

cacy of the multiplex panel for individual identification and paternity testing by combining diallelic InDels with shorter amplicons and miniSTRs with higher polymorphisms in a multiplex panel. Moreover, as a result of the addition of two miniSTRs, the 64-plex panel was able to indicate the presence of a mixture sample by observing the presence of the third or more alleles in one miniSTR locus, and the minor component was explicitly detected in those samples with the mixed ratios of 1:9 and 9:1 in the former validation study [7]. Although the forensic applicability of the novel self-developed 64-plex has been preliminarily validated [7], the polymorphic data of various populations from China still need to be investigated by the panel, and to further evaluate the robustness of the panel for the efficacies of individual identification and paternity testing.

According to the 7th national population census of China (<http://www.stats.gov.cn/tjsj/pcsj/rkpc/7rp/indexch.htm>), Manchu is the sixth largest ethnic group in China, with a population of over 10.4 million; and Zhuang is the second largest ethnic group, with over 19 million people. The native languages of the Manchu and Zhuang groups are the Manchu-Tungus and Kra–Dai language, which belong to the Altaic language family [9] and the Sino-Tibetan language family [10], respectively. Despite being one of the ethnic minorities, the Manchu people exerted a great influence on Chinese history [11,12] from the Jin Dynasty (1115–1234 AD) to the Qing Dynasty (1636–1912 AD), which were founded by Jurchens and their successor Manchus respectively. Furthermore, the Chinese Manchu in the Inner Mongolia Autonomous Region (CMI) are the second largest ethnic minority in this region, as well as an important part of the local culture for leaving historical legacies such as the General's government office of Suiyuan province during the Qing Dynasty. As for the Zhuang, their predecessors, the Luoyue, had settled in the ancient Lingnan region long before the Qin Dynasty (221–224 BC) unified here [13]. Being part of this region inhabited by numerous ethnic groups which belong to the Sino-Tibetan, Kra–Dai, and Austro-Asiatic language families, Yunnan province has acted as the center of trade and cultural exchanges between the Chinese civilization and the Mainland Southeast Asian civilization for millennia [14]. Thus, the genetic background investigation of the Chinese Zhuang group in Yunnan province (CZY) is also meaningful.

However, the genetic polymorphic data of CMI and CZY groups have not yet been systematically analyzed so far. Most of the studies about these two ethnic groups are still focused on the fewer populations living in Liaoning [15–21], Heilongjiang [22], Jilin [23] and Guangxi [24–28] provinces. Attributed to the unique geographical environments and cultural conventions of Yunnan province and Inner Mongolia Autonomous Region, CMI and CZY groups may have different genetic substructures and admixture histories from the same ethnic groups in other regions.

In this study, the population polymorphic data of CMI and CZY groups were studied and applied using multiple genetic analysis methods, aiming to validate the forensic efficacy of the previous self-developed 64-plex panel labeled by six-color fluorescent dyes, and to further dissect the potential population genetic substructures of the two studied groups.

2. Materials and Methods

2.1 Sample Collections and Information of the Selected Loci

All of the 286 participants, including Manchu (n = 187) and Zhuang (n = 99) individuals from the Inner Mongolia Autonomous Region and Yunnan province, respectively, who were healthy and genealogically unrelated, had signed written informed consents before providing their bloodstain samples. This present study strictly complied with the Declaration of Helsinki (2013), as revised by the 64th World Medical Association General Assembly. The experimental procedure was consistent with the ethical guidelines of the Southern Medical University and Xi'an Jiaotong University Health Science Center, and was also reviewed by the Ethics Committee of Xi'an Jiaotong University Health Science Center (NO. 2019-1039).

As for the control of the following population genetic analysis, except for the 5 loci of 2 miniSTRs, 2 Y-InDels and the AMEL gene, the genotype data of other 59 InDel loci were obtained from the 1000 Genomes Project Phase 3 dataset [29]. The population dataset contained the allelic variations of the 2504 individuals of the 26 reference populations in five continental regions, including East Asian populations: CDX, CHB, CHS, KHV and JPT; African populations: ACB, ASW, GWD, ESN, LWK, MSL, and YRI; European populations: FIN, CEU, GBR, IBS and TSI; South Asian populations: BEB, GIH, ITU, STU and PJL; American populations: CLM, PUR, MXL and PEL. The detailed information of the 64 selected loci and full names for the abbreviations of the aforementioned populations were illustrated in **Supplementary Tables 1,2**, respectively.

2.2 DNA Extraction, PCR Amplification and Genotyping

After extracting human genomic DNA from 286 bloodstain samples using PrepFiler BTA™ Forensic DNA Extraction kit (Thermo Fisher Scientific, MA, USA), a multiplex PCR amplification was performed with the self-developed 6-dye 64-plex panel on the GeneAmp PCR System 9700 Thermal Cycler (Applied Biosystems, Foster City, CA, USA) according to the previously reported research. And then the PCR products were removed from the PCR cycler and then genotyped by capillary electrophoresis on an ABI 3500xL Genetic Analyzer (Applied Biosystems, Foster City, USA). The DNA profiles of the 64-plex panel were visualized and analyzed by GeneMapper ID-X software version 1.5 (Applied Biosystem, Foster City, USA).

