

Timber tracking of Jacaranda copaia from the Amazon Forest using DNA fingerprinting

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To cite this version:

Lorena F. M. Capo, Bernd Degen, Celine Blanc-Jolivet, Niklas Tysklind, Stephen Cavers, et al.. Timber tracking of Jacaranda copaia from the Amazon Forest using DNA fingerprinting. 2024. hal-04664901

HAL Id: hal-04664901 <https://hal.inrae.fr/hal-04664901v1>

Preprint submitted on 30 Jul 2024

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1 Article

² Timber tracking of *Jacaranda copaia* from the Ama-3 zon Forest using DNA fingerprinting

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Academic Editor: Firstname Last name
Received: date Accepted: date Published: date

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Abstract: We investigated the utility of nuclear and cytoplasmic single nucleo-29 tide polymorphism (SNP) markers for timber tracking of the intensively logged 30 and commercialized Amazonian tree Jacaranda copaia. Samples of 832 trees from 31 38 population samples in Bolivia, Brazil, French Guiana, and Peru were geno-32 typed at 113 nuclear, 11 chloroplastic and 4 mitochondrial SNP markers. Bayes-33 ian cluster analyzes were carried out to group individuals into homogeneous genetic groups for self-assignment tests of groups of individuals or of individuals to their population of origin. Cluster analysis based on all SNP markers detected seven main genetic groups. Genetic differentiation was high among 37 populations (0.484) and among genetic groups (0.415), and populations 38 showed a strong isolation-by-distance pattern, favoring the group or individ-39 ual tracking to the correct site of origin. Self-assignment test of groups of individual for all loci was able to determine the population origin of all samples with 100% accuracy. Self-assignment test of individuals was able to assigin the 42 origin of 94.5–100% of individuals (accuracy: 91.7–100%). Our results show that the use of 128 SNP makers is suitable to correctly determine the origin sampling site of *J. copaia* timber and they are a useful tool for customs and local and international police.

Keywords: illegal logging; forensics; SNP markers; timber tracking; tropical trees; Jacaranda copaia

1. Introduction

Timber logging, whether legal or illegal, contributes to biodiversity loss. Illegal logging is also an economic problem for the legal market, as extremely low-priced wood competes with legal 53 logging, where costs are higher [1,2]. International laws have been established in countries around the world to avoid the importation of illegal timber, as for example, the timber regulation of the United States (Lacey Act), European Union (The EU Timber Regulation No. 995/2010), and Australia (Illegal Logging Prohibition Act), which declare illegal to import timber and its derived products (furniture, musical instruments, etc) originated from illegal timber extraction [2]. These regulations require that importing companies declare the country and specific place of origin, names of the exact species of all plants contained in their wood products, and guarantee that these wood products have a legal origin and have been extracted in a sustainable way in accordance with the laws of the country of origin. In addition to the legislation targeting illegal timber trade, the Convention on International Trade in Endangered Species- CITES [3,4] allows international trade of species listed in Appendix II only when sourced from plantations.

The main problems in the illegal timber trade are in the documentation of the origin of the wood, having falsified certificates and documentation, and with missing or false information [5]. According to the Brazilian Federal Police, in 2021, 90% of the wood extracted from the Amazon Forest had an illegal origin [5,6]. Timber tracking methods are required to fight against illegal timber trade, but methods based only on documentation are sensitive to manipulation and forgery. Therefore, timber export companies and institutions responsible for controlling the origin of imported timber, such as customs, federal police, and Interpol need reliable tools to prove and confirm the declared origin of wood and its derivative products, when 80 traded internationally.

To be able to track the species, country, and specific site origin of imported timber, several methods exist, such as chemical analysis or mass spectrometry [7–9], stable isotopes [10], near-infrared spectroscopy [11], wood anatomy [12,13], and DNA fingerprint [14–21], all exploiting differences in the profiles among species and specific origins. These methods have been shown strong potential for species, country, and site origin determination, especially DNA fingerprinting. Some methods, such as wood anatomy, isotopic profiling, and spectrometric methods are limited in their capacity to identify the origin of timber due to variations among tissue types, individual sample age, individual and population genetic differences and/or environmental influences on timber composition [20]. Thus, genetic methods that allow correct identification of tree species and tracking of timber origin are essential for controls on the legality of timber by public authorities, industry, and trading companies.

