## RESEARCH

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# Genetic relationship analysis and core collection construction of *Eucalyptus grandis* from Dongmen improved variety base: the largest eucalypt germplasm resource in China

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## Abstract

**Background** *Eucalyptus grandis*, which was first comprehensively and systematically introduced to China in the 1980s, is one of the most important fast-growing tree species in the forestry industry. However, to date, no core collection has been selected from the germplasm resources of *E. grandis* based on growth and genetic relationship analysis.

**Results** In the present study, 545 individuals of *E. grandis* collected from 28 populations across 5 countries were selected for genetic diversity analysis using 16 selected SSR markers. The polymorphism information content (*PIC*) was employed to assess genetic diversity, yielding a mean value of 0.707. Genetic structure analysis was conducted on 492 individuals from 13 combined populations, revealing three clusters as the most suitable number. Principal coordinate analysis (PCoA) demonstrated that the populations were divided into three major clusters. Additionally, the analysis of molecular variance (AMOVA) indicated that the majority of variation occurred within populations.

**Conclusions** Based on the criteria for screening the core collection, we constructed a population consisting of 158 individuals and created unique fingerprinting codes. These results provide a crucial theoretical foundation for the protection and utilization of germplasm resources of *E. grandis* in China, which will be helpful in the selection of genetically distant parents for future multigenerational hybridization programs.

Keywords Eucalyptus grandis, Genetic diversity, Population structure, SSR markers, Molecular fingerprint, Guangxi

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## Background

Multigeneration breeding, practiced to take advantage of heterosis, has always been the main strategy for the genetic improvement of forest trees [1]. This process generally begins with massive-selection in natural or unimproved populations, followed by iterations in the mating-testing-selection cycle, and elite individuals are produced [2-4]. This breeding cycle requires particular attention to the construction of a base, breeding, selection and production population [4-6]. Therefore, it is



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important to understand the genetic relationships of these populations, as their genetic characteristics influence the effectiveness and potential of genetic improvement and determine the collection and utilization of germplasm resources [7-9].

Eucalyptus, as a typical evergreen broad-leaved timber species, should also follow the above theory [10, 11]. As a large group of tree species native to Australia, Papua New Guinea and the Philippines [12, 13], *Eucalyptus* has been introduced around the world over the past century and has become one of the most important artificial commercial forest species providing a large amount of wood for industrial production and sufficient raw material for pulp and paper production [14]. At present from a global perspective, most countries, including China [10, 15, 16], Brazil [17–19], South Africa [20, 21], Australia [22, 23], etc., mainly use *E. grandis*×*E. urophylla* or its backcross hybrids for afforestation to take advantage of heterosis. It should be noted that E. grandis is a widely used hybrid parent, and the effective evaluation, protection and utilization of the germplasm resources of E. grandis are the premise and foundation for further inter- and intraspecific hybrid breeding based on the multigeneration breeding strategy for these tree species [10, 15, 24-27].

The existing Eucalyptus germplasm resources in China were all derived from early introduction experiments. Among these different tree species, E. grandis, as one of the most preferred hybrid parent species, was systematically and comprehensively introduced in the 1980s as a part of the Dongmen State Forest Farm Eucalypt Afforestation Project (1981–1989) under the Australia-China Program of Technical Cooperation [24, 28]. Subsequently, more than fifty provenances and four hundred families of *E. grandis* have been tested in Guangxi, Sichuan, Zhejiang and other provinces [25, 29-36]. These populations were used to evaluate suitable provenances and planting areas in China [25, 30, 35, 37], and the preliminarily elite individuals which bloomed earlier were used for random mating to obtain hybrid varieties suitable for local cultivation in the early stage [38-40]. Unfortunately, for uncontrollable reasons, much important information and germplasm resources of E. grandis have been lost in the past few years. With the exception of some sporadic distributions of E. grandis populations in Sichuan, Guangdong and Zhejiang provinces, the Dongmen improved variety base in Guangxi is the place with the most preserved germplasms in China. At present, there are 28 populations and 265 families of E. grandis with a preservation rate of approximately 7% in Dongmen, which will be used as a base population for genetic improvement under the guidance of a multigeneration breeding strategy. However, after many rounds of natural or unnatural selection, we do not know the corresponding population structure or genetic diversity, which limits further research on the genetic improvement and germplasm utilization of *E. grandis* in southern China [4, 41].

In recent years, the development of molecular markers and detection technologies, including RFLP (restriction fragment length polymorphism), RAPD (random amplified polymorphic DNA), AFLP (amplified fragment length polymorphism), SSR (simple sequence repeat or microsatellite sequence), and SNP (single nucleotide polymorphism) methods, has greatly promoted research on genetic diversity and genetic differentiation [42-46]. In particular, SSR markers have become increasingly popular in genetic relationship analysis due to their codominant inheritance, high polymorphism and transferability [47–50]. In previous studies, SSR markers were used to investigate the genetic relationships and origins of elite tea plant individuals (Camellia sinensis) [51], to analyze the population structure and genetic differentiation of the Populus tomentosa breeding population [52], and to provide genetic information for the conservation and breeding of black locust (Robinia pseudoacacia) [9]. In Eucalyptus, some genetic studies have also been carried out using SSR or other molecular markers, and many suitable markers have been developed for subsequent studies on population genetics [12, 13, 53-56]. On the basis of the above studies, it is appropriate and necessary to carry out genetic analysis of the existing E. grandis germplasm resources of China over time.

