# Evidence for widespread selection in shaping the genomic landscape during speciation of *Populus*

Jing Wang<sup>1\*</sup>, Nathaniel R. Street<sup>2</sup>, Eung-Jun Park<sup>3</sup>, Jianquan Liu<sup>1</sup>, Pär K. Ingvarsson<sup>4</sup>

<sup>1</sup> Key Laboratory for Bio-resources and Eco-environment, College of Life Science,

Sichuan University, Chengdu, China

<sup>2</sup> Umeå Plant Science Centre, Department of Plant Physiology, Umeå University,

90187 Umeå, Sweden

3 Department of Bioresources, National Institute of Forest Science, Suwon 16631, Republic of Korea

<sup>4</sup> Department of Plant Biology, Uppsala BioCenter, Swedish University of Agricultural Sciences, PO Box 7080, 75007, Uppsala, Sweden

\*Correspondence: wangjing2019@scu.edu.cn

Running title: Genomic impact of selection in Populus

### 1 Abstract

2

3 Increasing our understanding of how various evolutionary processes drive the genomic 4 landscape of variation is fundamental to a better understanding of the genomic 5 consequences of speciation. However, the genome-wide patterns of within- and 6 between- species variation have not been fully investigated in most forest tree species 7 despite their global ecological and economic importance. Here, we use whole-genome 8 resequencing data from four *Populus* species spanning the speciation continuum to 9 reconstruct their demographic histories, investigate patterns of diversity and divergence, 10infer their genealogical relationships and estimate the extent of ancient introgression 11 across the genome. Our results show substantial variation in these patterns along the 12genomes although this variation is not randomly distributed but is strongly predicted by 13the local recombination rates and the density of functional elements. This implies that 14 the interaction between recurrent selection and intrinsic genomic features has 15dramatically sculpted the genomic landscape over long periods of time. In addition, our 16 findings provide evidence that, apart from background selection, recent positive 17selection and long-term balancing selection are also crucial components in shaping 18 patterns of genome-wide variation during the speciation process.

19

20 Keywords: Linked selection, Recombination, Incomplete lineage sorting, Phylogenetic

21 relationship, Ancient introgression, Populus

### 22 Introduction

23

24 Determining the evolutionary forces affecting patterns of genome-wide variation has 25been a central goal in evolutionary biology over the past several decades (Seehausen et 26 al., 2014). Furthermore, studying variation in levels of differentiation within and 27 between closely related species has the potential to yield important insights into the 28 process of speciation (Ravinet et al., 2017; Wolf & Ellegren, 2017). Studies in a broad 29 range of taxonomic groups have revealed a picture of a highly heterogeneous genomic 30 landscape with peaks and valleys of diversity and differentiation (Han et al., 2017; 31 Nadeau et al., 2012; Stankowski et al., 2019; Turner, Hahn, & Nuzhdin, 2005). Local 32 peaks of elevated divergence are usually referred to as 'speciation islands' and are 33 thought to represent regions that drive the reproductive isolation between incipient 34 species (Abbott et al., 2013; Wu, 2001). Between these islands, gene flow acts to 35 homogenize the reminder of genome and hence acts to limit differentiation (Feder, 36 Egan, & Nosil, 2012; Nosil, Funk, & Ortiz - Barrientos, 2009). However, a plethora of 37 recent studies highlight that the heterogeneous patterns of differentiation can evolve 38 through processes that are unrelated to speciation per se (Burri et al., 2015; Cruickshank 39 & Hahn, 2014). For example, even in the absence of gene flow, natural selection, in the 40 form of either a selective sweep or background selection, can cause reduced genetic 41 diversity not only at the target sites under selection but also at linked neutral sites (Han 42 et al., 2017; Phung, Huber, & Lohmueller, 2016). Such selection could accelerate 43 lineage sorting and will hence inevitably result in increased genetic differentiation 44 between species in these regions (Burri, 2017). Furthermore, the long-term action of 45 linked selection in ancestral as opposed to extant lineages can also affect the amount 46 and distribution of ancestral polymorphisms (Ma et al., 2018; Munch, Nam, Schierup,

3

47 & Mailund, 2016; Scally et al., 2012), which can further result in heterogeneous 48 patterns of genealogical relationships among closely related species (Mailund, Munch, 49 & Schierup, 2014; Pease & Hahn, 2013). Despite widespread interest in speciation 50 genomics, there remains little consensus as to how various evolutionary processes have 51 shaped the genomic landscape during the speciation process that eventually gives rise to 52 new species (Ravinet et al., 2017).

53 Empirical studies suggest that the formation of the genomic landscape of 54 diversity during speciation is highly influenced by the demographic histories of the 55 species, the types of selection acting on different genomic regions and also several other 56 intrinsic genomic features (Burri, 2017; Ellegren & Galtier, 2016). Disentangling the 57 effects of speciation (i.e. species split time, strict isolation or divergence with gene flow) 58 is important for interpreting the patterns of genome-wide variation, because without a 59 clear picture of the demographic history of the descendant species, it is challenging to 60 distinguish whether heterogenous genomic differentiation arose due to genetic drift, 61 local adaptation or introgression (Nadachowska-Brzyska et al., 2013; Ravinet et al., 62 2018). Furthermore, as the speciation process advances, the evolution of genome-wide 63 patterns of variation can be influenced by different forms of selection (Cutter & Payseur, 64 2013). Under a background selection model, purifying selection continuously eliminates 65 deleterious mutations, resulting in reduced levels of genetic diversity at linked loci and 66 increased levels of  $F_{ST}$  (a relative measure of genetic divergence) (Charlesworth, 2012; 67 Charlesworth, Morgan, & Charlesworth, 1993; Hudson & Kaplan, 1995). Under a 68 selective sweep model, genetic variants linked to beneficial mutations acted upon by 69 positive selection hitchhike along and reach high frequency (Kaplan, Hudson, & 70Langley, 1989; Smith & Haigh, 1974). Accordingly, even in the absence of gene flow, 71 selection due to, for instance local ecological adaptation, can result in reduced diversity

72 and increased  $F_{ST}$  (Cruickshank & Hahn, 2014). In comparison to purifying and positive 73 selection, long-term balancing selection favors the maintenance of advantageous 74 polymorphisms for many generations, which instead result in genomic regions with 75 elevated genetic diversity and reduced  $F_{ST}$  (Charlesworth, 2006; Guerrero & Hahn, 76 2017). As deleterious mutations are assumed to be much more common compared to 77 beneficial mutations, background selection has been argued to play a major role in the 78 evolution of diversity (Burri, 2017; Lohmueller et al., 2011; Phung et al., 2016). 79 However, many recent simulation studies have shown that background selection alone 80 is far from sufficient for generating the heterogenous genomic landscapes observed in 81 empirical studies of recently diverged species, and other evolutionary processes (such as 82 positive selection) are thus required to explain the observed patterns (Matthey - Doret 83 & Whitlock 2019; Stankowski et al., 2019).