Here, we evaluate the use of a DNA fingerprinting method to track the intensively exploited and high value wood of the Neotropical pio-**neer tree Jacaranda copaia (Aubl.) D. Don. (Bignonaceae).** The genus Jac-aranda sp. has ca. 53 species, all Neotropical, and most are found in the Cerrado around the Amazon Forest. J. copaia is the only species of Jaca-randa widely distributed in the Amazon Forest [22]. The species occurs from Central America to western South America, from Belize to Bolivia, including Brazil, French Guiana, and Peru [22]. In Brazil, the species is found in the states of Acre, Amapá, Amazonas, Maranhão, Mato Grosso, Pará, Rondônia, and Roraima, and populations usually have more than one tree individuals per hectare [22]. J. copaia is a fast-grow-ing species, with an average annual increase of 2.05 cm in diameter at breast height (DBH) and 1.98 m in height. Adult trees have straight stems, reaching 106 cm in DBH and 45 m in height [22,23]. Its wood is light and used for furniture [23,24]. The species is hermaphroditic and self-incompatible. About 40 species of bees, wasps, butterflies, and hummingbirds were detected as potential pollinators, although Eu-glossa spp. and Centris spp. bees was identified as the main pollinators **114 in the Tapajós National Forest, Brazil [25]. Reproduction occurs mainly by outcrossing (> 94%)** [26,27]. Each fruit can have up to 250 seeds and the winged seeds are dispersed by the wind [25]. Mating between re-lated trees has been reported and attributed to the fact that populations have intrapopulation spatial genetic structure, ranging from 50 to 500 m, due to the short-distance seed dispersal (up to 100 m), but also due to short pollen dispersal distance, ranging from 34–90 m [27].

Here, samples of J. copaia collected in 43 sites in Bolivia, Brazil, French Guiana, and Peru were used to characterize genetic diversity and population structure, and to test the ability of chloroplast, mito-chondrial, and nuclear single nucleotide polymorphism (SNPs) mark-**ers to determine the** *geographic origin of wood* of the species harvested from the Amazon Forest.

2. Materials and methods

2.1. Sampling

There is considerable confusion in the literature regarding the **130 naming of samples and populations, therefore, we specify here our** naming convention: "individual sample" corresponds to the biological material sampled from a single individual tree; "sampling sites" are lo-**133 cations where individuals are collected; "population samples" are the collection of individuals sampled at a sampling site; "reporting** groups" are the biological populations or genetic groups (i.e. groups of interbreeding individuals with a common ancestry) as estimated from **137 population genetic analyses (i.e. STRUCTURE) and used to assign indi-**

viduals; "country" are all population samples collected within the po-**139 111 139 120 139 1** groups, and reporting groups may range across different countries.

Cambium or leaf samples were collected from 832 individual 142 trees from 43 sampling sites (2–31 individuals) in the Amazon rainfor-est in four countries: Bolivia, Brazil, French Guiana, and Peru (Table 1, Figure 1). The minimum distance between individual trees was 50 m and the distance between sampling sites ranged from 23–2,648 km. All **146 1** collected was stored in a plastic bag labeled with silica gel. In Bolivia, population samples were collected from 5 sampling sites on farms and **forestry concessions. In Brazil, population samples were collected from** 12 sampling sites in national forests, parks, extractive reserves, and eco-logical stations, with support from the Chico Mendes Institute of Bio-diversity; In French Guiana, population samples were collected by the Institut national de recherche pour l'agriculture, l'alimentation et l'en-**154** vironnement (INRAE) together with the forest authorities (Office Na-tional des Forêts, ONF) in 4 sampling sites. Six additional individuals were collected in three sites; In Peru, population samples were collected from 19 sampling sites in national forests, parks, extractive reserves, ecological stations, farms, and forestry concession. However, due to the **159 159 159 169 1 individuals were grouped with the closest sampling sites. We also di-**vided the Brazilian samples into West (six population samples) and East (six population samples) origins and Peru into North (nine popu-lation samples) and South (eight population samples) origins. All indi-vidual samples were registered in a database at the Thünen Institute (SampleDataBase, Grosshansdorf, Germany).