Core collection is a part of the entire germplasm resource selected using different methods to represent the genetic diversity of the entire germplasm resource to the greatest extent with the minimum number of resources and genetic duplication. This approach can promote the efficient evaluation, research and utilization of germplasm resources [57]. The core collection is a dynamic preservation process that is continuously updated to replenish rare and useful individuals and represents the initial population to the greatest extent ensuring that the core collection has a high level of genetic diversity [58]. Problems, such as incomplete data and technical defects, are common in early core collection research and seriously affect the core collection construction and the accuracy of evaluation [59]. Many tree species do not have a core collection: this way results in a lack of important genotypes of the tree species, and the tree species will not receive targeted protection. Therefore, by constructing a core collection, it is easier to understand the environmental adaptability and genetic characteristics of different germplasms. The core collection can represent the genetic information and genetic diversity of the entire germplasm resource.

To improve the protection and utilization of existing germplasm resources, we evaluated the genetic diversity of all preserved *E. grandis* individuals and populations in the Dongmen improved variety base, which is the most important eucalypt germplasm resource in China. Population structure and genetic diversity were analyzed using 16 SSR markers to establish the core collection and their molecular fingerprints. These results are very useful for constructing breeding populations and carrying out inter- and intraspecific hybridization based on multigeneration breeding strategies in the future.

#### Results

#### Phenotypic diversity of all Eucalyptus grandis populations

The mean value and coefficient of variation (CV) of the 28 populations for average tree height (HT) and average Diameter at Breast Height (DBH) were shown in Table S1. Compared with that in HT, the coefficient of variation of DBH exceeded 10% in most of the populations except for CHA, CDA and DCM. In addition, the coefficients of variation of HT and DBH were lowest in the CDA population with values of 4.50% and 1.91%, respectively. In contrast, the coefficients of variation of HT and DBH were highest for MM and PAD populations, with values of 18.64% and 32.33%, respectively.

# Selection and analysis of SSR markers for all Eucalyptus grandis populations

Twelve genotypes were selected from 545 individuals of *E. grandis* for preliminary screening of markers. A total of 87 pairs of SSR markers with high amplification efficiency were selected. Furthermore, another twelve genotypes of *E. grandis* were selected for secondary screening, and 16 SSR markers with high amplification efficiency and polymorphism were ultimately obtained (Table S2).

The genetic diversity of these 16 SSR markers was analyzed (Table 1). All information on the private alleles in 545 *E. grandis* individuals based on 16 SSR markers was shown in Table S3. The inbreeding coefficient ( $F_{IS}$ ) was consistently positive, ranging from 0.037 (Locus EUC-eSSR0620) to 0.678 (Locus EUCeSSR0957), with an average of 0.334. The Wright's fixation index ( $F_{IT}$ ) ranged from 0.137 (Locus EUCeSSR0620) to 0.728 (Locus EUCeSSR0019), with a mean of 0.412. The fixation index ( $F_{ST}$ ) ranged from 0.090 (Locus EUCeSSR0615) to 0.175 (Locus EUCeSSR1125), with an average of 0.122. All polymorphism information content (*PIC*) values of the markers were greater than 0.55, averaging 0.707. Among the  $F_{IS}$ ,  $F_{IT}$ , and *PIC* values, those of Locus EUCeSSR0620 were the lowest of all the loci.

## Genetic diversity analysis among 13 *Eucalyptus grandis* populations

It is worth noting that some of the 28 populations were not suitable for further genetic diversity and genetic

Locus	GN	RA	F <sub>IS</sub>	Fπ	F <sub>ST</sub>	F <sub>null</sub>	PIC
EUCeSSR0701	34	181–235	0.654	0.714	0.174	0.292	0.739
EUCeSSR0696	23	187-211	0.131	0.222	0.105	0.069	0.629
EUCeSSR0689	36	89–135	0.499	0.575	0.153	0.210	0.662
EUCeSSR0845	33	168–196	0.557	0.608	0.116	0.213	0.593
EUCeSSR0056	31	214-262	0.168	0.274	0.127	0.107	0.784
EUCeSSR0037	38	166-208	0.328	0.392	0.096	0.181	0.645
EUCeSSR0270	20	147-187	0.141	0.221	0.094	0.071	0.654
EUCeSSR0019	34	170–196	0.673	0.728	0.169	0.285	0.736
EUCeSSR0957	69	220-268	0.678	0.718	0.123	0.318	0.884
EUCeSSR0615	74	178-226	0.288	0.352	0.090	0.162	0.874
EUCeSSR0045	37	159–181	0.316	0.379	0.092	0.142	0.695
EUCeSSR0822	38	165-240	0.394	0.477	0.137	0.181	0.730
EUCeSSR0592	48	223-259	0.288	0.365	0.108	0.120	0.695
EUCeSSR1125	59	187-207	0.089	0.249	0.175	0.052	0.706
EUCeSSR0620	23	132-153	0.037	0.137	0.104	0.052	0.584
EUCeSSR0857	24	163–189	0.100	0.182	0.092	0.066	0.708
Mean	39		0.334	0.412	0.122	0.158	0.707

 Table 1
 Information of genetic diversity of 16 SSR markers assessed in 545 individuals

GN Genotype numbers, RA Range of allele sizes, F<sub>IS</sub> Inbreeding coefficient, F<sub>IT</sub> Wright's fixation index, F<sub>ST</sub> Fixation index, F<sub>null</sub> Estimated frequency of null alleles, PIC Polymorphism information content

structure analysis because of their remote geographical distribution and small sample size. In addition, populations with relatively close geographical distributions and small genetic distance gaps could be combined, and those populations with more than 20 individuals after merging were retained and were shown in Table S4. There were 13 populations, with a total of 492 individuals, for the subsequent analysis of genetic diversity and genetic structure.

