1.530 to 1.711 with a mean value of 1.638. For the Shannon information index, the lowest value was 0.431, and the largest value was 0.565. The population $W_L B_S$ had the highest genetic diversity, with 91.80% polymorphic loci. The mean values for the number of alleles, number of efective alleles, Shannon information index, expected heterozygosity and the percentage of polymorphic loci of the 85 hybrids were 1.787, 1.638, 0.507, 0.352, and 82.38%, respectively.

The pairwise population matrix of Nei genetic distance and Nei genetic identity further elucidated the gene diferentiation between populations (Table [6\)](#page-7-2), which showed that the populations $W_S B_L$ and $W_L B_S$ had the highest Nei genetic identity (0.963), and the lowest values were found for $B_S W_L$ and B_LW_S (0.932).

The results obtained by AMOVA illustrated that most of the genetic variations existed within populations (Table [7](#page-8-0)). It was observed that 93% of the total variation corresponded to intra-population variation, and 7% occurred between populations.

Based on molecular marker data, 85 hybrids were divided into five groups at a similarity coefficient of approximately 0.66 (Fig. [3](#page-9-0)). Combined with the horticultural traits, we

Table 4 Polymorphism analysis of SRAP primers (prefx ME and EM) and ISSR primers (prefx UBC)

a Number of alleles

^bNumber of effective alleles

c Shannon information index

d Expected heterozygosity

e Unbiased heterozygosity

a Percentage of polymorphic loci

Table 6 The pairwise population matrix of Nei genetic distance (lower left) and Nei genetic identity (upper right)

Population	$B_{S}W_{I}$	B_1W_S	$W_I B_S$	$W_{S}B_{I}$
$B_S W_L$	****	0.932	0.935	0.943
B_1W_S	0.070	****	0.942	0.938
W _T B _S	0.068	0.060	****	0.963
$W_{S}B_{L}$	0.058	0.064	0.037	****

Table 5 Genetic diversity of four hybridization populations

> found that clustering based on molecular markers was not signifcantly associated with the phenotype. Group I contained the vast majority of hybrids. Group II had three offspring from $B_S W_L$ combinations (No. 13, 18 and 20) as well as one offspring from W_LB_S (No. 54) and W_SB_L (No. 66). Group III consisted mainly of offspring of $B_S W_L$ and W_LB_S (No. 17, 41, 42 and 44). Group IV consisted mainly of ofspring, with *P. auriculata* f. *alba* as the female parent

Table 7 Analysis of molecular variance (AMOVA) between and within four hybridization populations based on ISSR and SRAP markers

Source of variation	df ^a	SS^b	MS ^c	Est. Var^d Total	variance $(\%)$
Between populations		3 67.800 22.600		0.660	
Within populations		81 730.436	9.018	9.018	93
Total	84	798.235		9.677	100

a Degrees of freedom

b Sum of squares

c Mean squares

d Estimated variance

(No. 45 and 55). Similar to group IV, the plants in group V almost came from the ofspring with *P. auriculata* f. *alba* as the female parent, and only one came from B_rW_s (No. 25). No. 25 was also the only individual of B_1W_s not divided into group I.

Discussion

Phenotypic variation

Morphological traits are used in the protection of intellectual property associated with new varieties based on the regulations of the international Union for the Protection of New Varieties of Plants (UPOV) (Hong et al. [2015\)](#page-11-20). These traits are widely used to estimate phenotypic variation and select parental lines for crossings because of the convenience of this method (Lee and Park [2017](#page-11-21)). The method employs simple tools, such as fexible rules and Vernier calipers, to obtain a large amount of data in a short time. In this study, we estimated 25 horticultural traits in 85 hybrids. Generally, if the traits showed coefficient variance values of more than 30%, we can consider the given character to have potential in breeding (Luo and Dai [2010\)](#page-11-22). The beginning of the blooming period had the highest coefficient variance (61.22%) ; however, the data were collected from the frst year and might be afected by the plant growth rate, so the selection potential of these traits should be judged after another one or two years of observation. In addition, among the nine traits whose coefficient variance was more than 30%, the number of inforescences, number of branches and degree of divergence of plants directly infuenced the ornamental value of plants, so we can strengthen the selection of these traits in the breeding program. A surprising fnding was that although we found that the fower diameter showed high variance over the course of measurement, the fnal results indicated that this trait was stable, with a coefficient variance of only 8.41%.

Correlation analysis can reveal the potential relationships between characters, so we can make early selection for objective traits through these relationships (Hui et al. 2016; Litrico and Violle [2015\)](#page-11-23). In this study, we found that those traits related to fowers had signifcant correlations, such as fower diameter, fower length, inforescence length, inforescence width and sepal length. In addition, we also found some useful information for breeding programs. The plant width is signifcantly positively correlated with inforescence numbers and negatively correlated with the beginning of the blooming period, which means that the larger the plant width, the more inforescences and the earlier the blooming period. Therefore, we can measure the plant width to predict the plants that are early fowering and will have higher inforescence numbers. In addition, leaf length and leaf width were signifcantly positively correlated with flower length, and a longer flower usually means larger inflorescences through their correlations. Therefore, we aim to breed large-fowered varieties and can achieve this target by examining leaves in the vegetative growth period to shorten the breeding time. Another interesting fnding was that plant height was signifcantly negatively correlated with fower width, possibly because vegetative growth competes with reproductive growth for nutrition.