2.3 Statistical Analysis

In the CMI and CZY groups, the allele frequencies and forensic parameters of the 61 autosomal loci, including match probability (MP), power of discrimination (PD), probability of exclusion (PE), polymorphic information content (PIC), typical paternity index (TPI), observed heterozygosity (Ho) and expected heterozygosity (He), were calculated by the STRAF online program version 1.0.5 (<http://cmpg.unibe.ch/shiny/STRAF/>) [30], while Hardy-Weinberg equilibrium (HWE) and linkage disequilibrium (LD) tests were operated by the Arlequin Software (version 3.5.1.2, Excoffier & Lischer, Switzerland) [31]. Violin plots of the relevant forensic parameters in the two studied groups and five reference East Asian populations were generated by the 'ggstatsplot' package (Patil, Germany) [32] of R software (version 4.0.5, R Foundation for Statistical Computing, Vienna, Austria), where Kruskal-Wallis chi-square tests and Dunn's tests adjusted by Holm's method were performed among all the pairwise populations. F_{ST} values of pairwise populations using Reynold's distance method based on the same 59 InDel loci and the analyses of molecular variance (AMOVA) at the 59 InDel loci for pairwise populations were computed by Arlequin software, while the pairwise $Nei's D_A$ distances were obtained with the allele frequency data of the 59 InDel loci by applying the DISPAN program (Nei & Tajima & Tatenno, Japan) [33], and then heatmaps for F_{ST} and D_A values were drawn using the 'pheatmap' package (Kolde, USA) in R software.

A biplot of principal component analysis (PCA) at the population level and the corresponding cos2 factor map for the 59 InDels with the above-average level of contributions to the total variance were performed by the R packages of 'ggplot2' (Wickham, New Zealand), 'FactorMineR' (Sébastien & Julie & François, France), 'factoextra' (Kassambara & Mundt, France) and 'corrplot' (Wei & Simko, China) [34,35]. The bar plot of variable contributions to the top two principal components (PC) was also generated by the 'factoextra' package, while the PCA of the individual level was performed by OriginPro 2021 software (version 9.8.0.200, OriginLab Corporation, Northampton, MA, USA). On the basis of D_A distances and allele frequencies, a neighbor-joining (NJ) phylogenetic tree was reconstructed with MEGA software (version 11.0.10, Tamura, Japan) [36], and an unweighted pair group method with an arithmetic mean (UPGMA) tree was generated via PHYLIP software (version 3.69, Kalinowski, Washington) [37]. Additionally, TreeMix software (version 1.1, Pickrell & Pritchard, USA) [38] was applied to preliminarily infer the admixture history and migration edge, while the 'OptM' R package (Fitak, USA) [39] by the Evanno method was used to estimate the optimum number of migration events. Meanwhile, multidimensional scaling (MDS) analyses of the CMI, CZY groups and other 26 reference populations were conducted using IBM SPSS Statistics (version 26.0, IBM SPSS Statistics, Chicago, USA).

To discern the genetic structures of the CMI, CZY groups and the other populations, population structure analyses were performed by STRUCTURE program (version 2.3.4, Pritchard & Stephens & Donnelly, UK) [40] which is used to predict the genetic composition of each individual based on the Bayesian model. Ternary plots based on the calculated genetic compositions were represented by the 'ggtern' package (Hamilton & Ferry, Australia) in R software [41], and the optimum K value was determined upon the results of the InPK and deltaK plots, which were drawn by the online Structure Harvester program (<http://taylor0.biology.ucla.edu/structureHarvester/>) [42].

3. Results

3.1 Analyses of HWE and LD for Loci of the Self-Developed 64-Plex Panel in CMI and CZY Groups

Apart from two Y-InDels and the AMEL gene, HWE and LD tests were performed on 59 InDels and 2 miniSTRs in the CMI and CZY groups. The p values of HWE and LD tests were available in **Supplementary Tables 3–5**. In the HWE tests, some of the loci showed p values lower than 0.05, which included four loci (rs55965654, rs35828751, rs56160634 and rs3833559 loci) in the CMI group; and five loci (rs10556197, rs3082950, rs34802628, rs3988323 and D1S1656 loci) in the CZY group. But after applying Bonferroni's correction ($p > 0.05/61 = 0.00082$), all 61 loci in CMI group demonstrated nonsignificant departures from HWE. LD analyses for pairwise loci were used to test if any significant associations were present among all pairs of the 61 loci, and no significant deviations from LDs were found in either of the studied groups after Bonferroni's correction ($p > 0.05/(61 \times 60/2) = 2.7322E-5$).

3.2 Allelic Frequency Distributions and Forensic Parameters of the 64-Plex Panel in CMI and CZY Groups

As shown in Fig. 1, the distributions of the forensic parameters for all loci with medians labeled accordingly were demonstrated in the seven East Asian populations. Since the MP values can be converted to 1-PD, the corresponding distributions of MP values were not shown in this figure. **Supplementary Fig. 1** provided an overview of the allelic frequency, Ho and He values of each InDel locus. Insertion allele frequencies of the 59 InDel loci in CMI and CZY groups ranged from 0.313 (rs3833559) to 0.711 (rs3830338), and from 0.3081 (rs144378883) to 0.6566 (rs5833522), respectively. Moreover, the detailed forensic parameters of all 61 loci were available in **Supplementary Table 3**. As demonstrated in Fig. 1A,B, the ranges of PD and PIC values were from 0.6512 (rs10594574) to 0.5528 (rs3582875), and 0.3749 (rs10536238) to 0.3264 (rs3830338) in CMI group; and from 0.6665 (rs34802628) to 0.4450 (rs10556197), and 0.3750 (rs10581929) to 0.3355 (rs144378883) in CZY group, with the corresponding medians about 0.62 and 0.37 in both groups. Comparing the two studied groups, the median values of PD and PIC in the