Based on the information provided by the new populations (Table S4), out of the 13 populations (Table 2), the number of individuals (NI) within each population ranged from 21 in BRI-2 to 103 in ASS. Mean observed number of alleles ( $N_A$ ) ranged from 6.188 (POR) to 8.813 (ASS), averaging 7.245. Mean effective number of alleles ( $N_E$ ) ranged from 3.448 (POR) to 4.274 (FLO), averaging 3.845. Mean observed heterozygosity ( $H_o$ ) ranged from 0.403 (POR) to 0.483 (ASS), with a mean of 0.444, and mean expected heterozygosity ( $H_e$ ) ranged from 0.657 (POR) to 0.734 (ASS), with a mean of 0.705. Shannon's information index (I) ranged from 1.360 (POR) to 1.598 (ASS), averaging 1.497. The all I values of the populations were greater than 1.35.

## Genetic structure analysis of the Eucalyptus grandis populations

Genetic structure of 545 individuals (28 populations) and 492 individuals (13 populations) of *E. grandis* was analyzed by genetic distance. Among the 545 individuals, cluster I contained the smallest number of individuals (n=40), and cluster III included the largest number (n=282), followed by cluster II (n=223) (Fig. S1). The genetic structure of 492 individuals was shown in Fig. S2.

Based on the above results, the genetic structure of 492 individuals from 13 populations was further analyzed.  $\Delta K$  method showed that the most suitable number of clusters was K=3 (Fig. 1A and B). Basic information of the population *Q*-matrix from K=2 to K=4 was shown in Table S5. Most of the values of population *Q*-matrix were not more than 0.7. The result of each run with K=3 was shown in Fig. S3. Furthermore, the results of structural analysis with multiple *K* values ranged from K=2 to K=4 (Fig. 1C).

Principal coordinate analysis (PCoA) was performed with a matrix of pairwise  $F_{\rm ST}$  values between 13 populations and 13 different *E. grandis* populations were divided into three major clusters (Fig. S4). Cluster 1 (red) was composed of two populations (WTA and FLO). Cluster 2 (green) and 3 (black) were composed of seven populations and four populations, respectively. In addition, the percentages of the first two coordinates of the principal coordinates analysis were 44.10% and 21.20%, respectively.

# Population genetic differentiation analysis and Mantel test analysis

Analysis of molecular variance (AMOVA) revealed correlations revealed correlations among populations and within populations and the value of  $F_{ST}$  was 0.042. According to the results, the variance of all the *E. grandis* individuals was within populations rather than among populations (Table 3).

The Mantel test revealed no significant correlation between geographic distance and genetic distance (r=0.013, p=0.210), which means that the genetic difference was not due to geographic distance.

Table 2 Information of mean genetic diversity parameters of 13 Eucalyptus grandis populations

Population	NI	N <sub>A</sub>	N <sub>E</sub>	Но	Не	F <sub>null</sub>	I
BRI-1	43	8.250	4.149	0.443	0.720	0.163	1.574
BRI-2	21	6.688	3.628	0.440	0.681	0.149	1.444
POR	31	6.188	3.448	0.403	0.657	0.154	1.360
SRA	30	6.688	3.766	0.466	0.712	0.152	1.484
WTA	47	8.250	3.660	0.444	0.694	0.174	1.496
CAI	51	7.438	3.839	0.419	0.713	0.153	1.505
SEM	22	6.500	3.662	0.432	0.688	0.143	1.437
TCR	30	6.500	3.701	0.471	0.704	0.152	1.450
TOW	38	7.750	3.983	0.469	0.729	0.173	1.562
FHG	22	7.063	3.738	0.421	0.696	0.148	1.480
ASS	103	8.813	4.267	0.483	0.734	0.151	1.598
FLO	24	7.063	4.274	0.406	0.730	0.189	1.580
SSB	30	7.000	3.869	0.475	0.711	0.147	1.495
Mean	38	7.245	3.845	0.444	0.705	0.158	1.497

NI Number of individuals, N<sub>A</sub> Mean observed number of alleles, N<sub>E</sub> Mean effective number of alleles, Ho Mean observed heterozygosity, He Mean expected heterozygosity, F<sub>mult</sub> Estimated frequency of null alleles, I Shannon's information index



**Fig. 1** The suitable number of clusters and genetic structure analysis of 13 *Eucalyptus grandis* populations. A Values of the mean Ln P(D). B The suitable number according to the maximum K. C Genetic structure analysis of 13 populations from K=2 to K=4. The same color indicates the same cluster. Each population is separated by black vertical line

Table 3 Basic information of analysis of molecular variance (AMOVA)

Source of variation	d.f	Sum of squares	Variance components	Percentage of variation (%)	P-value	
Among populations	27	409.26	0.25	4.24	< 0.001	
Within populations	1062	6047.16	5.69	95.76	< 0.001	
Total	1089	6456.42	5.95	100		

d.f. Degree of freedom

### Selection and evaluation of a core collection from 545 Eucalyptus grandis individuals

Both methods were effective in screening the core collection of *E. grandis*. The first method analyzed Core Hunter, Power Core and Core Finder to screen out their respective core collections of *E. grandis*. The relationships

among the core collections screened by the three screening methods were analyzed through a Venn diagram (Fig. 2). The core collection screened by Core Hunter was the most common, with 109 individuals of *E. grandis*, followed by 78 individuals screened by Core Finder and only 63 individuals from Power Core. Among them, the

difference between the most (Core Hunter) and the least (Power Core) was 46 individuals. In addition, 27 individuals of the core collections were idebtified by the three screening methods. Their genetic diversity information was analyzed through PowerMarker 3.25 software and POPGENE32 1.32 software (Table 4). By comparing the genetic diversity of the core collections screened, it was found that the values of  $F_{\rm IT}$ ,  $F_{\rm ST}$  and allelic richness  $(A_R)$ [60, 61] were significantly greater than the genetic diversity of the initial population. In addition, although the values of Ho in the three screening methods were roughly consistent with the value of Ho in the initial population, He significantly decreased, with a decrease of 0.105 (Core Hunter) to 0.214 (Power Core). Among the three screening methods, the value of I also decreased significantly, with the highest being 0.971 (Core Hunter) and the lowest being 0.751 (Power Core). However, compared with those of the Power Core and Core Finder populations, the genetic diversity of the core collection screened by



Fig. 2 Venn diagram of core collections analyzed by three screening methods (Core Hunter, Power Core and Core Finder)

Core Hunter was 80% or greater than the genetic diversity of the initial population.