84 Regardless of the role of demographic processes and selection, genomic 85 features, such as recombination rate variation and the heterogeneous density of 86 functional sites, are also expected to play key roles in mediating the efficacy and extent 87 of selection and gene flow, as well as how these processes interact as the speciation 88 process proceeds (Flaxman, Wacholder, Feder, & Nosil, 2014; Hurst, Pál, & Lercher, 89 2004; Nachman & Payseur, 2012). Local rates of recombination interacts with natural 90 selection and are known to have a profound effect on patterns of genomic diversity, 91 incomplete lineage sorting (ILS) and rates of introgression (Begun & Aquadro, 1992; 92 Comeron, Williford, & Kliman, 2008; Cutter & Payseur, 2013). Independent of the 93 recombination rate, the density of functional sites can also influence genome-wide 94 patterns of diversity since functional regions are more likely to experience either 95 stronger effects of positive or purifying selection compared to nonfunctional regions 96 where mutations are assumed to have little effect on fitness (Al-Shahrour et al., 2010;

97 Nordborg et al., 2005). The long-term diversity-reducing effects of selection in 98 functional regions will reduce locally effective population size  $(N_e)$ , accelerate lineage 99 sorting and increase genetic divergence between species (Flowers et al., 2011; Hobolth, 100 Dutheil, Hawks, Schierup, & Mailund, 2011). As it becomes increasingly feasible to 101 generate whole genome resequencing data from closely related species, the importance 102 of conserved genomic features in shaping the topography of the genomic landscape of 103 speciation has increasingly been highlighted by several studies in a diverse set of taxa 104 showing highly correlated patterns of differentiation among independently species pairs 105 (Burri, 2017; Delmore et al., 2018; Van Doren et al., 2017; Vijay et al., 2017).

106 Forest trees provide an excellent system to address the genomic architecture of 107 adaptation and speciation in natural populations because they are mostly undomesticated without much anthropogenic influence, ecologically important across a 108 109wide variety of habitats and harbour abundant genetic and phenotypic variation (Neale 110 & Ingvarsson, 2008; Neale & Kremer, 2011). In this study, we focus on four *Populus* 111 species (Populus tremula, P. davidiana, P. tremuloides and P. trichocarpa) that span 112 the speciation continuum. All four species are all deciduous, obligated outcrossing tree 113 species that have wide geographical distributions throughout the Northern Hemisphere 114 (Figure 1A). Among them, *P. tremula* (European aspen), *P. davidiana* (Chinese aspen) 115 and P. tremuloides (American aspen) are sibling aspen species belonging to the same 116 section of the genus Populus (section Populus) (Eckenwalder, 1996; Hamzeh & 117 Dayanandan, 2004). Earlier phylogenetic studies have revealed that P. tremuloides 118 diverged from the other two species following the break-up of the Bering Land bridge, 119 whereas the uplift of the Qinghai-Tibetan Plateau and the associated climate oscillations 120may have driven the divergence between *P. tremula* and *P. davidiana* (Du et al., 2015). 121In addition, these aspen species can readily hybridize and their artificial hybrids show

122 heterosis for many growth and wood characteristics (Hart, De Araujo, Thomas, & 123 Mansfield, 2013), suggesting that the speciation process has not gone to completion 124 among the three aspen species. In comparison, P. trichocarpa belongs to a different 125 section of the genus *Populus* (section *Tacamahaca*), and it is reproductively isolated 126from all aspen species (Jansson & Douglas, 2007). Facilitated by the availability of a 127 high-quality reference genome of P. trichocapra (Tuskan et al., 2006), the four Populus 128 species represent a promising model system to investigate how various evolutionary 129 forces have shaped the evolution of the genomic landscape of differentiation across the 130speciation continuum in forest trees.

131 We use whole-genome re-sequencing in the four Populus species to (i) 132determine their speciation history and characterize whether there is historical gene flow 133between the now-allopatric species; (ii) examine the fine-scale genomic landscapes of 134diversity and divergence across species at different stages of divergence; (iii) quantify 135the extent of genome-wide genealogical discordance and ancient hybridization among 136the three closely related aspen species; (iv) identify the signatures of positive selection 137 and long-term balancing selection along the genome, and uncover how they impact 138levels of variation during speciation. Overall, our main aim is to disentangle and 139understand how the multitude of evolutionary processes have shaped the genomic 140 architecture during speciation.

141

### 142 **2. Materials and Methods**

143

### 144 2.1 Sample collection, whole-genome resequencing and genotype calling

We used whole genome resequencing data from eight individuals each of *Populus tremula*, *P. tremuloides* and *P. trichocarpa*, as described in Wang et al. (2016a), and

147 additional eight individuals of *P. davidiana* that are first reported in this study (Table 148S1). The sampling was from a single geographic region for each species (Figure 1A). 149 Briefly, sequencing of all samples was carried out on the Illumina HiSeq 2000 platform. 150Prior to read mapping, we used Trimmomatic (Lohse et al., 2012) to remove adapter 151 sequences and to trim low quality bases from the start or the end of reads (base quality 15220). If the processed reads were shorter than 36 bases after trimming, the entire reads 153were discarded. After quality control, we mapped the remaining reads from each 154 individual to the *P. trichocarpa* reference genome (v3.0) (Tuskan et al., 2006) using 155 BWA-MEM algorithm with default parameters, as implemented in bwa-0.7.10 (Li, 156 2013).

157 To minimize the influence of mapping bias, several further filtering steps were 158employed before genotype calling. First, we used RealignerTargetCreator and 159IndelRealigner in GATK v3.8.0 (DePristo et al., 2011) to correct for the mis-alignment 160 of bases in regions around insertions and/or deletions (indels). Second, to account for 161 the artifacts due to PCR duplication introduced during library construction, we used the 162MarkDuplicates method from Picard packages (http://broadinstitute.github.is/picard/) to 163 only retain the read or read-pair with the highest summed base quality among those with 164 identical external coordinates and same insert lengths. Additionally, we further 165discarded site types that likely cause mapping bias based on three criteria: (1) those with 166 extreme read coverage (less then  $4\times$  or higher than twice of the mean coverage); (2) 167 covered by more than two reads of mapping score equaling zero per individual; (3) 168 overlapping known repetitive elements as identified by RepeatMasker (Tarailo -169 Graovac & Chen, 2009). Finally, sites that passed all these filtering criteria were used in 170downstream analyses. This left a total of 168,950,389 sites for further analysis (42.8% 171of collinear genomic sequences of the *P. trichocarpa* genome assembly).