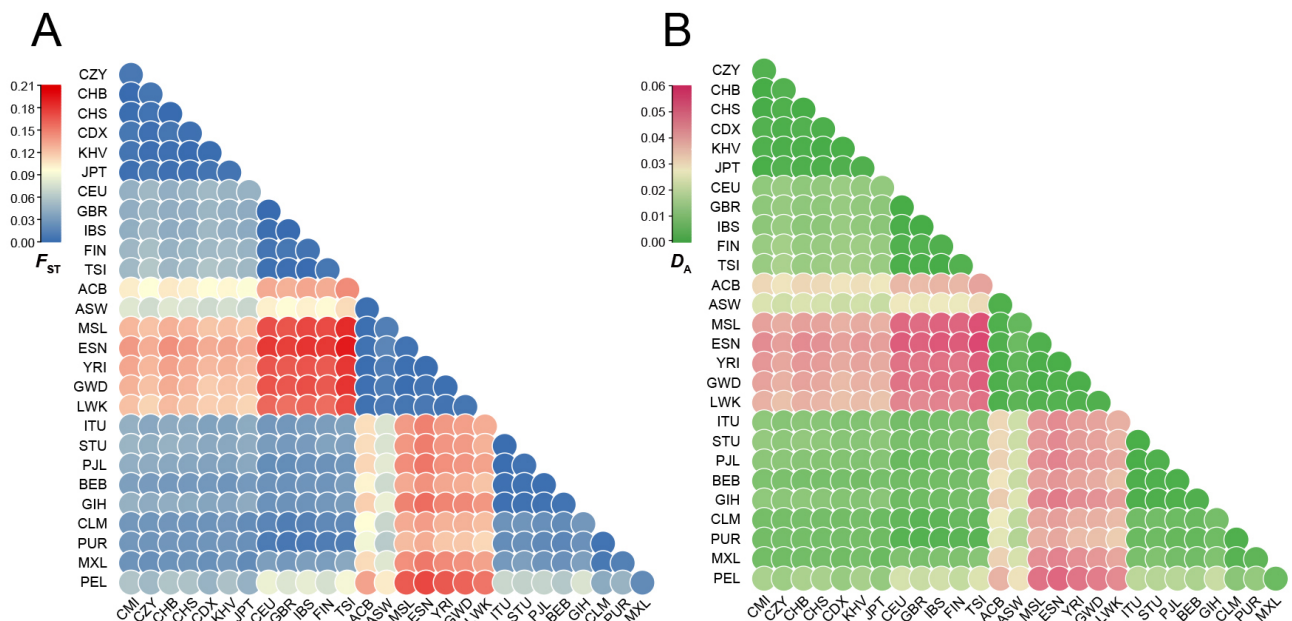


Fig. 2. Heatmaps on the basis of pairwise F_{ST} and D_A distance values the two studied groups and 26 reference populations. (A) Heatmap based on the pairwise F_{ST} values. (B) Heatmap based on the pairwise D_A distance values. CMI, Chinese Manchu in the Inner Mongolia Autonomous Region; CZY, Chinese Zhuang in Yunnan province; CDX, Chinese Dai in Xishuangbanna; JPT, Japanese in Tokyo; KHV, Kinh in Ho Chi Minh City; CHB, Chinese Beijing Han; CHS, Chinese Southern Han; ACB, African Caribbean in Barbados; ASW, African Ancestry in Southwest USA; MSL, Mende in Sierra Leone; ESN, Esan in Nigeria; YRI, Yoruba in Ibadan; GWD, Gambian in Western Division; LWK, Luhya in Webuye, Kenya; FIN, Finnish in Finland; CEU, Utah residents with Northern and Western European ancestry; GBR, British in England and Scotland; IBS, Iberian populations in Spain; TSI, Toscani in Italy; ITU, Indian Telugu in the UK; PJL, Punjabi in Lahore; STU, Sri Lankan Tamil in the UK; BEB, Bengali in Bangladesh; GIH, Gujarati Indian in Houston; CLM, Colombian in Medellin; PUR, Puerto Rican in Puerto Rico; MXL, Mexican Ancestry in Los Angeles; PEL, Peruvian in Lima.

Moreover, **Supplementary Fig. 2** was drawn to give a landscape of the insertion allele frequencies of the 59 InDels, and the corresponding frequency of each locus could be referred from the color of the grid. For example, the redder the grid was, the greater the value of the insertion allele frequency for the related locus was, and vice versa. The clustering analysis for the 59 InDel loci was also performed when generating the heatmap. The 59 InDels were firstly clustered into two main branches and then the second main branch was separated into two subbranches. In addition, the allele frequencies of the 59 InDels fluctuated around 0.5 in East Asian populations, including CHB, CHS, CDX, KHV, JPT, CMI and CZY groups.

3.3 Locus by Locus AMOVA Analyses and Population Genetic Distances between the Studied Groups and 26 Reference Populations

Locus-by-locus AMOVA analyses were performed to measure the genetic variances for the 59 InDels among pairwise populations, and the corresponding p values were shown in **Supplementary Tables 6,7**. After Bonferroni's correction ($p > 0.05/59 = 0.00085$), no significant differences were evident between the CMI group and the Chi-

nese two Han populations, while rs1611025, rs3833559, rs10535391 and rs11283102 loci were found with significant p values between the CMI group and the other East Asian populations including CDX, CZY, KHV and JPT. Statistically significant differences were observed between the CZY group and the two populations i.e. JPT and CHB at one or two loci.

The F_{ST} values and Nei 's D_A distances of pairwise populations were visualized by two corresponding heatmaps (Fig. 2A,B), and the relevant detailed information was provided in **Supplementary Tables 8,9**. The F_{ST} values and D_A distances can be used to measure the degrees of genetic differentiations among pairwise populations. The smaller the values are, the lower the degrees are of the genetic differentiations between two populations. From these figures, we could conclude that populations from the same continental region were all clustered on the hypotenuses of the two triangular heatmaps, with the pairwise F_{ST} and D_A values lower than 0.047 and 0.014, respectively, demonstrating their closer genetic relationships. It is worth mentioning that, compared with other African populations, ACB and ASW populations located in America showed closer genetic distances to populations from the