In the second method, cluster analysis was performed using a neighbor-joining (NJ) tree. First, Nei's genetic distance between 545 E. grandis individuals was analyzed to construct the NJ tree using PowerMarker 3.25 software (Table S6). Based on the NJ tree, branches containing only two genotypes were selected at the end of the smallest genetic distance, and one of them was deleted according to the criterion for deletion in each round of screening. A total of six rounds of screening were performed in this study, and the sample proportion was not less than 5%. The percentage of individuals preserved ranged from 100% (545 individuals) to 5.32% (29 individuals) after six rounds of screening (Table 5). After all six rounds of screening, the values of Ho and He ranged from 0.373 (6th round) to 0.454 (2nd round) and from 0.411 (6th round) to 0.617 (1st round), respectively. The Ho values of the 1st round (0.445), 2nd round (0.454) and 3rd round (0.442) were greater than that of the initial population (0.429). However, the values of He were all lower than those of the initial population.  $A_{R}$  and I among these screenings ranged from 4.540 (1st round) to 5.180 (6th round) and 0.658 (6th round) to 1.207 (1st round), respectively. These results illustrated that the third round of screening, in which 125 individuals were preserved, was selected as the core collection of the second method.

#### Discussion

Understanding the genetic relationship of the *Eucalyptus grandis* population and determining its genetic diversity and genetic structure are highly important for protecting and utilizing the germplasm resources of *E. grandis*. Although the percentage of preservation was only approximately 7%, the germplasm resources of the *E. grandis* population in Dongmen are comprehensive and unique and represent the provenance of *E. grandis* in Southwest China. At the same time, the 545 individuals selected in this study not only revealed genetic relationships but also provided help for the analysis of multigeneration breeding and the selection of hybrid

**Table 4** Genetic diversity information of three screening methods (Core Hunter, Core Finder and Power Core) for screening core collection

Screening method	Number of individuals	Percentage of individuals	N <sub>A</sub>	N <sub>E</sub>	Но	Не	иНе	F <sub>IS</sub>	F <sub>IT</sub>	F <sub>ST</sub>	A <sub>R</sub>	I
Core Hunter	109	20.00%	3.363	2.746	0.435	0.542	0.669	0.200	0.447	0.318	5.170	0.971
Core Finder	78	14.31%	3.182	2.613	0.439	0.497	0.620	0.126	0.433	0.363	5.190	0.896
Power Core	63	11.56%	2.744	2.328	0.437	0.433	0.585	0.015	0.439	0.448	5.280	0.751
Initial population	545	100%	5.453	3.349	0.429	0.647	0.685	0.334	0.412	0.122	4.470	1.293

 $N_A$  Mean observed number of alleles,  $N_E$  Mean effective number of alleles, Ho Observed heterozygosity, He Expected heterozygosity, uHe Unbiased expected heterozygosity,  $F_{IS}$  Inbreeding coefficient,  $F_{IT}$  Wright's fixation index,  $F_{ST}$  Fixation index,  $A_R$  Allelic richness, I Shannon's information index

Table 5	Genetic diversity information of six screenings for screening core collection	using cluster analysis of neighbor-joining (NJ)
tree		

Round of screening	Number of individuals	Percentage of individuals	Но	Не	иНе	F <sub>IS</sub>	F <sub>IT</sub>	F <sub>ST</sub>	A <sub>R</sub>	I
Origin	545	100.00%	0.429	0.647	0.685	0.334	0.412	0.122	4.470	1.293
1st round	335	61.47%	0.445	0.617	0.680	0.274	0.392	0.170	4.540	1.207
2nd round	202	37.06%	0.454	0.603	0.690	0.246	0.392	0.202	4.660	1.147
3rd round	125	22.94%	0.442	0.592	0.691	0.249	0.416	0.229	4.810	1.085
4th round	77	14.13%	0.424	0.498	0.634	0.150	0.444	0.355	4.910	0.865
5th round	48	8.81%	0.411	0.488	0.646	0.164	0.465	0.373	5.080	0.812
6th round	29	5.32%	0.373	0.411	0.573	0.112	0.523	0.479	5.180	0.658
6th round	29	5.32%	0.373	0.411	0.573	0.112	0.523	0.479	5.180	0.658

Ho Observed heterozygosity, He Expected heterozygosity, uHe Unbiased expected heterozygosity, F<sub>IS</sub> Inbreeding coefficient, F<sub>IT</sub> Wright's fixation index, F<sub>ST</sub> Fixation index, A<sub>R</sub> Allelic richness, I Shannon's information index

combinations with relatively high genetic distances. The core collection is selected for more efficient utilization and to further screen elite breeding populations through phenotypic traits, such as the average tree height (HT) and the average diameter at breast height (DBH).