8

172After filtering, we implemented two complementary approaches for genotype 173calling. First, to account for the bias inherent in genotype calling approach from next 174generation sequencing (NGS) data (Nielsen, Korneliussen, Albrechtsen, Li, & Wang, 1752012), the population genetic estimates that relied on site frequency spectrum (SFS) 176were calculated using ANGSD v0.917 (Korneliussen, Albrechtsen, & Nielsen, 2014). 177Second, for the analyses that require accurate single nucleotide polymorphism (SNP) 178calls, genotype calling in each individual was performed using HaplotypeCaller of the 179GATK v3.8.0, and GenotypeGVCFs was then used to merge multi-sample records from 180the four species together for re-genotyping and re-annotation of the newly merged VCF 181 (DePristo et al., 2011). To minimize genotype calling bias and to retain high-quality 182 SNPs, we further performed several filtering steps: (1) SNPs that overlapped with sites not passing all previous filtering criteria were removed; (2) only bi-allelic SNPs with a 183 184 distance of at least 5 bp away from any indels were retained; (3) genotypes with read 185 depth (DP) < 5 and/or with genotype quality score (GQ) < 10 were treated as missing, 186 and we then removed all SNPs with a genotype missing rate > 10%. After all these steps 187 of filtering, a total of 8,568,990 SNPs were retained across the four Populus species. 188 For the analyses that required imputed and phased dataset, BEAGLE v4.1 (Browning & 189 Browning, 2009) was used to infer haplotypes of individuals within each species.

190

### 191 2.2 Phylogenetic relationships and population structure analysis

### 192 Chloroplast phylogeny

To infer the phylogenetic relationship of the four *Populus* species based on chloroplast data, we first mapped the filtered reads from our resequencing data against the *P*. *trichocarpa* chloroplast genome using bwa-aln 0.7.10 (Li & Durbin, 2009). Then, UnifiedGenotyper in GATK v3.8.0 was used to call SNPs at all sites (--output\_mode 197 EMIT\_ALL\_SITES). Since chloroplasts are haploid and SNPs are thus expected to be 198 homozygous, the haploid option (-ploidy 1) in UnifiedGenotyper was used. After 199 treating sites with GQ < 30 as missing data, only bi-allelic SNPs with quality by depth 200  $(QD) \ge 10$  and with a missing rate  $\le 20\%$  were retained. Finally, a consensus tree was 201 constructed based on 1,292 chloroplast SNPs using maximum likelihood method 202 implemented in SNPhylo (Lee, Guo, Wang, Kim, & Paterson, 2014).

- 203
- 204 Principle component analysis (PCA)

205 To account for the uncertainty in genotype calls, PCA was performed using ANGSD 206 v0.917 and ngsTools v1.0.1 (Fumagalli, Vieira, Linderoth, & Nielsen, 2014). We first 207 used the SAMTools model (Li et al., 2009) in ANGSD to estimate genotype likelihoods 208 from BAM files using only reads with a minimal base quality score of 20 and a minimal 209 mapping quality score of 30 across all individuals. ngsTools was then used to compute 210 the expected covariance matrix across pairs of individuals for the four species based on 211 the genotype posterior probabilities across all filtered sites. Eigenvectors and 212 eigenvalues were generated with the R function eigen from the covariance matrix, and 213the significance level was determined using the Tracy-Widom test as implemented in 214 EIGENSOFT version 6.1.4 (Patterson, Price, & Reich, 2006).

215

### 216 Identity-by-descent (IBD) blocks analysis

To determine the extent to which individuals across the four species shared DNA segments, the identity-by-descent block analysis was performed for the four species using BEAGLE v4.1 (Browning & Browning, 2013) with the following parameters: window=100,000; overlap=10,000; ibdtrim=100; ibdlod=5.

221

### 222 2.3 Demographic history reconstruction

### 223 MSMC

224We used Multiple Sequentially Markovian Coalescent approach (MSMC v2) (Schiffels 225 & Durbin, 2014) to infer patterns of historical patterns of effective population sizes 226 changes through time for all four *Populus* species. Only sites passing all above filtering 227 criteria were included in analyses. Because different number of individuals and 228 haplotypes provides different resolution for recent and distant population histories, we 229 applied MSMC to phased whole-genome sequences from one (two haplotypes, which 230 can infer more distant size changes), two (four haplotypes, which infer size changes at 231intermediate time scales) and four (eight haplotypes, which infer the most recent size 232 changes) individuals for each species, respectively. We did not include more haplotypes 233due to the computational cost of using larger haplotype sets. In total, we have 8, 28 and 23470 different individual configurations for two-, four-, and eight- haplotype analyses in 235each species. We ran MSMC on all individual configurations and estimated medians 236and standard deviations of effective population sizes changes across time. To convert 237 the coalescent scaled time to absolute time in years, we used a mutation rate of  $2 \times 10^{-9}$ 238per site per year (Koch, Haubold, & Mitchell-Olds, 2000) and a generation time of 15 239 years.

240

### 241 Fastsimcoal2

Given the long divergence time and the low number of polymorphic sites shared between aspens and *P. trichocarpa* (Wang, Street, Scofield, & Ingvarsson, 2016a), we used a coalescent simulation-based method implemented in *fastsimcoal2.6* (Excoffier, Dupanloup, Huerta-Sánchez, Sousa, & Foll, 2013) to only infer the demographic and speciation histories only for the three aspen species. For all possible pairs of the three 247 species, the two-dimensional joint SFS (2D-SFS) was constructed from the posterior 248 probabilities of sample allele frequencies using ANGSD v0.917 (Figure S1). A total of 249 twenty-nine models were evaluated and all models began with the split of an ancestral 250population into the Eurasia and the North America lineage (P. tremuloides) followed by 251the split of the Eurasian lineage into P. tremula and P. davidiana. The models differed 252in terms of (1) whether post-divergence gene flow was present or not, (2) time, level 253and pattern of gene flow between the three aspen species, and (3) the occurrence and 254 pattern of population expansion in P. tremuloides given a genome-wide excess of rare 255frequency alleles that we observed in this species in our previous study (Wang et al., 2562016a) and also in this study (Figure S2). Alternative demographic models were fitted 257 to the joint SFS data. The global maximum likelihood estimates for all demographic 258parameters under each model were obtained from 50 independent runs, with 100,000 259coalescent simulations per likelihood estimates (-n 100000, -N 100000) and 40 cycles of 260the likelihood maximization algorithm. The models were compared based on the 261maximum value of likelihood over the 50 independent runs using the Akaike's weight 262 calculated following Excoffier et al. (2013). The model with the maximum Akaike's 263weight value was chosen as the optimal one. Confidence intervals were generated by 264performing parametric bootstrapping with 100 bootstrap replicates, and with 50 265 independent runs in each bootstrap. As for MSMC, we assumed a mutation rate of  $2 \times 10^{-9}$  per site per year and a generation time of 15 years (Koch et al., 2000) when 266 267 converting estimates to units of years and individuals.