169 Figure 1. Spatial distribution of sampling locations for Jacaranda copaia in South America.

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Table 1. Information on the population sample size (n) ; sampling site latitude and longitude; population sample abbreviation (Abbrev); and sample size after combining population samples with only two individuals with the closest pop-ulation sample $(n1)$.

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176 2.2. DNA extraction and SNPs analysis

isolation from leaf and cambium was carried out according to Dumolin et al. [28]. The individual samples were screened for 128 SNP and insertion-delection INDEL markers (nCpMtSNPs) according to **Sebbenn at al. [29], using the MassARRAY® iPLEXTM (Assay Design)** 185 Suite v2.0 [Agena Bioscience™, San Diego, EUA]) genotyping, including 113 were nuclear SNPs (nSNPs), 11 chloroplast SNPs (CpSNPs), and 4 mitochondrial SNPs (MtSNPs). The combined nu-**clearNuclear, chloroplast, and mitochondrial SNP markers will hereaf-**190 ter be referred to as nCpMtSNP markers.

2.3. Genetic diversity

The genetic diversity for nSNPs was determined for each popula-193 tion sample and country by the total number of alleles (K) , percent of 194 **polymorphic loci** (*P*%), observed (H_o), and expected (H_e) heterozy-195 gosity. The mean fixation index (F) was estimated to quantify the in-breeding coefficient within each population sample or country and the 197 statistical significance of the F values was determined permuting al-leles among individuals. For CpMtSNPs, the genetic diversity was de-199 termined for each site by K and percent of polymorphic loci $(P\%)$. We also estimated the percent of polymorphic loci $(P\mathcal{Y}_{128})$, observed for all nCpMtSNP markers. These analyses were carried out using the GDANT 1b software [30].

2.4. Bayesian clustering analysis

The Bayesian clustering method implemented in the software 205 STRUCTURE v.2.3.4 [31] was used for the 128 nCpMtSNP markers to check for the number of reporting groups (i.e. genetic populations). We set the length of burn-in and Markov chain Monte Carlo to 10,000 and tested K values from 2–10 for 30 times. We used the admixture model with correlated allele frequencies. The optimal number of reporting **groups** was estimated with the ΔK method [32]. For each optimal K, data from the 30 STRUCTURE runs was permuted with CLUMPP v.1.1.2 [33] to obtain the final Q values for each individual. The optimal number of reporting groups was determined with the ΔK method described by Evanno et al. [31] using the software CLUMPAK [33].

2.5. Genetic differentiation among populations, countries and crusters

The overall and pairwise genetic differentiation $(F_{\rm st})$ was esti-mated among all population sample (locals), clusters determined by STRUCTURE analysis, among countries, and population sample within country, and for all nCpMtSNP, nSNP, and CpMtSNPs markers. These analyses were carried out using the GDANT 1b software [30]. $\sum_{n=1}^{\infty}$ The pairwise F_{st} and spatial distance among population samples with sample size higher than 16 individuals and among clusters determined by STRUCTURE analysis, was used to investigate the isolation by dis-tance (IBD) gene dispersal, using the Spearman correlation coefficient

 (ρ) . We also assessed the IBD by the estimate the spatial genetic struc-**ture (SGS)** based on calculation of the coancestry coefficient (θ_{ij}) de-scribed in Loiselle et al. [34], between mean pairs of individuals within 10 distance-classes (0–198, 199–441, 442–655, 656–860, 861–1068, 1069– 1409, 1410–1838, 1839–2770, 2771–2478, and 2479–2646 km) determined 231 using the same number of pairs per classes, and using the SPAGEDI 1. software [35]. The statistical significance of the average θ_{ij} of each dis-tance class was derived by comparing the limits of the confidence interval at 95% probability for the average θ_{ij} for each distance class, 234 235 timated permuting (1000 times) genotypes between distances using the SPAGEDI software.