In the present study, we analyzed the genetic diversity and genetic structure of the *E. grandis* population. We selected twelve genotypes of E. grandis from 545 individuals, and 16 SSR markers with high amplification efficiency and high polymorphism were selected. These 16 SSR markers not only provide efficient marker information for the present study, but also for future experimental research on E. grandis. In addition, among the 16 SSR markers, some were also present in the literature. Locus EUCeSSR1125 was used to analyze the genetic diversity of Corymbia citriodora populations, and the Shannon's information index (I) and polymorphism information content (PIC) values were 2.681 and 0.911, respectively [62]. These two values were slightly greater than the values in this study (I=1.537 and PIC=0.706). The locus EUCeSSR0620 was used to analyze the genetic diversity of Eucalyptus cloeziana F. Muell. populations, and the value of I was 2.0216 [63]. Similarly, this value was also higher than that of this study (I=1.078). The genetic diversity level of the population in this study was lower than that in the previous two studies, possibly because the *E. grandis* in this study experienced long-term highintensity selection, and the remaining individuals fully adapted to the local growth environment.

*Ho* is the observed heterozygosity, and *He* is the expected heterozygosity. Both of these indices are critical for analyzing genetic diversity. Previously, SSR markers were used to analyze the genetic diversity of 159 *E. gran*-*dis* individuals from 16 provenances, and the *Ho* and *He* values were 0.743 and 0.774, respectively [64]. The reason why the values were significantly greater than those

in the present study (Ho = 0.444 and He = 0.705) might be the large geographical range, high levels of population diversity and genetic differentiation among populations [64]. The mean PIC for 16 pairs of markers was 0.707 in this study. Similar results were also obtained by two previous studies. In a commercial eucalypt forest, 80 E. grandis individuals were selected for genetic diversity analysis using 17 EST-SSR markers, and the PIC was 0.648 [65]. Furthermore, 12 pairs of SSR markers were used to analyze the genetic diversity of the E. grandis population, and the PIC value was 0.54 [66]. According to the research [67], the values of the *PIC* in the three previous studies were all within the ideal range, but the *PIC* in this study was significantly greater. The reason is that this study selected markers with high amplification efficiency and high polymorphism. Furthermore, the sample size in this study was greater, the geographical range was wider, the genetic diversity of the E. grandis population was greater, and there was a certain degree of genetic differentiation between populations. At the same time, in other eucalypt species, we also found that the influence of abundant sample numbers and large geographical range coverage on genetic diversity was significant. In a previous study, the genetic diversity of 707 E. grandis individuals, including 114 open-pollinated families from 17 provenances, was analyzed [68]. These individuals were analyzed by 12 pairs of SSR markers, and the values of Ho, He and PIC were 0.432, 0.682 and 0.645, respectively. These three values of genetic diversity were very close to those in this study (*Ho*=0.444, *He*=0.705 and *PIC*=0.707).

In this study, among the 28 populations, a few populations were removed due to containing small numbers of individuals and were not suitable for subsequent genetic structure analysis. We also combined populations with relatively close geographical provenances and small genetic distance differences. A total of 492 individuals from 13 populations were obtained. Principal coordinate analysis (PCoA) revealed three major clusters, and the clusters in the PCoA analysis were also reflected in the neighbor-joining (NJ) tree and genetic structure analysis. The genetic structure analysis provided a clear indication of the clusters and the genetic composition. The most likely number of genetic clusters was K=3.

To determine the genetic diversity among the populations and within the populations, we carried out analysis of molecular variance (AMOVA) and the results showed that the percentage of variation within the populations was much greater than that among the populations. These results revealed that there was variation within the populations, and the following analysis was also carried out within the populations. In addition, the Mantel test showed that geographic distance was not related to genetic distance.

According to the above results, it could be found that the inbreeding coefficient  $(F_{IS})$  value of each population was relatively high, which indicated that the populations had a high inbreeding. This may be related to the origin source of the population in China. As an introduced tree species in China, Eucalyptus originated from the Australia. Due to the significant role of *Eucalyptus* in the industrial production, it had been introduced in many countries in order to improve the productivity and stability of forests, scientists have divided different climate zones according to phenological conditions and determined suitable climate zone through provenance tests [69]. With the development of the Dongmen State Forest Farm Eucalypt Afforestation Project (1981–1989) under the Australia-China Program of Technical Cooperation [24, 28], China also began to introduce targeted Eucalyptus from Australia, Brazil, South Africa and other countries. The greatest likelihood of successful introduction of woody plants lay in the similarity of climatic conditions at the origin of the tree species [70]. The provenance of introduced E. grandis was determined by comparing the climate in China and the provenance area [71]. As time passed, the number of *E. grandis* would gradually decrease, due to natural conditions such as climate and soil condition and artificial screening and thinning [72]. During the above introduction process, on the one hand, when E. grandis is introduced from similar climate zones in different countries, there may be close genetic relationships and repeated introductions. On the other hand, these provenances introduced into China may have originated from the same or similar original provenances earlier, and experienced the natural and unnatural selection to adapt to the local climate [73, 74]. As a result, individuals retained after intensive selection may have close genetic relationships, or even originally originated from similar provenances or families. An important characteristic of the small and isolated bottleneck populations left over from intense selection is inbreeding [75–77]. However, the adverse effects of inbreeding on plants are minimal. Compared with the reproductive mode of animal K strategy, r strategy of plant was to eliminate effects of inbreeding by increasing the seed yield and reproductive rate [78–83].