268

### 269 2.4 Intra- and inter- species summary statistics

270 Intra-species genomic diversity

271For each species, based on the SAMTools genotype likelihood model (Li et al., 2009), 272 we used ANGSD v0.917 (Korneliussen et al., 2014) to estimate allele frequency 273likelihoods, obtain a maximum likelihood estimate of the folded site frequency 274spectrum and used this to calculate nucleotide diversity ( $\pi$ ) in non-overlapping sliding 275windows of 10 Kbp and 100 Kbp across the entire genome. Only sites with a minimum 276mapping quality of 30 and minimum base quality of 20 were used in the estimation. 277 Windows were discarded if there were less than 10 % sites left after all of the filtering 278steps described above. Since our previous study showed that linkage disequilibrium 279(LD) decays within 10 Kbp in different species of *Populus* (Wang et al., 2016a), in the 280 following we focused more on estimates derived from 10 Kbp windows.

281

### 282 Inter-species genomic divergence

283For each species pair, we estimated two divergence metrics across the 10 Kbp and 100 284 Kbp non-overlapping windows: genetic differentiation  $(F_{ST})$  and sequence divergence 285 $(d_{xy})$ . Without relying on SNP or genotype calling (Fumagalli et al., 2013), we first used 286 ANGSD to calculate posterior probabilities of sample allele frequency for each species. 287 Then, the program ngsFST from the ngsTools package was used to estimate  $F_{ST}$ 288 between species using a method-of-moments estimator, and the program ngsStat was 289 used to calculate  $d_{xy}$  between species at each site. Finally, we averaged these divergence 290 values across all sites within each window.

291

### 292 *Population-scaled recombination rate*

For each species we used LDhelmet v1.9 (Chan, Jenkins, & Song, 2012), a coalescent-based, reversible-jump Markov chain Monte Carlo (rjMCM) simulation method, to estimate the population-scaled recombination rate,  $\rho$ . First, VCFtools

296 (Danecek et al., 2011) and custom shell script were used to tailor the phased genotype 297 data of each chromosome to the necessary input sequence file (fasta format). Then, we 298used 'find\_confs' in LDhelmet to concatenate all the input sequences files and generate 299 a haplotype configuration file per species. Thereafter, 'table\_gen' was used to compute 300 the likelihood lookup table for each species, where we assume the approximate 301 genome-wide neutral diversity ( $\theta$ ) of 0.01 for the three aspen species and of 0.005 for P. 302 trichocarpa (Wang et al., 2016a), and the grid of  $\rho$  values was specified as -r 0.0 0.1303 10.0 1.0 100.0 for all species. In addition, the optional 'pade' component of LDhelmet 304 was included in the analysis, which computes the Padé coefficients (-x 11) from the 305 haplotype configuration file. Finally, we ran LDhelmet with window size of 50 SNPs 306 and block penalty of 50 for a total of 1,000,000 iterations, discarding the first 100,000 307 as burn-in. We then calculated weighted average of the estimated  $\rho$  in 10 Kbp and 100 308 Kbp windows, respectively. Windows with less than 50 SNPs (for 10 Kbp windows) 309 and 200 SNPs (for 100 Kbp windows) left from previous filtering steps were discarded. 310

### 311 **2.5 Window-based phylogenomic analysis**

### 312 *Topology weighting*

313 As expected for a clade with rapid radiation, genealogies may vary widely across 314 different genomic regions (Lamichhaney et al., 2015). Given that P. trichocarpa is 315 distantly related from the other three aspen species (Hamzeh & Dayanandan, 2004), we 316 used Twisst, a topology weighting method by iterative sampling of subtrees (Martin & 317 Van Belleghem, 2017), to assess and quantify the phylogenetic discordance among the 318 three aspen species along the genome. The genealogical relationships of these species 319 can be defined by three possible topologies: [(P. tremula, P. davidiana), P. 320 tremuloides], [(P. tremula, P. tremuloides), P. davidiana], [(P. davidiana, P.

321 tremuloides), P. tremula. Using P. trichocarpa as the outgroup species, local 322 phylogenetic subtrees was inferred in RAxML v8.2.4 (Stamatakis, 2014) with the 323 GTRCATI model over non-overlapping 10 Kbp and 100 Kbp windows. Topology 324 weightings for each window were then computed through determining the number of 325 unique subtrees that match each of the three possible topologies by iteratively sampling 326 a single haplotype from each species (Martin & Van Belleghem, 2017). Windows were 327 discarded in topology weighting estimation if there were < 50 SNPs and < 200 SNPs 328 left from previous filtering steps for 10 Kbp and 100 Kbp windows, respectively.

329

### 330 Inference of incomplete lineage sorting

331 Because the speciation events that resulted in aspen species were close in time (see 332 Results), we expect the lineage sorting process relating these species to be incomplete. 333 Given the three aspen species and the outgroup poplar species (*P. trichocarpa*) with the 334 relationship as (((P. tremula, P. davidiana), P. tremuloides), P. trichocarpa), we labeled 335 alleles in P. tremula, P. davidiana and P. tremuloies as A (ancestral allele) if they match 336 the reference allele of *P. trichocarpa* genome, and B (derived allele) otherwise. We then 337 considered segregating sites with (((P. tremula, P.davidiana), P. tremuloides), P. 338 *trichocarpa*) patterns as AABAs, ABAAs, BAAAs, ABBAs, BABAs and BBAAs. The 339 two SNP patterns ABBAs and BABAs can result from incomplete lineage sorting if we 340 assume no gene flow occurred among species (Durand, Patterson, Reich, & Slatkin, 341 2011; Green et al., 2010). We calculated the level of incomplete lineage sorting (ILS) at 342 site *i* in the genome as:

343

344 ILS=
$$(C_{ABBA(i)}+C_{BABA(i)})/h$$
 (1)

345 where 
$$h = (C_{BAAA(i)} + C_{ABAA(i)} + C_{AABA(i)} + 2(C_{BBAA(i)} + C_{BABA(i)} + C_{ABBA(i)})/3$$
 (2)

15

| 2 | Λ | G |
|---|---|---|
| υ | 4 | υ |

| 347 | Because population samples were used for all species, at each site                        | we used the    |
|-----|---|----------------|
| 348 | frequency of the derived allele in each species to effectively weight each                | ch segregating |
| 349 | site according to its fit to the six segregation patterns for the three                   | aspen species  |
| 350 | (Durand et al., 2011), with   |                |
| 351 |   |                |
| 352 | $C_{\text{BAAA(i)}} = \hat{p}_{i1}(1-\hat{p}_{i2})(1-\hat{p}_{i3})(1-\hat{p}_{i4})$       | (3)            |
| 353 | $C_{\text{ABAA(i)}} = (1 - \hat{p}_{i1})\hat{p}_{i2}(1 - \hat{p}_{i3})(1 - \hat{p}_{i4})$ | (4)            |
| 354 | $C_{\text{AABA(i)}} = (1 - \hat{p}_{i1})(1 - \hat{p}_{i2})\hat{p}_{i3}(1 - \hat{p}_{i4})$ | (5)            |
| 355 | $C_{\text{BBAA(i)}} = \hat{p}_{i1} \hat{p}_{i2} (1 - \hat{p}_{i3}) (1 - \hat{p}_{i4})$    | (6)            |
| 356 | $C_{\text{BABA(i)}} = \hat{p}_{i1}(1-\hat{p}_{i2})\hat{p}_{i3}(1-\hat{p}_{i4})$           | (7)            |
| 357 | $C_{\text{ABBA(i)}} = (1 - \hat{p}_{i1}) \hat{p}_{i2} \hat{p}_{i3} (1 - \hat{p}_{i4})$    | (8)            |
| 050 |   |                |

358

359 where  $\hat{p}_{ii}$  is the frequency of the derived allele at site i in species j.