Factor analysis is a method of data reduction to decrease original multitrait variation to a limited number of uncorrelated new variables (Yanai and Ichikawa [2006](#page-11-24)). In factor analysis, seven factors explained approximately 65% of the total variance. Factor 1 and factor 2 explained 27.957% of the total variance; factor 1 mainly represented leaf blade traits, and factor 2 represented fower traits. This means that the leaves and fowers have an important efect on the variation of morphological traits.

Genetic diversity analysis revealed by ISSR and SRAP markers

In recent decades, molecular markers based on PCR techniques have been demonstrated to be efective in studying the relationship or diversity between diferent species (Ibarra-Torres et al. [2015\)](#page-11-25). Seven pairs of SRAP primers and 8 ISSR primers were used in the present study. All of them showed high polymorphism, which indicated that those primers had high identifcation abilities. In other species, such as *Salvia* (Peng et al. [2014\)](#page-11-26) and apricot (Li et al. [2014](#page-11-27)), it was also found that ISSR and SRAP markers were efficient. The most efficient primer was UBC808, with Na, Ne, I, He and uHe values of 2.0, 1.779, 0.618, 0.429, and 0.441, respectively. In this study, we found that the number of alleles (1.772), number of efective alleles (1.629), Shannon index (0.503), expected heterozygosity (0.349), and unbiased heterozygosity (0.352) generated by ISSR primers were higher than those generated with SRAP primers (Na=1.743,

Fig. 3 Cluster diagram of 85 progenies based on molecular markers (The abscissa is similarity coefficient, and the ordinate is number of hybrids)

Ne = 1.615, I = 0.487, He = 0.338, uHe = 0.347). The same results were also found in research on *Salvia miltiorrhiza* (Song et al. [2010\)](#page-11-28). The possible reason for these fndings might be that the ISSR markers revealed the diversity of the whole genome, while the SRAP markers only amplifed the target region of the open reading frame (ORF). However, the disparity between the two markers was small, and we think that both are efective.

The Shannon diversity index is an important genetic parameter that can estimate phenotypic or genotypic diversity within a population. This parameter ranged from 0.431 to 0.565 for the four populations, indicating high variability within the populations. Obviously, genetic recombination was found in the four populations after crossing. The results of the Nei genetic identity pairwise population matrix showed that populations $W_L B_S$ and $W_S B_L$ had the highest genetic similarity, but when *P. auriculata* was the female parent, the ofspring had the lowest Nei genetic identity. This might be because the long and short styles of *P. auriculata* undergo genetic diferentiation over the course of evolution. In addition, populations $W_L B_S$ and $W_S B_L$ had a higher percentage of polymorphic loci than did B_1W_S and B_SW_I . Thus, genetically speaking, with *P. auriculata* f. *alba* as the female parent, we can obtain more plant material with genetic differences. However, the Nei genetic identity between the four populations was higher than 0.9, which shows that the genetic relationship of the parents was very close and further proves the plant classifcation. AMOVA can divide the total variance into its components between and within populations. In the present work, it was shown that the highest proportion of variation was found within populations (93%), while the variation between populations was just 7%. Barbosa et al. ([2018\)](#page-11-13) also reported that the highest proportion of variation was found within full-sib families (73.49%) in research on *Jatropha curcas*. Therefore, we should consider the internal variance to avoid genetic narrowing, which may impact selection and recombination in future breeding programs (Bhering et al. [2015\)](#page-11-29).

Cluster analysis

Cluster analysis based on phenotypic traits divided all offspring into seven groups. Group I contained most of the hybrids, indicating that the hybrids were consistent in phenotype. Additionally, we found that the clusters were divided by foral quantitative traits and leaf quantitative traits, which also confrmed that fowers and leaves are the main factors that caused the diference in hybrids in factor analysis. Interestingly, group V and group VI both have only one hybrid. No. 4 in group VI was signifcantly larger than the other ofspring in forescence diameter, fower length and leaf size. Therefore, we could use No. 4 as a potential material with large fower breeding value.

Cluster analysis based on molecular markers divides all ofspring into 5 groups. This clustering is quite diferent from phenotypic traits, probably because the markers we selected are universal markers and cannot cover the genes that control horticultural traits. However, from the results of the clustering, we also found that when *P. auriculata* f. *alba* was the female parent, the offspring were distributed in each group, confrming the results of the Shannon index, that is, when *P. auriculata* f. *alba* was the female parent, the genetic diversity of ofspring was higher. As a result, the development of specific molecular markers, such as EST-SSR, should be carried out in a later breeding program, which also shows that it is very efective and necessary to combine morphological traits with molecular markers to analyze the genetic diversity of hybrids.

In conclusion, 85 progenies with high genetic diversity were obtained by intraspecifc crossing. The relationship between the traits can guide us to select plants that have a large amount of inforescence through the examination of plant width. The genetic diversity analyzed by ISSR and SRAP markers showed that population $W_L B_S$ presented the greatest genetic divergence, and we will continue to observe this population and judge its value in the follow-up breeding program. These results are valuable for the innovation of *P. auriculata* germplasm used in cross-breeding.

Author contribution statement XC and SP-G conceived the manuscript and its components. All authors researched the literature. TL, WJ-L, YR-L, XF-Y, LJ-Y and JN-L conceived and designed the Figures. PS, YQ-L and LS-S wrote the manuscript. All authors read and approved the fnal document

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