The estimated frequency of null alleles  $(F_{null})$  was calculated and analyzed. Null alleles are a common issue in the microsatellite markers, they are not caused by DNA quality or experimental technology. Instead, they primarily arise during the amplification, the in-flanking region sequences of mutations and substitutions or short alleles preferential amplification owing to inconsistent DNA template quality and quantity [84]. The influence of null alleles is very significant, which may lead to an excess of homozygotes in the population, making the Ho, He and other values lower than the normal. The genetic differentiation and genetic distance between populations can be increased. In this study, only 5 out of 16  $F_{\text{null}}$  were below 0.10, and the average  $F_{\rm null}$  was 0.158. The relatively high  $F_{\rm IS}$  and  $F_{\rm null}$  values might indicate that these factors influenced the estimate of genetic diversity in the E. grandis, although the natural and unnatural selection could lead to close genetic relationships [85, 86].

The genetic diversity and genetic structure analysis of 492 E. grandis individuals had been calculated by PowerMarker 3.25, STRUCTURE 2.3.3 and other software, and the cluster analysis was further carried out. However, it was worth noting that when we analyzed the genetic structure, we found that the bootstrap values were not high, only close to 50% (Fig. S2). In general, the overall bootstrap values are low, which may be caused by the number of individuals or the similarity between the individuals is too strong [87]. This phenomenon will directly cause the population genetic structure is not obvious, and have a certain impact on the final clustering result [88]. However, by Structure Harvester and NJ tree analysis (we set both the burn-in period and MCMC to 300,000 in order to increase the accuracy of calculation results), 492 individuals were able to cluster well and obtained the most suitable number of clusters, which had the similar situation in Erianthus arundinaceum and Vaccinium spp [89, 90]. It indicates that this phenomenon is relatively common in the genetic research. The inbreeding of *E. grandis* in each population constantly increased and genetic admixing was high because of the long-term natural and unnatural influence, resulting in the increase of  $F_{IS}$  value and the lower Q-matrix and bootstrap values. However, due to different countries and provenances, there were differences between different populations of E. grandis in essence. But the effects of inbreeding prevented them from being visually observable in the numerical value, or the number of individuals were still insufficient. In the next few decades, it is necessary to continue comprehensive and systematic introduced in order to cluster more intuitively.

To better collect and protect the germplasm resources of E. grandis, we selected and evaluated the core collection. We compared the two methods of screening core collection with respect to genetic diversity, and ultimately, the genetic diversity values of Core Hunter met the criteria for screening the core population. All values of genetic diversity were 80% or greater of the genetic diversity values of the initial population. Therefore, the first method used the core population screened by Core Hunter as the core population of E. grandis. The first method identified 109 individuals as the core population of E. grandis. In the second method, the 3rd round of screening was selected as the core collection. In the third round of screening, 125 individuals of E. grandis were screened, the percentage of individuals was approximately 23% of the initial population, and the percentage of each genetic diversity value was approximately 80% that of the initial population. Furthermore, 76 individuals of the core collections were shared by the first method (Core Hunter) and second method (cluster analysis using an NJ tree). Excluding those 76 individuals in total, 33 individuals and 49 individuals still existed in the first and second methods, respectively. In this study, we collected all the individuals screened via the first method as the core collection of E. grandis and collected the remaining individuals via the second method as the expanded collection. Overall, 158 individuals were selected as the final core collection by the two methods (including 109 in the main core collection and 49 in the expanded collection). Genetic structure analysis of the 158 selected individuals based on a NJ tree is shown in Fig. 3. Among the 158 individuals, cluster  $\beta$  contained the largest number of individuals (n=92), and cluster  $\gamma$  included the smallest number (n = 7), followed by cluster  $\alpha$  (n = 59).

The experiment used as few markers as possible to completely separate the 158 individuals and built better fingerprinting codes [51, 91]. Therefore, identity analysis was performed on 158 individuals using CERVUS 3.0.7 software, and 158 individuals could ultimately be



Fig. 3 Genetic structure of 158 selected populations based on the neighbor-joining (NJ) tree. A total of 158 individuals were separated into three major clusters. The numbers of individuals in cluster  $\alpha$ , cluster  $\beta$  and cluster  $\gamma$  are 59 (orange), 92 (pale blue) and 7 (pink), respectively

distinguished using 9 SSR markers among the 16 SSR markers. The 9 SSR markers were the EUCeSSR0270, EUCeSSR0019, EUCeSSR0957, EUCeSSR0045, EUCeSSR0822, EUCeSSR0592, EUCeSSR1125, EUCeSSR0620 and EUCeSSR0857 loci. The unique fingerprinting codes of the 158 individuals were established based on 9 SSR markers and allele sizes (Table S7). In addition, QR codes were established among the 158 individuals (Fig. S5) and three QR codes (C03, F01, I04) were shown as examples (Fig. 4). QR codes information included the ID, species, cultivation region and fingerprinting codes. Furthermore, the distributions of the HT and DBH tended to increase during core collection and raw collection/initial collection (Fig. S6). These results revealed that the core collection was highly consistent with the raw collection, and the 158 selected core collection could fully represent the entire population.

The 158 selected core collection of *E. grandis* can be used for further research, for instance, research on the selection of superior parents of *E. grandis* as superior hybrid parents and combinations of superior hybrid parents is lacking. Many studies have shown that genetic distance is positively correlated with heterosis and superior hybrid parents can be selected based on genetic distance [10, 25–27]. In view of phenotypic determination (screening individuals with excellent HT and DBH

phenotypic traits) and analysis of genetic diversity and genetic distance, superior hybrid parents of *E. grandis* can be conducive to the further development of intraand interspecific hybrid breeding of *E. grandis*, the construction of dominant hybrid parent combinations of *E. grandis* and the provision of superior parent resources for germplasm innovation research and breeding population construction. We could better select elite individuals with fast-growing, good stem type and strong stress resistance through this method to achieve better planting effects.