360

361 The calculation of ILS presents the counts of incomplete lineage sorting pattern 362  $(C_{ABBA(i)})$  and  $C_{BABA(i)}$  normalized by the total count of segregating sites (h), which is a 363 proxy of the species tree topology height (Scally et al., 2012). We then summarized the 364 proportion of ILS over non-overlapping 10 Kbp and 100 Kbp windows or in bins with 365 varying distances from the nearest exon.

366

#### 367 2.6 Analyses of introgression

368 We first tested for introgression between the three aspen species using the *D*-statistic, 369 also known as the ABBA-BABA tests. These tests evaluate the imbalance frequency of 370 site patterns (Durand et al., 2011; Green et al., 2010). Using P. trichocarpa as the

371 outgroup, we expect equal counts of the two site patterns (ABBA and BABA) when 372 incomplete lineage sorting causes the site pattern discordance. If discordance is caused 373 by introgression, one of the site patterns is expected to be more prevalent than the other. 374 We applied two approaches to perform the D-statistic test. First, we used 375 -doAbbababa2 implemented in ANGSD v0.917 (Korneliussen et al., 2014) to directly 376 count ABBA and BABA sites and calculate the D statistic without calling genotypes in 377 non-overlapping 10 Kbp and 100 Kbp windows for the whole genome. Then, jackknife 378 bootstrapping was conducted to estimate significance at the chromosome and 379 whole-genome level. Second, based on allele frequencies at each SNP called by GATK, 380 we calculated the D statistic in 10 Kbp and 100 Kbp non-overlapping windows across 381 the genome with the python script ABBABABABAwindows.py 382 (https://github.com/simonhmartin/genomics\_general) (Martin, Davey, & Jiggins, 2014). 383 Following the detection of introgression among individuals at the genome level, we 384 used a modified f-statistic ( $f_d$ ) (Martin et al., 2014) to estimate the proportion of 385 introgressed sites the population level using ABBABABABAwindows.py at 386 (https://github.com/simonhmartin/genomics general) on non-overlapping 10 Kbp and 387 100 Kbp windows across the genome.

388

### 389 2.7 Genome-wide scan for regions under positive and balancing selection in aspens

To specifically test for the impact of positive and balancing selection on the genomic landscape during speciation of aspens, we first used a composite likelihood ratio (CLR) statistic implemented in SweepFinder2 (DeGiorgio, Huber, Hubisz, Hellmann, & Nielsen, 2016) to detect regions subject to recent positive selection or selective sweeps in each of the three aspen species. The ancestral allelic state was defined by assuming that the alleles that were the same as those found in the *P. trichocarpa* reference

396 genome was the ancestral alleles. By contrasting the likelihood of the null hypothesis, 397 based on the unfolded site frequency spectrum (SFS) calculated across the genome 398 using –f option, with the likelihood of a model where the SFS has been altered by a 399 recent positive selection event, the CLR statistics was calculated in non-overlapping 400 windows of 10 Kbp. Within each species, windows with CLR values higher than the 401 99<sup>th</sup> percentile of its distribution were identified as candidate region under selection.

402 Moreover, we identified regions under long-term balancing selection by estimating 403 the summary statistics,  $\beta$  (beta score), which detects the clusters of variants with an 404 excess number of intermediate frequency polymorphisms (Siewert & Voight, 2017). 405 Given that the signals of long-term balancing selection usually is localized to a narrow 406 genomic region (Gao, Przeworski, & Sella, 2015), we used 1 Kbp windows to calculate  $\beta$  values for each core SNPs in the three aspen species. We used the unfolded version of 407 408  $\beta$ , with the ancestral and derived allelic states inferred based on comparisons with the 409 outgroup species *P. trichocarpa*. To prevent false positives, we filtered out SNPs with a 410 folded frequency lower than 20%, and defined the SNPs with extreme  $\beta$  scores in the 411 top 1% as significant. Furthermore, only SNPs that are significant in all three species 412 were considered as putative targets of long-term balancing selection. Finally, we binned 413 significant SNPs into 10 Kbp windows for downstream comparisons.

Lastly, to assess the effects of positive and balancing selection on the genomic architecture of speciation, we compared outlier windows that were identified as being under positive or balancing selection with the remaining genomic regions using a variety of population genetic statistics, including genetic diversity, divergence, lineage sorting and introgression within and between the three closely related aspen species. Differences between outlier windows and the genome-wide averages for all these statistics were tested using Wilcoxon ranked-sum tests. To further examine whether any

18

421 functional classes of genes were over-represented in these candidate regions, we 422 performed gene ontology (GO) analyses using the R package topGO 2.36.0 (Alexa & 423 Rahnenführer 2009). Fisher's exact test was used to calculate the statistical significance 424 of enrichment, and GO terms with *P*-value lower than 0.01 were considered to be 425 significantly enriched.

426

### 427 **3. Results**

#### 428 **3.1** Phylogenetic relationships, population structure and demographic history

429 The genome alignment resulted in an average depth of 24.6× across all individuals 430 after quality control (Table S1). The PCA results revealed a clear distinction among the 431 four *Populus* species (Figure S4). Based on the Tracy-Widom test, only the first three 432 components were significant (Table S2). The first principal component (PC1; variance 433 explained=28.79%) separated P. trichocarpa from the three aspen species, while the 434 second component (PC2; variance explained=7.52%) separated P. tremuloides from P. 435 tremula and P. davidiana. Finally, the third component (PC3, variance 436 explained=5.33%) separated P. tremula and P. davidiana. The clustering and genetic 437 relationships of the four species were also confirmed by the phylogenetic tree 438 constructed based on the entire chloroplast genomes (Figure 1B). Moreover, we 439 measured the number and length of shared IBD haplotypes within and between species 440 (Figure S5, S6; Table S3, S4). Compared to between-species comparisons, we found 441 much more extensively shared IBD haplotypes for within-species comparisons (Figure 442 S5), although haplotypes shared within *P. tremuloides* were shorter than the other three 443 species (Figure S6A; Table S4). This is likely owing to the higher recombination rate 444 and more rapid decay of linkage disequilibrium (LD) in P. tremuloides than other 445 species (Wang et al., 2016a). For the between-species comparisons, we did no observe any haplotype sharing between the three aspen species and *P. trichocarpa*, confirming
the distant relationship between aspens and poplars in the genus *Populus* (Figure S5,
Table S3). Within aspens, *P. tremula* and *P. davidiana* shared more and longer
haplotypes than either of them shared with *P. tremuloides* (Figure S5, S6B; Table S3,
S4), which also supports a closer relationship between these two species, as identified in
the chloroplast phylogeny.