2.6. Genetic assignment

No wood DNA samples were used here. The purpose of our study is to determine if the population structure and genetic differentiation among J. copaia across the species range is enough to allow correct de-termination of the origin of an individual sample. Provided that DNA can be extracted from the target material, the same analytical proce-dures can be used for DNA collected from wood stored by timber com-panies, sawn wood, instruments musicals, furniture, etc. Similar proce-dures have been used in other studies for the same purpose [16-19]. The Bayesian method [36] implemented in GeneClass 2.0 [37] was used to assign population samples (group of individuals collected in a sam-**pling site) and individuals to its reporting group and country. The ge-**netic grouping determined by the STRUCTURE analysis was used to group individuals into reporting groups. Both population sample and individual sample assignment were caried out for all nCpMtSNP mark-ers, and the most likely reporting group determined by the highest score by the Bayesian criteria was used as an indicator of the power of the markers to compute the proportion of correctly assigned popula-tion sample or individuals in self-assignments tests [38]. Here, the in-dividual samples from the population samples (reference data) were self-classified to the reporting groups and countries, using the leave-259 one-out approach [39]. We also estimated the overall, ≥ 80% and ≥ 95% score rate of population samples and individual samples assigned to 261 correct origin reporting group.

262 3. Results

3.1. Genetic diversity

The rate of missing data ranged among loci from 0.1 to 47.1%, with average of 4.4% (Table S1) and among population samples ranged from 0.8 to 32.3%, average of 4.6% (Table 2). Across population samples, the 267 total number of alleles (K) for 113 nSNPs ranged from 122–226 alleles (mean of 183) and for 15 chloroplast and mitochondrial loci (CpMtSNPs) from 14–19 alleles, with a mean of 15.9 alleles (Table 2).

 \blacksquare The percent of polymorphic loci $(P\%)$ for 113 nSNPs was higher (ranged among populations from 23–88.5%) than for 15 CpMtSNPs (0– 272 272 26.7%) and 128 not a proport to the CDMESNP markers (20.3–78.1%, mean of 55.9%). The observed heterozygosity (H_o) ranged from 0.023–0.343 (mean of 0.178), the expected heterozygosity (H_e) for nSNPs ranged among populations f_{12} from 0.028–0.348 (mean of 0.204). The values of H_e for nSNPs were high (≥ 50% of the maximum value for biallelic loci, 0.5) for 21 popula-tions, where the highest values were observed for Brazil and Bolivia **populations.** The mean intrapopulation fixation index (F) ranged from -0.086–0.295 and was significantly (P< 0.05) higher than zero in six of the 38 populations, suggesting inbreeding. At country level, for nSNPs, **and P%** were highest in Brazil for nSNPs (226, 100%, respectively) and CpMtSNPs (30, 100%, respectively), and lowest in French Guiana (nSNPs= 200, 76.1%, respectively; CpMtSNPs= 18; 20%, respectively). 284 Bolivia presented the highest H_0 (0.319) and H_e (0.359) values and lowest ூௌ 285 (0.113), where French Guiana presented the lowest 286 (0.095) and H_e (0.192) values and the highest F_{IS} (0.506).