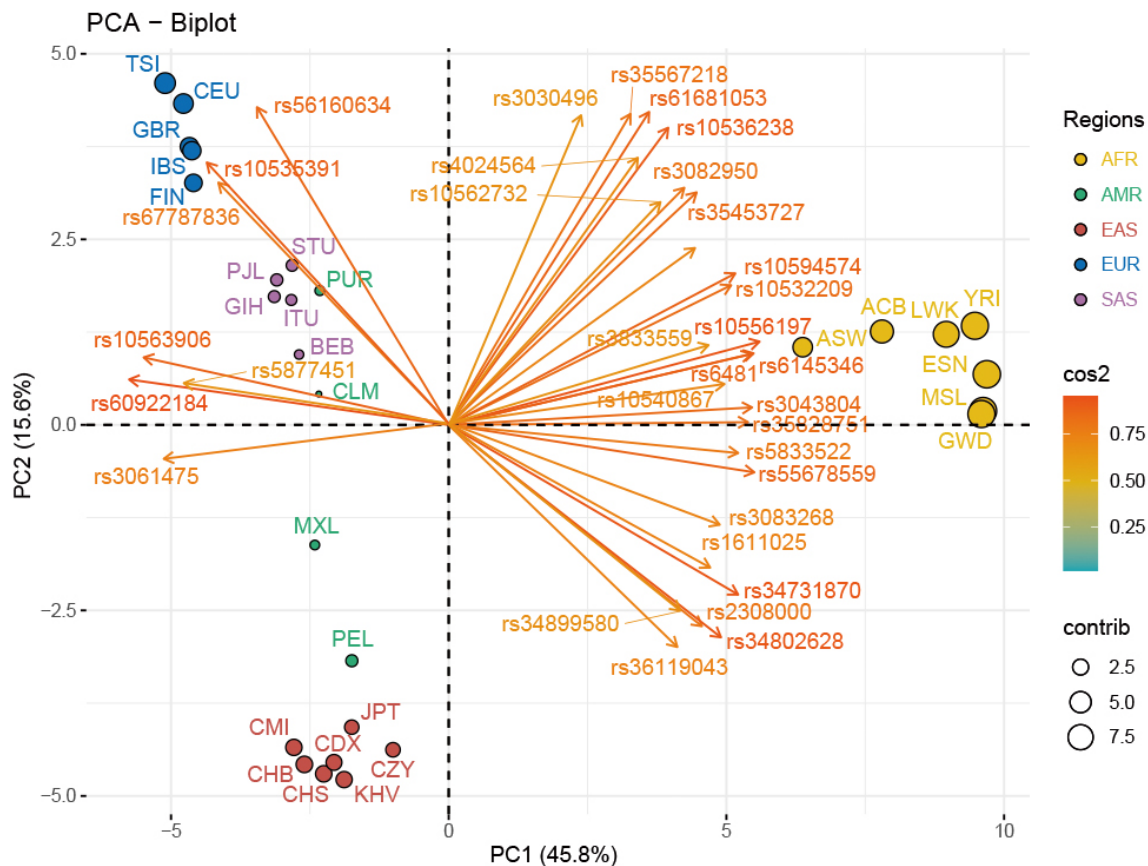


Fig. 3. PCA-biplot in population level for the CMI, CZY and 26 reference populations. The PCA result of population level for the CMI, CZY groups and the 26 reference populations was visualized by a biplot. The color and length of each arrow stood for the related \cos^2 value of its corresponding locus. CMI, Chinese Manchu in the Inner Mongolia Autonomous Region; CZY, Chinese Zhuang in Yunnan province; CDX, Chinese Dai in Xishuangbanna; JPT, Japanese in Tokyo; KHV, Kinh in Ho Chi Minh City; CHB, Chinese Beijing Han; CHS, Chinese Southern Han; ACB, African Caribbean in Barbados; ASW, African Ancestry in Southwest USA; MSL, Mende in Sierra Leone; ESN, Esan in Nigeria; YRI, Yoruba in Ibadan; GWD, Gambian in Western Division; LWK, Luhya in Webuye, Kenya; FIN, Finnish in Finland; CEU, Utah residents with Northern and Western European ancestry; GBR, British in England and Scotland; IBS, Iberian populations in Spain; TSI, Toscani in Italy; ITU, Indian Telugu in the UK; PJI, Punjabi in Lahore; STU, Sri Lankan Tamil in the UK; BEB, Bengali in Bangladesh; GIH, Gujarati Indian in Houston; CLM, Colombian in Medellin; PUR, Puerto Rican in Puerto Rico; MXL, Mexican Ancestry in Los Angeles; PEL, Peruvian in Lima; AFR, African populations; SAS, South Asian populations; EUR, European populations; EAS, East Asian populations; AMR, American populations.

other four continental regions, with the maximum F_{ST} and D_A values of only 0.14405 and 0.11098. When comparing all 26 reference populations with the CMI and CZY groups, the extreme values of F_{ST} and D_A were observed separately from CHB (0.00062 and 0.0011) to ESN (0.13849 and 0.0428); and from KHV (0.00244 and 0.0019) to ESN (0.13013 and 0.0397).

As shown in Fig. 2B, the distribution pattern of the heatmap was similar to that of Fig. 2A. The pairwise genetic distances among the 28 populations could be discerned from the heatmap based on D_A values, and the ESN remained to have the greatest genetic distances from the two studied groups. It could be concluded that the lower values of genetic distances lay between the CMI group and East Asian populations, including CHB (0.0011), CHS

(0.0014), JPT (0.0018), KHV (0.0026), CDX (0.0030), and CZY (0.0031). For the CZY group, the minimum D_A distance values were found between CZY and KHV (0.0019), followed by CDX (0.0021), CHS (0.0024), CHB (0.0030), CMI (0.0031) and JPT (0.0031).