452 To investigate the demographic and speciation histories of the four *Populus* species, 453 we first used MSMC to examine historical fluctuations in the effective population size 454  $(N_{\rm e})$  for each species. The results showed that all species experienced a period of 455 population decline during the early Pleistocene cooling (2.5-0.9 million years ago, Mya) 456 (Figure 1C). Compared with the three aspen species, *P. trichocarpa* experienced a more 457 dramatic population decline during this period (Figure 1C, Figure S7), which likely 458 explain the much lower genetic diversity observed in this species relative to others 459 (Table S5). The two North American species, P. tremuloides and P. trichocarpa, 460 experienced a population expansion from the start of the last ice age (110 thousand 461 years ago, Kya) until the last glacial maximum (LGM, 23-18 Kya) whereas the 462 European species *P. tremula* remained relatively stable. On the other hand, the eastern 463 Asian species, P. davidiana, showed pattern of population decline during the entire 464 period (Figure 1C, Figure S7). Our results therefore revealed that before the LGM, 465 forest trees distributed in different continents experienced asynchronous demographic 466 responses to Pleistocene climate changes (Bai et al., 2018). During and following the 467 LGM, all four species experienced a population decline followed by a subsequent rapid 468 population expansion (Figure 1C).

469 Because of the distant phylogenetic relationship and low levels of shared 470 polymorphism between *P. trichocarpa* and the three aspen species (Wang et al., 2016a),

20

471 we therefore explicitly focused on inferring the demographic parameters of the 472 speciation history for the three aspens. After evaluating a total of twenty-nine models 473 (Figure S8), the best-supported model (Figure S8; Table S6) suggests that the Eurasian 474lineage (the common ancestor of *P. tremula* and *P. davidiana*) split from the North 475 American lineage (*P. tremuloides*) at ~ 2.4 Mya (bootstrap range [BP]: 2.1-3.2 Mya), 476 which is in accordance with our earlier estimates on the divergence time between P. 477 tremula and P. tremuloides (Wang, Street, Scofield, & Ingvarsson, 2016b). The 478 European lineage (P. tremula) and the East-Asian lineage (P. davidiana) diverged  $\sim 1.7$ 479 Mya (BP: 1.5-2.1 Mya) (Figure 1D, Table S7). Our results detected low levels of 480 ancient gene flow between P. tremula and P. davidiana, and between P. tremula and P. 481 tremuloides following speciation until around 847 Kya (BP: 539Kya-1.0 Mya) (Figure 482 1D). After this period the species have remained isolated which is also reflected by their 483 current disjunct geographic distributions (Figure 1A). Compared to the Eurasian lineage 484 of aspens, P. tremuloides has experienced a notable population expansion in the recent 485 past (~772 Kya, BP: 440-887 Kya), which is consistent with its genome-wide excess of 486 rare alleles (Figure S2).

487

#### 488 **3.2** General patterns of genome-wide diversity and differentiation

We further characterized genome-wide patterns of nucleotide diversity ( $\pi$ ), population recombination rate ( $\rho$ ) and divergence ( $F_{ST}$  and  $d_{xy}$ ) for the four *Populus* species (Figure 2A; Table S5, Table S8-S10). At the species level,  $\pi$  varied markedly between species, ranging from 0.0063 in *P. trichocarpa* to 0.0148 in *P. tremuloides*, but the average genomic diversity was very similar across the three aspen species (Table S5). In contrast to the patterns observed for  $\pi$ , the population-scaled recombination rate,  $\rho$ , was much higher in *P. tremuloides* (0.0273 bp<sup>-1</sup>) than in the other three species 496 (0.0096 bp<sup>-1</sup>-0.0139 bp<sup>-1</sup>) (Table S8). Variation in genetic divergence ( $F_{ST}$  and  $d_{xy}$ ) 497 among the six species pairs reveals the continuous nature of differentiation along the 498 speciation continuum, with *P. tremula* and *P. davidiana* showing the lowest levels of 499 divergence and with the highest divergence observed between aspens and *P.* 500 *trichocarpa* (Figure 2A, Table S9, S10).

501 At the genome level, patterns of genetic diversity and divergence show high levels 502 of parallelism in all pairwise comparisons. The genome-wide profiles of  $\pi$  (average 503 Spearman's  $\rho = 0.71$ ) and  $\rho$  (average Spearman's  $\rho = 0.18$ ) were positively correlated in 504 all possible species pairs (Figure 2B, Table S11). We found little evidence for an 505 association between either  $\pi$  or  $\rho$  and the local mutation rate ( $\mu$ , approximated by the 506 four-fold synonymous substitution rate) (Figure 2B, Table S11). Hence, the broad-scale 507 variation in genetic diversity is conserved across the diverging lineages, which likely 508 arise from a common genomic architecture where linked selection has played a major 509 role in shaping local genomic diversity (Burri, 2017). This is further highlighted by the 510 conserved landscape of recombination rate variation across the genomes of the species 511 and the strong degree of genome synteny that we observed between the genomes of 512 aspens and poplars (Lin et al., 2018). Second, we found that the differentiation 513 landscapes were highly correlated among all species pairs both for the relative  $(F_{ST})$  and 514 the absolute  $(d_{xy})$  measures of genetic differentiation (Figure 2B, Figure S9, Table S11). 515 The highly similar landscape of differentiation among different species pairs could 516 imply phylogenetically conserved genomic features, e.g. conserved landscapes of 517 functional densities and recombination (Burri, 2017; Vijay et al., 2017). Moreover, 518 significantly negative correlations between  $F_{ST}$  and  $\pi$  were found in all pairwise 519 comparisons (Figure 2B, Figure S9, Table S11), which is in line with the observation 520 that  $F_{ST}$  is sensitive to intra-specific nucleotide diversity (Charlesworth, 1998). In 521 contrast, only weak correlations were observed between  $d_{xy}$  and  $\pi$ . Because  $d_{xy}$  largely 522 reflects diversity in a common ancestor (Cruickshank & Hahn, 2014), a weak 523 correlation between  $d_{xy}$  and  $\pi$  implies that ancestral diversity might have little impact on 524 extant diversity in the different *Populus* species. In addition to extant diversity,  $d_{xy}$  was 525 only weakly correlated with  $F_{ST}$  across all comparisons (Figure 3B, Figure S9, Table 526 S11), which further implies that ancestral polymorphisms have had limited contribution 527 to the genomic divergence of extant species (Cruickshank & Hahn, 2014).