289 Table 2. Genetic diversity of *J. Copaia* at different population samples and countries for 113 nuclear 290 (nSNPs), 15 chloroplast and mitochondrial (CpMtSNPs), and 128 nuclear, chloroplast and mitochon-291 drial (nCpMtSNPs) markers. * denotes P< 0.05; *n* is the sample size; M% is the percentage of missing data; 292 P% is the percentage of polimorphic loci; P%₁₂₈ is the percentage of polimorphic loci for all 128 nCpMtSNPs; 293 *K* is the total number of alleles; H_0 and H_e are the observed and expected heterozygosity, respectively; *F* is 294 the fixation index.

| | | nSNPs | | | | | | CpMtSNPs | | nCpMtSNPs |
|-----------|------------------|----------|-----|-------|-------|-------|------------------|------------------|------------------|-----------------|
| Sample | \boldsymbol{n} | $M(\%)$ | K | $P\%$ | H_o | H_e | \boldsymbol{F} | \boldsymbol{K} | $P\%$ | $P_{0/128}^{0}$ |
| $1FG-Co$ | 32 | 6.6 | 122 | 50.4 | 0.023 | 0.028 | 0.005 | 16 | 6.7 | 45.3 |
| $2FG-Is$ | 29 | 4.9 | 190 | 69 | 0.109 | 0.197 | $0.25*$ | 17 | 13.3 | 62.5 |
| $3FG-Ro$ | 32 | 5.7 | 196 | 71.7 | 0.094 | 0.202 | $0.295*$ | 16 | 6.7 | 64.1 |
| 4FG-Ma | 28 | 3.5 | 195 | 72.6 | 0.148 | 0.254 | $0.286*$ | 16 | 13.3 | 65.7 |
| 5BW-Ma | 31 | 2.4 | 193 | 82.3 | 0.299 | 0.309 | 0.005 | 16 | 6.7 | 73.4 |
| 6BW-An | 28 | 1.5 | 195 | 70.8 | 0.291 | 0.292 | -0.022 | 15 | $\boldsymbol{0}$ | 72.7 |
| 7BW-Ja | 8 | 32.3 | 207 | 80.5 | 0.194 | 0.298 | $0.198*$ | 17 | 13.3 | 72.6 |
| $8BW-Jr$ | 15 | 4.3 | 207 | 83.2 | 0.205 | 0.287 | 0.057 | 16 | 13.3 | 75 |
| 9BW-Xa | 16 | 4.5 | 204 | 72.6 | 0.278 | 0.29 | -0.021 | 16 | 6.7 | 75 |
| 10BW-Cu | 15 | 1.8 | 147 | 83.2 | 0.261 | 0.275 | 0.016 | 15 | $\boldsymbol{0}$ | 73.5 |
| $11BE-Am$ | 20 | 1.1 | 204 | 75.2 | 0.215 | 0.231 | 0.052 | 15 | $\mathbf{0}$ | 66.4 |
| $12BE-Av$ | 11 | 7.5 | 207 | 61.9 | 0.278 | 0.29 | -0.021 | 15 | $\boldsymbol{0}$ | 64.8 |
| 13BE-Ta | 27 | 2.8 | 197 | 83.2 | 0.261 | 0.275 | 0.016 | 15 | $\boldsymbol{0}$ | 74.2 |
| 14BE-Ar | 11 | 3.1 | 183 | 69 | 0.238 | 0.276 | 0.078 | 15 | $\boldsymbol{0}$ | 68 |
| 15BE-Te | $\overline{4}$ | 1.4 | 207 | 83.2 | 0.141 | 0.257 | 0.057 | 15 | $\mathbf{0}$ | 73.5 |
| 16BE-Ca | 23 | 5.3 | 190 | 81.4 | 0.275 | 0.282 | -0.019 | 15 | $\boldsymbol{0}$ | 75 |
| 17PN-Hu | 26 | 2.4 | 149 | 30.1 | 0.053 | 0.059 | 0.017 | 17 | 13.3 | 28.1 |
| 18PN-Ur | 27 | 5.0 | 147 | 31.9 | 0.06 | 0.066 | 0.018 | 17 | 13.3 | 29.7 |
| 19PN-Ma | 28 | 4.4 | 147 | 30.1 | 0.054 | 0.066 | 0.031 | 19 | 20 | 28.9 |
| 20PN-Ya | 28 | 2.5 | 147 | 30.1 | 0.059 | 0.064 | 0.024 | 16 | 6.7 | 27.4 |
| $21PN-Pr$ | 29 | 4.7 | 142 | 30.1 | 0.065 | 0.069 | 0.016 | 19 | 26.7 | 29.7 |