#### Conclusions

Through various analysis, 158 individuals (28.99% of the initial population) were selected as the core collection of *Eucalyptus grandis*. It was composed of the individuals based on the intensive natural and unnatural selection through further genetic analysis and other screenings, which could better preserve the germplasm resources of *E. grandis* in China with a small number of individuals and relatively rich genetic diversity. Individuals excluded in the core collection would be expanded collection, fully representing the entire population. The core germplasm can be preserved in different regions through asexual reproduction and plays an important role in genetic improvement. For example, based on the genetic distance



Fig. 4 Examples of DNA Fingerprint QR codes for 158 individuals of *Eucalyptus grandis*. **A**, **B** and **C** are three examples that can be scanned to read information, which contains the ID, species, cultivation region and fingerprinting code

and other analysis in this study, high-quality hybrid combinations with high genetic distance were selected from the core collection, and genetic parameters such as general combining ability and specific combining ability were calculated through the hybridization among individuals within the population and progeny test. Based on the above analysis, the excellent hybrid parents and highquality hybrid combinations could be selected. Then, targeted breeding of excellent hybrid offspring can be carried out to obtain excellent individuals of *E. grandis*.

This study provides valuable genetic materials and has an important theoretical foundation for constructing breeding population of *E. grandis* in China, which is helpful to promote the breeding cycle in this tree species.

#### **Materials and methods**

#### Plant material and phenotypic data

In this study, we used all existing Eucalyptus grandis germplasms from the Dongmen improved variety base (Guangxi Dongmen Forest Farm, Chongzuo, China), which were preserved at the Dongmen State Forest Farm through the Eucalypt Afforestation Project (1981–1989) under the Australia-China Program of Technical Cooperation [24, 28], as the research material. During this project, a total of 11813 individuals of E. grandis from 33 populations and 522 families were introduced from Australia, the USA, Brazil and South Africa to Dongmen, China. After multiple rounds of natural and unnatural selection, only 805 individuals belonging to 28 populations and 265 families survived and were preserved. In the present study, 545 individuals were sampled and renumbered after individuals with serious insect pests, disease, obvious growth deficiency or redundancy were removed (Table S4). Due to differences in the number of individuals in different families, some families had only 1 or 2 individuals, and the growth of some individuals in such families was not ideal. Therefore, to ensure the integrity of the sample and the authenticity of the data, during the sampling process, we tried to ensure that all families with fewer than or equal to 3 individuals were chosen [92, 93]. The information of the above populations was shown in Fig. 5, which was made with Tableau Desktop software (https://www.tableau.com/zh-cn/products/desktop/download). To ensure the number of samples and facilitate the subsequent extraction of DNA, four to six tender leaves were harvested from each individual, and stored in a package containing silica gel until they were completely dry before moving on to the next operation.

In addition, 545 individuals of *E. grandis* were tested for phenotypic traits. To ensure the authenticity and validity of the phenotypic data, 545 individuals of *E. grandis* were measured for six years. The tested phenotypic traits included average tree height (HT) and average Diameter at Breast Height (DBH). The fixed time for measuring phenotypic traits was maintained annually. The phenotypic traits of each individual were measured three times.

#### **DNA** extraction

The dry leaves of each sample were torn into small pieces and stored in a 1.5 mL centrifuge tube. Then, 5 mm steel balls were added to each centrifuge tube, and the leaves were disrupted using a Mini-Bead beater-96 cell disrupter (Biospec Products, Bartlesville, OK, USA). Finally, approximately 0.5/g disrupted leaves were placed into a new 1.5 mL centrifuge tube. Genomic DNA was extracted using the DP360 Super Plant Genomic DNA Kit (TIANGEN Biotech, Beijing, China). After extraction, the quality of the genomic DNA was determined using 1% agarose gel, and quantitative analysis was performed using a NanoDrop 2000 spectrophotometer (Thermo Fisher Scientific, Wilmington, DE, USA). All the



Fig. 5 Information of twenty-eight populations analyzed. The number of accessions analyzed is shown in parentheses. All the information of Population ID is presented in Table S4

extracted DNA was quickly stored at -20 °C freezer for further analysis.

#### SSR marker screening and PCR amplification

A preliminary experiment was designed to screen 240 highly polymorphic SSR markers [94]. These 240 SSR markers were screened for Eucalyptus in previous studies. However, due to the different genotypes of Eucalyptus, it is necessary to further verify which SSR markers are suitable for the materials in this study. 12 different genotypes of E. grandis were selected from the 545 individuals to maximize the selection of SSR markers with high polymorphism and high amplification efficiency. Through screening, SSR markers with poor amplification efficiency and low polymorphism were removed, and 87 SSR markers were obtained. Then, another 12 different genotypes of *E. grandis* were selected for rescreening. According to the two screening results, 16 pairs of SSR markers with high polymorphism and high amplification efficiency were ultimately selected. These SSR markers were synthesized by TSINGKE Biological Technology Co., Ltd. (Beijing, China).

The TP-M13-SSR polymerase chain reaction (PCR) system was performed in a 20 µL reaction system including 2  $\mu$ L (30 ng/ $\mu$ L) of genomic DNA, 10  $\mu$ L 2×Accurate Taq Master Mix (TSINGKE, Beijing, China), 0.08 µL forward marker, 0.32 µL reverse marker, 0.4 µL M13 labeled marker and 7.2 µM ddH<sub>2</sub>O [95, 96]. PCR amplification was performed using a Bio-Rad T100 Thermo Cycler (Bio-Rad Laboratories Inc. Hercules, CA, USA) with the following conditions: initial denaturation for 4 min at 94 °C; 8 cycles of 30 s at 94 °C, 30 s at 60 °C, and 30 s at 72 °C; 10 cycles of 30 s at 94 °C, 30 s at 52 °C and 30 s at 72 °C; 10 cycles of 30 s at 94 °C, 30 s at 56 °C and 30 s at 72 °C; 10 cycles of 30 s at 94 °C, 30 s at 60 °C and 30 s at 72 °C; and a final extension at 72 °C for 10 min and holding at 4 °C [97]. The PCR products were subjected to capillary electrophoresis using an ABI 3730XL DNA sequencer (Applied Biosystems, CA, USA). The results were analyzed using GeneMarker 2.2.0 software (Soft-Genetics LLC., PA, USA), which can determine allele sizes and peak intensities [98].