528

# 529 3.3 Topology weighting reveals phylogenetic discordance and ancient introgression 530 between P. tremula and P. tremuloides

531Even if the analyses of current population structure and genomic divergence support a 532 clear species relationship for the four *Populus* species, (((P. tremula, P. davidiana), P. 533 tremuloides), P. trichocarpa), we used a topology weighting approach to explore to 534 what degree the 'species tree' was congruent across the entire genome. Using P. 535 trichocarpa as an outgroup, our results reveal widespread incongruence in local 536 genealogies in either 10 Kbp or 100 Kbp non-overlapping windows across the genome 537 (Figure 3, Figure S10). The most prevalent topology, ((P. tremula, P. davidiana), P. 538 tremuloides), which reflects the likely 'species topology', has an average weighting of 539 54.7% and 76.5% across the genome in 10 Kbp and 100 Kbp windows, respectively. Of 540 the other two topologies, the ((P. tremula, P. tremuloides), P. davidiana) topology was 541 much more common (27.0% and 17.6% for 10 Kbp and 100 Kbp windows) compared 542 to ((P. davidiana, P. tremuloides), P. tremula) (18.3% and 5.9% for 10 Kbp and 100 543 Kbp windows) (Figure 3, Table S12). In general, we observed that larger windows (100 544 Kbp) produced higher rates of monophyly (windows with a weighting of 1) and a 545 greater fraction of resolved trees compared to the smaller windows (10 Kbp) (Figure

546 **S10**, Table S13).

547 Interestingly, in contrast to all other chromosomes where all three topologies were 548 observed, chromosome 19, which is known to harbor the sex determination region in 549 *Populus* (Yin et al., 2008), showed only a single monophyletic grouping of the 'species 550 topology' (Figure 3). Such a pattern is consistent with the expectation that lineage 551 sorting is faster on sex chromosomes compared to autosomes because of its smaller 552 effective population size (Meisel & Connallon, 2013; Vicoso & Charlesworth, 2006). 553 Overall, both incomplete lineage sorting (ILS) and introgression can result in 554 discordance between the local topology and the species tree for recently diverged 555 species. Given that ILS is expected to generate equal frequencies of the alternative 556 topologies (Durand et al., 2011; Mailund et al., 2014), the more frequent topology of 557((P. tremula, P. tremuloides), P. davidiana) is likely explained by the occurrence of 558 introgression between P. tremula and P. tremuloides. We therefore compared the 559 distribution of the branch lengths separating each pair of aspen species among all 560 topology types. Compared to the expectation that species with recent introgression tend 561 to be separated by short branches (Fontaine et al., 2015; Martin & Van Belleghem, 562 2017), the branch distances between *P. tremula* and *P. tremuloides* were not obviously 563 different from other species-pairs across topology comparisons (Figure S11). This 564 pattern is most likely caused by ancient hybridization between these two species where 565 genetic drift has eradicated most signatures of gene flow after an ancient introgression 566 event (Schumer, Cui, Powell, Rosenthal, & Andolfatto, 2016).

To further investigate patterns of ancient introgression between *P. tremula* and *P. tremuloides*, we calculated two statistics associated with the ABBA-BABA test across the genome. The *D*-statistic is used to test for ancient gene flow by comparing the

24

570 imbalance of ABBAs and BABAs, and the  $f_d$ -statistic is used to estimate the fraction of 571 the genome shared through ancient introgression. For the D-statistics, we also 572 implemented two different approaches, which differed in whether the called genotypes 573 was relied or not. We find that the estimates of the two approaches are highly correlated 574with each other (Figure S12), suggesting that this statistic is robust to identify 575 introgression regardless of which type of data is used. Genome-wide estimates of the 576 D-statistic and f-statistic showed a general pattern of positive values over 10 Kbp and 577 100 Kbp non-overlapping windows (Table S14), confirming that *P. tremuloides* has a 578closer genetic relationship with P. tremula than with P. davidiana. Thus, the significant 579 asymmetry in genetic relationship together with the excess of shared sequence 580 polymorphism between P. tremula and P. tremuloides (Figure S13) all provide evidence 581 for historical gene flow between the currently allopatric Eurasian and North American 582aspen species.

583

### 584 **3.4** Long-term effects of selection in shaping patterns of diversity, divergence, 585 incomplete lineage sorting (ILS) and levels of introgression in Populus species

586 To evaluate the impact of natural selection on genetic diversity, divergence, ILS and 587 gene flow in the context of speciation, we examined the correlations between these 588 genetic parameters and factors affecting the extent and efficiency of selection. First, 589 regions with a high density of potential targets for selection are expected to experience 590 stronger linked selection simply because selection occurs more often in such regions 591 (Al-Shahrour et al., 2010; Flowers et al., 2011). We therefore examined the relationship 592between intraspecific diversity, species divergence and the density of functional 593 elements, defined as the proportion of protein-coding sites within a 10 Kbp or 100 Kbp 594 window (coding density). We hypothesized that if selection contributes to the reduction 595 of diversity at linked neutral sites, its effect is expected to be more pronounced in 596 regions with greater content of functional elements (Ravinet et al., 2017). Consistent 597 with this prediction, we observed a significantly negative relationship between  $\pi$  and 598 functional content (Figure 4A). This correlation was robust to the presence of 599 confounding factors such as GC content, recombination rate and the choice of window 600 size (Table S15).

601 Moreover, if natural selection was acting on the ancestral polymorphisms prior to 602 the divergence of the two descendant lineages, it could also have an effect on the 603 genetic divergence between species (Munch et al., 2016; Scally et al., 2012). We 604 therefore examined the relationship between interspecies divergence (both  $F_{ST}$  and  $d_{xy}$ ) 605 and coding density, and observed negative relationships for both  $F_{ST}$  and  $d_{xy}$  (Figure 606 4B, C), especially between species with longer divergence times (e.g. aspens and P. 607 trichocarpa) (Table S17, Table S19). Indeed, if a region experiences natural selection 608 during divergence, it should show lower  $\pi$  within species and higher  $F_{ST}$  between 609 species because  $F_{ST}$  is sensitive to intra-specific genetic variation (Cruickshank & Hahn, 2014). Accordingly, a positive correlation between coding density and  $F_{\rm ST}$  is 610 611 predicted. The opposite pattern we observe here indicates that long-term natural 612 selection, most likely due to background selection in functional regions, has 613 continuously contributed to the reduced ancestral polymorphism and genetic divergence 614 in regions with greater functional content (Phung et al., 2016). In fact, because of the 615 accumulation of the large amount of new mutations since speciation, ancestral 616 polymorphism may only account for a small amount of the overall average divergence 617 between distantly related species (Edwards & Beerli, 2000). However, the variance of 618 ancestral polymorphism, largely affected by natural selection in ancestral populations, 619 can on the other hand make a substantial contribution to the variability of genome-wide 620 patterns of divergence between species (McVicker, Gordon, Davis, & Green, 2009;