296 3.2. Bayesian cluster analysis

297 The results of the STRUCTURE analysis showed that based on delta K, the best representation of the 298 data is obtained with a K of 4 or 9 different reporting groups (i.e. genetic populations) (Figure 2). 299 With 5 groups, there is less mixture of gene pools within individuals. With $K=5$, 85% of all individ-300 uals had a gene pool membership coefficient above 0.9, while for K= 4, only 76% of all individuals 301 had gene pool membership coefficients above 0.9. The STRUCTURE analysis based on CpMtSNPs 302 showed a clear distinction between French Guiana and North Brazil sampling sites (red) from North 303 Peru, South Brazil (6BW-An; 7B-Ja), East Bolivia (34Bo-Ri, 35Bo-De) (green and white), and from 304 South Peru (29P-In; 30P-Md, 31P-Ca, 32P-Am, 33P-Ta), Southwest Brazil (9BW-Xa, 10B-Co) and 305 Bolivia (36Bo-Vi, 37Bo-Ch; 38Bo-Ma) (blue) (Figure 2A). The STRUCTURE analysis based on nSNP 306 markers, revealed that there are a few population samples with mixtures of individuals from differ-307 ent gene pools (e.g. Flona do Jamari (7BW-Ja), Resex Tapajos-Arapins (14BE-Ar), and ESEC 308 Maraca (5BW-Ma) in Brazil and Piste de Paul Isnard (2FG-Is), Route de Cacao (3FG-Ro) and 309 Saut Maripa (4FG-Ma) in French Guiana in Figure 3B). We found one genetic group (K3) which 310 we only found in two Brazilian sampling sites (8BW-Jr. 11BE-Am) and another genetic group (K1) 311 distributed more in the middle of the Amazon basin (Figure 2B).

Figure 3B

Figure 3C

319 Figure 2. Population structure of *Jacaranda copaia* in South America showing the Spatial distribution of reporting 320 groups (i.e. genetic clusers) based on CpMtSNP (A, K=4), nSNP (B; K=9), and nCpMtSNP (C; K=8) markers esti-mated by STRUCTURE (K= 4 to 9).

3.3. Population differentiation

To determine differences between nuclear SNPs (nSNPs) and chloroplast and mitochondrial markers 325 (CpMtSNPs) in estimating genetic differentiation (F_{st}) among population samples, we compared the results among all 128 nCpMtSNPs, 113 nSNPs, and 15 CpMtSNPs (Table 3). The results showed that 327 the F_{st} among all population samples and countries was higher for CpMtSNPs (0.942 and 0.695, re-spectively) than for all nCpMtSNPs (0.484 and 0.295, respectively) and nSNPs (0.415 and 0.233, re-329 spectively). The F_{st} was also higher among clusters determined by STRUCTURE analysis for CpMtSNPs (0.896) than CpMtSNPs (0.401) and nSNPs (0.315). Among population samples within 331 Brazil, Peru, and Bolivia, the F_{st} was also higher for CpMtSNPs (0.974, 0.741, and 0.735, respectively) than for all nCpMtSNPs (0.3, 0.466, and 0.142, respectively) and nSNPs (0.224, 0.456, and 0.107, respectively). In contrast, among population samples within French Guiana, the F_{st} was higher for nCpMtSNPs (0.12) and nSNPs (0.117) than CpMtSNPs (0.004). The results also showed that the esti-335 mates of F_{st} for nCpMtSNPs, nSNPs, and CpMtSNPs was generally highest within Peru and Brazil, where the number of sampling sites was highest (Peru= 17, Brazil= 12), indicating that the number of sampling sites is important to detect high population differentiation within countries. The highest F_{st} for CpMtSNPs and nCpMtSNPs than for nSNPs indicated that the combination of 113 nuclear and 15 cytoplasmatic SNP markers increases the capacity to detect genetic differences among popu-lations.