3.4 Principal Component Analyses and Multidimensional Scaling Analyses

The PCA-biplot of population level based on the allele frequencies data of the 28 populations was employed to explore the genetic relationships among these populations. As demonstrated in Fig. 3, 61.4% of the total variance was explained by the top two principal components of PC1 (45.83%) and PC2 (15.57%). Populations from the three continental regions of Africa, Europe and East Asia

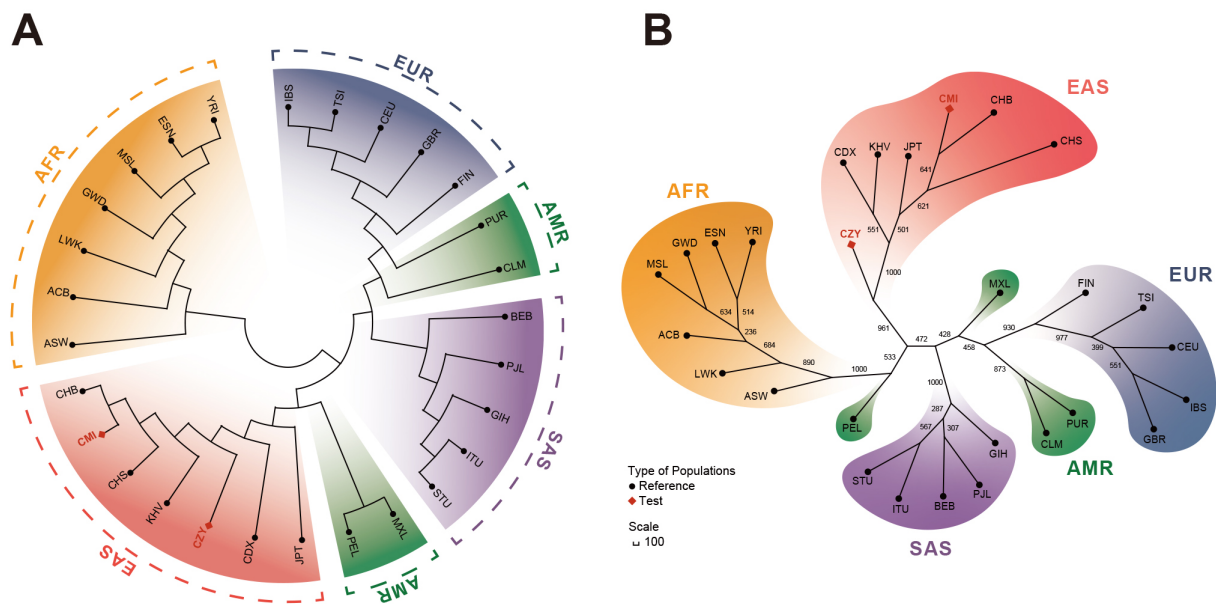


Fig. 4. Reconstructions of phylogenetic trees of the CMI, CZY groups and the 26 reference populations. (A) A rooted NJ phylogenetic tree based on pairwise D_A distances of the two studied groups and 26 reference populations. (B) An unrooted UPGMA tree based on allele frequency data of the two studied groups and 26 reference populations. CMI, Chinese Manchu in the Inner Mongolia Autonomous Region; CZY, Chinese Zhuang in Yunnan province; CDX, Chinese Dai in Xishuangbanna; JPT, Japanese in Tokyo; KHV, Kinh in Ho Chi Minh City; CHB, Chinese Beijing Han; CHS, Chinese Southern Han; ACB, African Caribbean in Barbados; ASW, African Ancestry in Southwest USA; MSL, Mende in Sierra Leone; ESN, Esan in Nigeria; YRI, Yoruba in Ibadan; GWD, Gambian in Western Division; LWK, Luhya in Webuye, Kenya; FIN, Finnish in Finland; CEU, Utah residents with Northern and Western European ancestry; GBR, British in England and Scotland; IBS, Iberian populations in Spain; TSI, Toscani in Italy; ITU, Indian Telugu in the UK; PJL, Punjabi in Lahore; STU, Sri Lankan Tamil in the UK; BEB, Bengali in Bangladesh; GIH, Gujarati Indian in Houston; CLM, Colombian in Medellin; PUR, Puerto Rican in Puerto Rico; MXL, Mexican Ancestry in Los Angeles; PEL, Peruvian in Lima; AFR, African populations; SAS, South Asian populations; EUR, European populations; EAS, East Asian populations; AMR, American populations.

were assigned to three corresponding clusters distributed in the upper left, lower left and middle right of the PCA plot, while the remaining American and South Asian populations scattered between the two clusters of East Asians and Europeans. As shown in the **Supplementary Fig. 3**, a histogram was used to compare contributions of the 59 selected loci to the first two PCs, and loci with contribution values higher than the average value (i.e., higher than that of the rs33928328 locus) were also presented in the cos2 plot of the PCA-biplot (Fig. 3), where the color and length of each arrow stood for the related cos2 value of its corresponding locus. Besides, the contribution of each population for inferring ancestral information was revealed by the size of each point. In other words, the bigger the size of the dot was, the more the corresponding ancestral information components the population has.

According to the PCA of individual level based on the raw genotype data of the Africans, East Asians and Europeans (**Supplementary Fig. 4**), a three-dimensional PCA plot was drawn to evaluate the efficiency of the panel when practicing a more fine-scale ancestral inference from the individual perspective. As a result, 11.2% of the total vari-

ance was defined by PC1 (6.5%), PC2 (2.4%) and PC3 (2.2%), while the clusters representing Africans, Europeans and East Asians (including the CMI and CZY groups) could be roughly separated. Additionally, an MDS analysis was also performed based on the pairwise F_{ST} values to further survey the genetic relationships among the 28 populations, and the results were provided in **Supplementary Fig. 5**. Regardless of the American populations, most of the populations from the four continental regions of Africa, East Asia, Europe and South Asia sharply clustered respectively, except for the BEB group.