#### Genetic diversity analysis

We sorted the range of allele sizes (RA) and calculated the genotype numbers (GN) and polymorphism information content (*PIC*) for the SSR markers using PowerMarker 3.25 software [99]. According to previous research [67], when the *PIC* value is greater than 0.5, it is very informative, when the *PIC* value is between 0.25 and 0.50, it is somewhat informative, and when it is less than 0.25, the *PIC* value is not very informative. The genotype data were converted into different formats for further statistical analysis using Convert 1.3.1 software [100]. The inbreeding coefficient ( $F_{IS}$ ), Wright's fixation index ( $F_{IT}$ ) and fixation index ( $F_{ST}$ ) for each SSR marker were estimated using GenAlEx 6.51 software [101]. Estimated frequency of null alleles ( $F_{null}$ ) was analyzed by FreeNA software [102]. The number of individuals (NI), mean observed number of alleles ( $N_A$ ), mean effective number of alleles ( $N_E$ ), mean observed heterozygosity (Ho), mean expected heterozygosity (He) and Shannon's information index (I) for the populations were calculated using POP-GENE32 1.32 software [103]. Allelic richness ( $A_R$ ) was analyzed by HP-Rare Desktop Software [104].

# Population structure and principal coordinates analysis (PCoA)

The population structure was analyzed using the Bayesian clustering algorithm in STRUCTURE 2.3.3 software [105]. In this analysis, we evaluated 1 to 15 K values, and each K value was calculated in 10 runs. Each run was performed with a burn-in period of 300,000 iterations and a Markov chain Monte Carlo (MCMC) of 300,000 replications. The online program Structure Harvester [106] was used to determine the most likely number of clusters (K) based on the  $\Delta K$  method [107]. Bar plots of the *Q*-matrix results were generated with CLUMPP 1.1.2 software [108] and Distruct 1.1 software [109]. PowerMarker 3.25 software [99] was used to analyze the genetic relationships based on Nei's distance analysis to construct a neighbor-joining (NJ) tree, which was further visualized using FIGTREE 1.3.1 software (http://tree.bio.ed.ac.uk/ software/figtree/) [110]. The different genotypes of E. grandis were grouped via principal coordinate analysis (PCoA) in the GenAlEx 6.51 software [101]. PCoA was based on the data type of the tri-distance matrix and the distance-standardized method to determine the differences among the populations and within the populations.

#### **Differentiation analysis and Mantel analysis**

Analysis of molecular variance (AMOVA) was performed using Arlequin 3.5 software [111, 112], and statistical significance was determined from 1,000 permutations. According to the genetic distance and geographic distance data, the Mantel test was used to analyze the correlations between them via the GenAlEx 6.51 software [101].

#### Core collection analysis

The core collection of *E. grandis* was constructed by different methods. In the first method, Core Hunter [113], Power Core [114] and Core Finder [115] could be used to screen the core collection of 545 individuals of *E. grandis*, analyze their genetic diversity, and compare it with the genetic diversity of the initial population.

For the most suitable core collection, each value of genetic diversity should not be less than 80% of the initial population. In the second method, one of the only two genotypes at the end of the branches in the NJ tree was deleted. The criteria for deletion were as follows: first, the proportion of the core collection was approximately 5%-30% of the initial population; second, the percentage of each value of the core collection should be approximately 80% of the initial population and the phenotype of the core collection could not vary by approximately 20% [116]. CERVUS 3.0.7 software (Field Genetics Ltd., London, UK) was used to select and construct the fingerprinting codes [117, 118]. In addition, QR codes were created using an Ostools online program (OSCHINA) (https://tool.oschina.net/qr/) to distinguish all selected individuals. Furthermore, a Venn diagram was created through a Jvenn online program (http://jvenn.toulouse.inra.fr/app/example.html) to analyze and compare the relationships between various methods of screening the core population.

#### **Supplementary Information**

The online version contains supplementary material available at https://doi. org/10.1186/s12870-024-05970-0.

Supplementary Material 1.

Supplementary Material 2.

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#### Authors' contributions

JY and XK conceived and designed the research. CL and LZ conducted the experiments. LZ, ZP, XL and ZL collected the materials. CL, LZ and TL analyzed the data. CL and JY wrote the manuscript. XK provided valuable suggestions and reviewed the manuscript. CL and LZ contributed equally to this work. All authors read and approved the final manuscript.

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#### Data availability

The datasets generated and analyzed during the current study are available in the Supplementary Materials.

#### Declarations

#### Ethics approval and consent to participate

The plant material of *Eucalyptus grandis* used in this research was collected from Guangxi Dongmen Forest Farm at Dongmen Town and its surrounding areas in Chongzuo City, China (22°20′20″N, 107°50′52″E), which was done with the permission of the local management department. *Eucalyptus grandis* has been widely cultivated over the past few decades, which is neither from the wild nor at risk of extinction. All samples collected are stored in the National Engineering Research Center of Tree Breeding and Ecological Restoration, Beijing Forestry University (Beijing, China). The experiments were performed in accordance with all relevant Chinese laws.

#### Consent for publication

Not applicable.

#### **Competing interests**

The authors declare no competing interests.

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