Table 3. Genetic differentiation (F_{st}) among all population samples, all countries, all population samples within 342 countries for all nCpMtSNPs (128), nSNPs (113), and CpMtSNPs (15).

343 * P< 0.05; *np* is number of populations; \pm is the 95% standard error, 1.96SE; ϵ is the number the genetic groups 344 determined for nCpMtSNPs, nSNPs, and CpMtSNPs, using Bayesian cluster analyzes.

345

346 3.4. Isolation by distance

347 The Spearman correlation coefficient (ρ) between pairwise F_{st} and spatial distance between popu-348 lation samples (n > 16 individuals) based on 128 nCpMtSNP markers was significantly (P < 0.001) 349 higher than zero (ρ = 0.626), indicating an isolation by distance (IBD) genetic pattern (Figure 3 \underline{A}). The 350 Spearman correlation coefficient (ρ) between pairwise F_{st} and spatial distance between clustered lo-351 cals, as determined by STRUCTURE analysis was also significantly (P< 0.001) greater than zero for 352 nCpMtSNPs (ρ = 0.521, Figure 3B) and nSNPs (ρ = 0.552, Figures 3C), reinforcing the occurrence of an 353 isolation by distance genetic pattern. The estimate of pairwise coancestry for nSNP and nCpMtSNP 354 markers between individuals within ten distance classes was significantly higher than zero up to the 355 distance of 655 km, where for CpMtSNP markers was significant up to 1068 km, and non-significant 356 or significantly lower than zero in the other distance classes (Figure S1). 357

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368 Figure 3. Pattern of isolation by distance in Jacaranda copaia population samples (A) and genetic populations 369 determined by cluster analysis using STRUCTURE analysis (B, C, D). F_{ST} is the pairwise genetic differentiation 370 between population samples (sample size higher than 16 individuals) for all 128 nCpMtSNP markers (A) nd the 371 pairwise genetic differentiations between clustered locals as determined by STRUCTURE analysis for all 128 372 nCpMtSNP (B), 113 nSNP (C), and 15 CpMtSNP (D), markers. The Spearman correlation coefficient (ρ) was 373 significantly higher than zero (P< 0.01) between pairwise F_{st} and spatial distance among populations (A) for all 374 128 nCpMtSNP markers (0.645), as well as between F_{st} and spatial distance between clustered lo 128 nCpMtSNP markers (0.645), as well as between F_{st} and spatial distance between clustered locals as deter-375 mined by STRUCTURE analysis (B, C, and D) for nCpMtSNPs (0.521) and nSNPs (0.552), where non-significantly 376 correlation was observed for CpMtSNsP (0.142).

377

378 3.5. Genetic assignment

397 Table 4. Corrected population sample and individual self-assignment rate and scores for reporting groups and 398 countries (mean score) for all 128 nCpMtSNP markers. Rate means the percent of individuals assigned to the

399 correct source reporting group or country; Rates > 80 and > 95% are the rates of individuals assigned to the 400 correct source reporting group or country, with a score values \geq than 80 and 95%, respectively.

409 7: 9BW-Xa, 10BW-Co, 30PS-Md, 31PS-Ca, 32PS-Am, 33PS-Ta, 36Bo-Vi,38Bo-Ma.