3.5 Phylogenetic Tree Reconstructions Based on Genetic Distances and Allelic Frequency Data

A rooted NJ phylogenetic tree (Fig. 4A) and an unrooted UPGMA tree (Fig. 4B) were reconstructed on the basis of pairwise D_A distances and allelic frequency data. The NJ tree was applied to estimate the possible genetic relationships among the 28 populations. In the NJ tree, all the populations were firstly diverged into two major branches of African populations and the others, while East Asian, European, and South Asian populations later clustered into

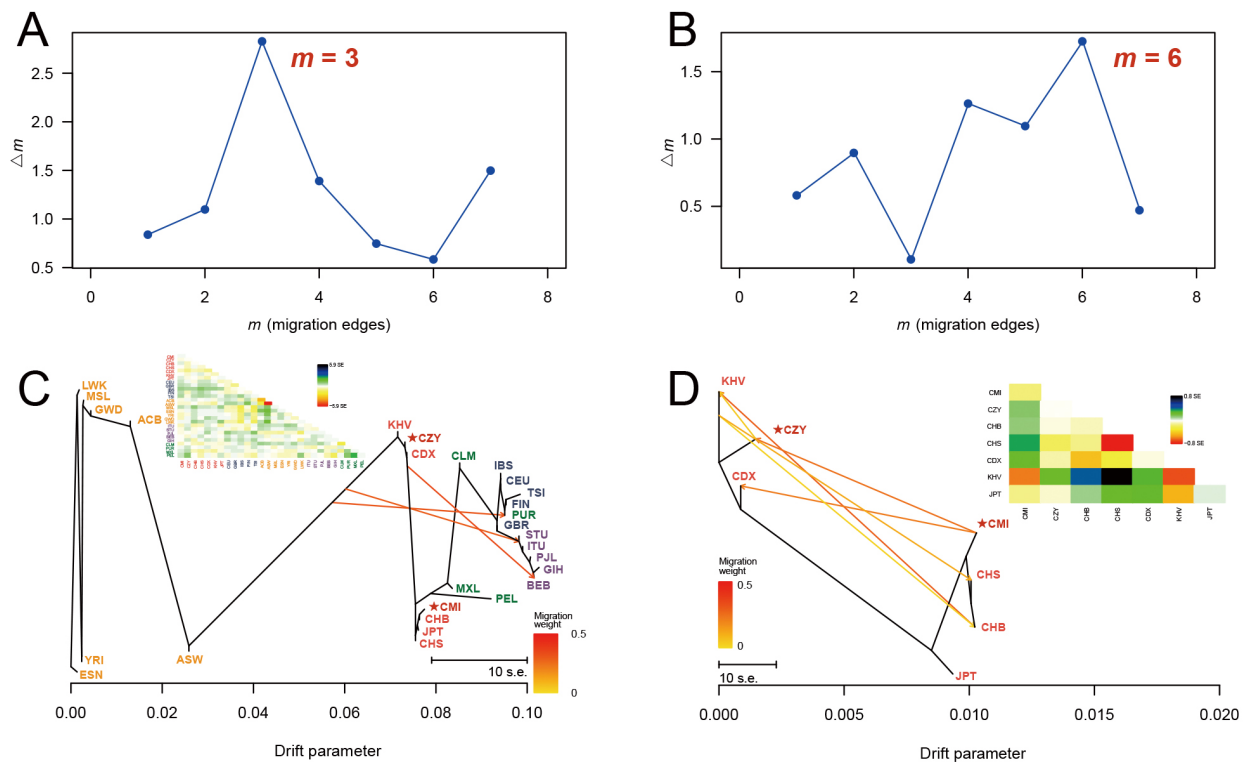


Fig. 5. DeltaM plots and the corresponding maximum likelihood trees. A series of maximum likelihood trees with different numbers of migration events ($m = 1-8$) were generated for 5 iterations by TreeMix analyses. The deltaM plots (A,B) indicated the optimum numbers of migration events for all the 28 populations ($m = 3$) and populations from East Asia ($m = 6$). The corresponding maximum likelihood trees were reconstructed when $m = 3$ (C) and $m = 6$ (D), with each arrow indicating a certain migration event and its weight. The residual covariance matrices (C,D) were applied to measure the model fit of trees (i.e., the genetic relationships between the pair of populations with values greater than zero are underestimated by the model and vice versa). CMI, Chinese Manchu in the Inner Mongolia Autonomous Region; CZY, Chinese Zhuang in Yunnan province; CDX, Chinese Dai in Xishuangbanna; JPT, Japanese in Tokyo; KHV, Kinh in Ho Chi Minh City; CHB, Chinese Beijing Han; CHS, Chinese Southern Han; ACB, African Caribbean in Barbados; ASW, African Ancestry in Southwest USA; MSL, Mende in Sierra Leone; ESN, Esan in Nigeria; YRI, Yoruba in Ibadan; GWD, Gambian in Western Division; LWK, Luhya in Webuye, Kenya; FIN, Finnish in Finland; CEU, Utah residents with Northern and Western European ancestry; GBR, British in England and Scotland; IBS, Iberian populations in Spain; TSI, Toscani in Italy; ITU, Indian Telugu in the UK; PJJ, Punjabi in Lahore; STU, Sri Lankan Tamil in the UK; BEB, Bengali in Bangladesh; GIH, Gujarati Indian in Houston; CLM, Colombian in Medellin; PUR, Puerto Rican in Puerto Rico; MXL, Mexican Ancestry in Los Angeles; PEL, Peruvian in Lima.

three subbranches, respectively. Moreover, CMI and CZY groups shared the same outermost branch points with CHB and KHV, respectively, suggesting that these populations might have more recent common ancestors than the others. The unrooted UPGMA tree was also generated to serve as a supplement to the NJ tree without constraining the topological structure of the tree. However, although the UPGMA tree shared a similar branching pattern with the former NJ tree, the CZY group was located at the first subbranch, while PEL and MXL were solely assigned to two major branches instead of being located at the same subbranch like that of the NJ tree. To further explore the population splits and gene flow events, a series of maximum likelihood trees with the numbers of migration events from 1 to 8 ($m = 1-8$) were generated for 5 iterations by TreeMix software. According to the deltaM plots shown in Fig. 5A,B,

the estimated optimal numbers of migration events for all 28 intercontinental populations, East Asian populations were 3, 6, respectively. The corresponding trees with $m = 3$ and $m = 6$ were shown in Fig. 5C,D. It could be inferred from Fig. 5C that the potential ancestors of PUR and STU might be related to the admixtures between African and Southeast Asian populations, while a gene flow event was also observed between CDX and BEB. Moreover, gene flow events were observed between KHV people as well as their possible ancestors and CZY, CHS, CHB groups (Fig. 5D). An arrow from the CMI to the CZY group was also found in the Treemix analysis, presenting a latent genetic relationship between these two groups. The heatmap of residual fit later demonstrated that these two groups might be a candidate for a gene flow event.

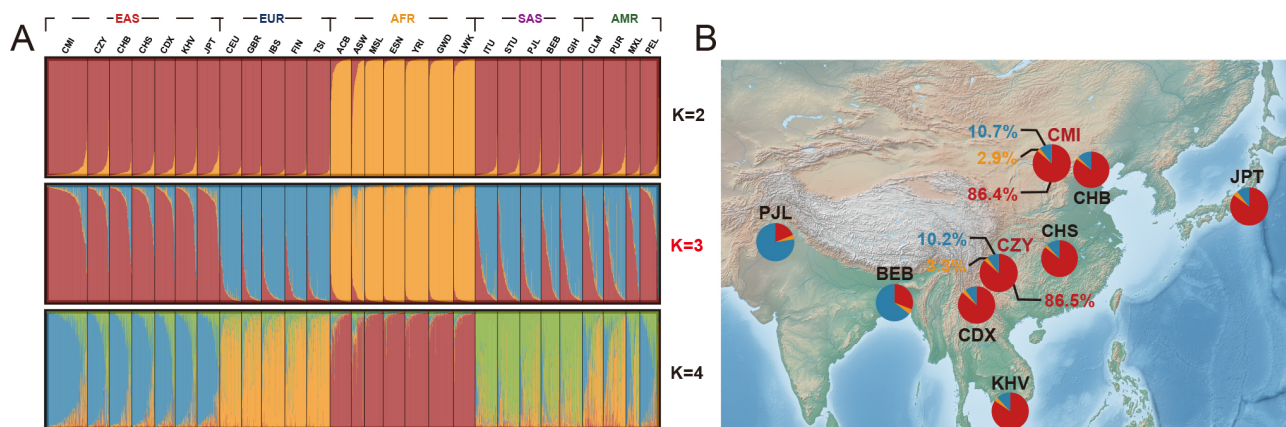


Fig. 6. STRUCTURE analyses of the two studied groups and 26 reference populations, with the corresponding pie charts of ancestral information components geographically labeled on the map when $K = 3$. (A) STRUCTURE analyses of the two studied groups and 26 reference populations based on the 59 InDel loci ($K = 2-4$). (B) Pie charts of the ancestral information components for the BEB, PJI and the populations from East Asia when $K = 3$, and each pie chart was labeled to the geographical location of the corresponding population. The open-source map is available in the QGIS Geographic Information System (<https://www.qgis.org/>). Different colors represented different ancestral information components, among which the red color represented the East Asian ancestral component, the blue color represented the European ancestral information component, and the yellow color represented the African ancestral component. CMI, Chinese Manchu in the Inner Mongolia Autonomous Region; CZY, Chinese Zhuang in Yunnan province; CDX, Chinese Dai in Xishuangbanna; JPT, Japanese in Tokyo; KHV, Kinh in Ho Chi Minh City; CHB, Chinese Beijing Han; CHS, Chinese Southern Han; ACB, African Caribbean in Barbados; ASW, African Ancestry in Southwest USA; MSL, Mende in Sierra Leone; ESN, Esan in Nigeria; YRI, Yoruba in Ibadan; GWD, Gambian in Western Division; LWK, Luhya in Webuye, Kenya; FIN, Finnish in Finland; CEU, Utah residents with Northern and Western European ancestry; GBR, British in England and Scotland; IBS, Iberian populations in Spain; TSI, Toscani in Italy; ITU, Indian Telugu in the UK; PJI, Punjabi in Lahore; STU, Sri Lankan Tamil in the UK; BEB, Bengali in Bangladesh; GIH, Gujarati Indian in Houston; CLM, Colombian in Medellin; PUR, Puerto Rican in Puerto Rico; MXL, Mexican Ancestry in Los Angeles; PEL, Peruvian in Lima; AFR, African populations; SAS, South Asian populations; EUR, European populations; EAS, East Asian populations; AMR, American populations.

3.6 Population Genetic Structure Analyses

To further dissect the population genetic structures of the 28 worldwide populations, a STRUCTURE analysis was performed based on raw genotype data, and the results at $K = 2-4$ were shown in Fig. 6A. According to the InPK and deltaK plots (Supplementary Fig. 6) generated by the online Structure Harvester program, the optimum K value was eventually confirmed ($K = 3$). Thereafter, a series of pie charts were applied to visualize the ancestral components of the populations from South Asia and East Asia when $K = 3$, and subsequently labeled to their corresponding geographical locations on the map displayed in Fig. 6B. In summary, the two studied groups demonstrated comparatively large proportions of the East Asian ancestral information component (86.4% and 86.5%). It could be inferred from the Supplementary Fig. 6 in which African populations were the first identified population ($K = 2$), and then the East Asian, European and South Asian populations were successively distinguished as the K values increased from 2 to 7 (Supplementary Fig. 7), while American populations consistently exhibited admixture patterns of genetic structures.