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410 4. Discussion

411 4.1. Genetic diversity

The illegal timber trade, both species-specific and illegally sourced, has become a major problem for tropical forests. Control of the chain of custody for timber originating from the Amazonian Forest, as well as timber from other biomes and regions of the planet, is urgent to verify the species, countries, and place of origin declared in the transport and export documentation and restrict or even irradicate ille-gal logging. Our study shows the potential of DNA fingerprinting to track the country and origin of timber, as well as a method to follow **and verify the chain of custody for** *J. copaia* **timber products. Our study** shows only moderate levels of genetic diversity for nSNPs and low lev-els of genetic diversity for CpMtSNPs for J. copaia. However, the ob-423 served (H_o) and expected (H_e) heterozygosity were generally moderate to high, respectively, and are within the reported pattern identified for 425 other Neotropical trees using nSNP markers. For example, in *Carapa* sp. has been observed ranging among populations from 0.017–0.264 427 and H_e ranging from 0.02–0.251 [41], in Dipteryx sp. H_o has been 428 boserved ranging among populations from 0.03–0.39 and H_e ranging 429 from 0.03–0.29 [19], and in *Handroanthus* sp. H_0 has been observed

Finally, we recommend that the timber sector add such genetic controls as an independent audit beyond the paper-based proof of the chain of custody [1]. It is important to note that the power of the genetic reference data to detect false declarations reaches 100% if more than one sample with the same declaration is tested.

4.4. Conclusion

The genetic differentiation (F_{st}) among all population samples, **reporting groups, and countries was generally high, especially based 518** on CpMtSNP markers. Furthermore, there is a strong isolation by distance pattern among population samples, favoring the tracking of population samples or individual samples to the correct site. For self-assignment tests, we were able to obtain 100% accuracy to the country and reporting group for all samples using all 128 nCpMtSNPs and 113 523 nSNPs. Our results show that the use of all nCpMtSNP or nSNP markers are suitable to correctly determine the country and reporting group of origin for J. copaia timber, thus offering a very useful tool for customs and local and international police. The J. copaia reference data-base of our study represents a robust assignment tool available to tim-ber companies or government agencies to test and validate origin dec-larations. We recommend the use of the method described herein for other native tropical species, since it is highly effective in identifying the origin of wood, thus helping the police and other relevant agencies in the definition of illegally deforested areas, as well as unsustainable extraction.

Supplementary Materials: The following supporting information can be downloaded at: www.mdpi.com/xxx/s1, Figure S1. Spatial genetic structure (SGS) of Jacaranda copaia for all sample individuals in all populations for all 128 **113 nCpMtSNP, 113 nSNP, and 15 CpMtSNP** markers. Unfilled circles indicated mean θij values significant different than zero (P< 0.05) of the hypothesis of absence of SGS (H0: θij= 0); vertical bars show the standard error at 95% of **by probability; Table S1**. Populatoin sample size (n), missing data (%), genetic di- states of the versity, and differentiation among population samples (F_{st}) for each and mean **nCpMtSNP** markers: k= number of alleles; H_o = observed heterozygosity; H_e =
543 **notation** expected heterozygosity: Table S2 Population genetic diversity and population expected heterozygosity; Table S2. Population genetic diversity and population structure (F_{st}) for Neotropical tree species based on SNP markers.

Author Contributions: Conceptualization, Lorena F.M. Capo and Alexandre M. Sebbenn, Bernd Degen, Celine Blanc Jolivet, and Stephen Cavers; Method-ology, Alexandre M. Sebbenn, Celine Blanc-Jolivet; Data validation, Malte Mader, Valerie Troispoux, and Celine Blanc-Jolivet; Formal Analysis, Alexan-dre M. Sebbenn and Celine Blanc-Jolivet; Investigation, Alexandre M. Sebbenn and Celine Blanc-Jolivet; Resources, Bernd Degen; Writing – Original Draft Preparation, Lorena F.M. Capo and Alexandre M. Sebbenn; Writing – Review & Editing, Lorena F.M. Capo, Alexandre M. Sebbenn and Niklas Tysklind; Su-pervision, Bernd Degen; Project Administration, Bernd Degen, Celine Blanc-554 Jolivet; Sampling, Barbara R.V. Meyer-Sand, Kathelyn Paredes-Villanueva, Eurídice N. Honorio-Conorado, Carmen R. García-Dávila, Niklas Tysklind and Valérie Troispoux.

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