Based on the three clusters of African, East Asian and European populations, a series of ternary plots were made by gradually adding individuals from different continental regions to intuitively discern their ancestral information components when $K = 3$ (Fig. 7). Most of the individuals from CMI and CZY groups overlapped with East Asian populations, while few individuals distributed along the left edge of the ternary plots, indicating their relatively higher proportions of the European ancestral information component.

4. Discussion

In the present study, we assessed the genetic polymorphisms of 59 InDels and 2 miniSTRs in the CMI and CZY groups. The detected results showed that all 59 InDels and 2 miniSTRs demonstrated no deviations from HWE and no LDs in the CMI and CZY groups, and most of the 59 InDel loci showed relatively moderate levels of genetic polymorphisms, with PIC values of over 0.36. The additional miniSTRs displayed the highest polymorphisms with PIC values of over 0.65, and their additions further improved the efficiency of the multiplex panel. The CPD and CPE values of the 61 autosomal loci in the CMI and CZY groups were

primary branches. However, for the NJ tree which is constructed by taking into account the effects of evolution rate and genetic drift, the PEL was clustered with MXL on an outer branch, indicating the intimate genetic relationship between the two above-mentioned populations and the better performance of the NJ tree when inferring ancestral information. Interestingly, in the TreeMix analysis performed within East Asian populations, the estimated optimal number of migration events rose to 6, reflecting the smaller geographic scale in this study.

Although CMI and CHB groups belong to different language families, the two groups still demonstrated a close genetic relationship in multiple statistical analyses, which was highly consistent with the results of previous population genetic studies involving the Manchu group and northern Han populations from Liaoning, Henan and Beijing provinces [15,19,20]. With the development of Chinese society and economy, intermarriages between the above-mentioned groups have become more common [43], and the Manchu-Han intermarriage rate in Liaoning province reached 39.3% in the riverside area as early as 2002 [20]. Many population genetic studies about Chinese Manchu based on Y-SNPs indicated that the Y chromosome haplogroup C3* and its descendant 'Manchu cluster' C3b2a-M48 expanded approximately 1333 ± 653 or 590 ± 340 years ago due to nomadic activities of Jurchens [44–46] and the establishment of the Qing Dynasty, resulting in the wide distributions of these haplogroups in the paternal lineages of the Chinese populations. For example, many ethnic groups in China, including Mongolian, Ewenki, Oroqen, Hezhen and Xibe groups, were found to have considerable portions of individuals who shared the haplogroups C3* and C3b2a-M48 [22]. After the bureaucratization of native Tusi officers during the Qing Dynasty, the communication between Manchu and Zhuang groups was further strengthened in the Yunnan province [47], which was reflected by the observed gene flow event in the above TreeMix analysis. However, the genetic information provided by the 59 InDels was not sufficient to confirm the obtained conclusion, and more types of genetic markers and population samples are needed to analyze the genetic relationship between Manchu and Zhuang groups in the future. In spite of that, the CZY group in this study was still relatively related to KHV, followed by CDX and CHS groups. According to Wang *et al.* [28], who constructed PCA analyses using Y-SNP haplogroup frequencies, the Zhuang group had a closer relationship with the KHV group. As being an ethnic group mainly located in the southeastern part of China adjacent to Vietnam, the compositions of ancestral information components of individuals from the CZY group were basically similar to those of most East Asians, which was consistent with the previous studies on the Zhuang group in Guangxi province using autosomal STR, Y-STR and Y-SNP genetic markers [25,26,28]. However, the obtained results are still needed to be validated and refined by future

population analyses with more types of genetic markers, especially sex-related genetic markers with paternal and maternal inheritances. Such researches will surely provide us with a more fine-scale exploration of the population genetic substructures of these two studied groups from different research perspectives.

5. Conclusions

In this study, we investigated the forensic characteristics using a self-developed 6-dye 64-plex PCR system comprising 59 InDels, 2 miniSTRs, 2 Y-InDels and an Amelogenin gene, and the population structures of the Chinese Manchu in Inner Mongolia Autonomous Region and Zhuang in Yunnan province. The 64-plex panel could not only meet the demands of forensic individual identification and paternity testing in the CMI and CZY groups but have the preliminary ability to distinguish the African, European, and Asian ancestral information components from the two studied groups and 26 reference populations. In addition, we further explored the genetic backgrounds and relationships of the CMI and CZY groups using the reference population polymorphic data, and the two aforementioned groups were believed to have relatively closer genetic relationships with other reference East Asian populations, especially the CHB and KHV groups. Future population genetic studies involving more populations will provide substantial supports for the enrichment of polymorphic population genetic information resources and further validate the robustness of the self-developed 6-dye 64-plex panel in forensic and population genetic research.

Author Contributions

FL and MC both performed the experiment and wrote the original manuscript. FL also analyzed the data and plotted accordingly. BZ designed this study, offered instructions and also revised the manuscript. HX, QL and XB had provided essential helps and suggestions on the frameworks and details of the research. SN collected samples and offered some suggestions when revising the manuscript. All authors contributed to editorial changes in the manuscript revision.

Ethics Approval and Consent to Participate

All of the participants included in this research had signed written informed consents before providing samples. This study strictly abided by the Declaration of Helsinki, and the experimental procedure was consistent with the ethical guidelines of the Southern Medical University and Xi'an Jiaotong University Health Science Center. The experiment procedure was also reviewed by the Ethics Committee of Xi'an Jiaotong University Health Science Center (NO. 2019-1039).

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Conflict of Interest

The authors declare no conflict of interests.

Supplementary Material

Supplementary material associated with this article can be found, in the online version, at <https://doi.org/10.31083/j.fbl2709258>.

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