621 Phung et al., 2016).

622 To further explore the role of natural selection during the divergence of the three 623 aspen species, we examined the extent of ILS across the genome, which can aid to infer 624 evolutionary process in ancestral populations (Mailund et al., 2014; Pease & Hahn, 625 2013). The pattern of ILS along the genome offers information about the local 626 differences in the ancestral effective population size of the *aspen* ancestor (Pamilo & 627 Nei, 1988). Both purifying and positive selection in the ancestral population are 628 expected to reduce ancestral population size in regions targeted by selection, resulting in 629 increased rates for lineages to coalesce and leaving less available for ILS (Dutheil, 630 Munch, Nam, Mailund, & Schierup, 2015; Munch et al., 2016; Prüfer et al., 2012; 631 Scally et al., 2012). In agreement with this, we found that the fraction of ILS decreases 632 with increasing coding density (Figure 4D), and this relationship remained even after 633 correcting for the confounding variables (Table S21). Within coding exons, ILS is ~19 % 634 lower and the suppression of ILS extends several thousand bps away from coding genes 635 (Figure S14). Similarly, the proportion of the topology reflecting the true species tree 636 increases with coding density (Figure 4E; Table S21).

637 In addition, given that the level of admixture estimated by  $f_d$  between *P. tremula* 638 and *P. tremuloides* show considerable heterogeneity across the genome (Figure S15), 639 we examined whether selection may have played a role in shaping genome-wide 640 patterns of introgression. We estimated the relationship between  $f_d$  and coding density 641 and found a significantly negative correlation (Figure 4F; Table S21), indicating that 642 there is greater selection against introgressed alleles in regions enriched for genes 643 (Harris & Nielsen, 2016). The occurrence of this pattern is not likely an artefact of 644 reduced power, as regions with a high density of functionally important elements are 645 expected to have experienced stronger long-term selection and exhibit lower levels of 646 ILS. Accordingly, our power to detect introgression is expected to be elevated close to 647 these regions (Sankararaman et al., 2014; Sankararaman, Mallick, Patterson, & Reich, 648 2016). Taken together, it is clear that natural selection has had a strong impact on 649 patterns of phylogenetic discordance across the genome among closely related aspen 650 species. However, it is not yet clear to what extent this heterogeneity might be due to 651 incomplete lineage sorting of ancestral polymorphisms or due to ancient introgression. 652 More explicit experimental designs in future studies are needed to tease apart these 653 different processes and explore how natural selection and hybridization act in 654 combination to shape the genome-wide phylogenetic heterogeneity among recently 655 diverged species.

656 In addition to the local density of functional elements, recombination rates can also 657 interact with natural selection to influence the genomic distribution of genetic diversity 658 and divergence (Figure 4). High recombination can rapidly decouple linked loci and 659 restrict the effect of selection on linked neutral sites (Begun & Aquadro, 1992; Cutter & 660 Payseur, 2013). We found that  $\pi$  and  $F_{ST}$  showed positive and negative correlations, 661 respectively, with local recombination rates (Figure 4A-C; Table S16, S18, S20). In 662 contrast to the predicted pattern of speciation with gene flow where reduced  $d_{xy}$  is 663 expected in regions of high recombination (Nachman & Payseur, 2012), we did not find 664 any relationship between  $d_{xy}$  and recombination rate. These observations are in 665 accordance with the expectation that linked selection is prevalent and has genome-wide 666 effects in shaping patterns of genetic diversity and divergence at linked sites in *Populus* 667 (Nachman & Payseur, 2012; Wang et al., 2016b). On the other hand, we found that the 668 incidence of ILS increases with the recombination rate (Figure 4D), which was still 669 observable even after correcting for the confounding variables of coding density and 670 GC content (Table S22). Given that variation in ILS across the genome approximately 671 reflects variation in ancestral  $N_{\rm e}$  (Degnan & Salter, 2005; Pamilo & Nei, 1988), the 672 stronger effects of recurrent natural selection in low-recombination regions also reduced 673  $N_{\rm e}$  in ancestral populations and hence made ILS less likely to occur (Charlesworth et al., 674 1993; Martin, Davey, Salazar, & Jiggins, 2019; Pease & Hahn, 2013). We did not find 675 obvious correlation between  $f_d$  and recombination rate (Figure 4F, Table S22), might 676 because barriers to introgression has been sculpted by long-term selection and genetic 677 drift after the ancient gene flow and cannot be predicted by recombination rate 678 estimated from current populations. Overall, all these results suggest that the patterns of 679 diversity, divergence and genealogical relationships among the three closely related 680 aspen species are not randomly distributed along the genome, but instead are strongly 681 structured by the interaction between widespread natural selection and intrinsic genomic 682 features, as well as their influence on retention of signatures of ancient gene flow.

683

## 684 3.5 The impact of positive and balancing selection on genomic architecture of 685 speciation

686 Although widespread background selection is likely to have had a large effect in 687 shaping the heterogeneous genomic landscape of variation within and between species 688 (Burri, 2017; Charlesworth, 2012), we were interested in assessing whether positive 689 selection or long-term balancing selection have also played important roles in driving 690 these processes. To identify the impact of positive selection, we performed a 691 composite-likelihood based (CLR) test to scan the genomes for signals of positive 692 selection in each of the three aspen species (Figure 5A). For each species, we 693 considered the windows with a CLR value in the top 1 percentile as candidate region 694 under positive selection. In total, we detected 538 outlier windows across the three

695 species, and only 13 among them were shared by all species (Figure 5B). Our results 696 suggest that most putative sweeps are likely species-specific and may result from 697 relatively recent positive selection that has occurred independently in various lineages 698 after speciation. Compared to genome-wide averages, outlier windows have 699 significantly lower nucleotide diversity, lower recombination rates, higher  $F_{\rm ST}$  but 700 similar  $d_{xy}$  (Figure 5C). In addition, the outlier windows show significantly higher 701 average weightings of the 'species topology' (Topo2) and lower levels of ILS compared 702 to genomic background (Figure 5C,D). The ancestral admixture proportion  $(f_d)$  between 703 P. tremula and P. tremuloides is also significantly reduced in the outlier windows 704 (Figure 5D), suggesting that strong selection in these regions may have contributed to 705 the reproductive barriers isolating closely related species (Martin et al., 2019).

706 To further study how long-term balancing selection may have driven the evolution 707 of the genomic landscape during speciation, we used a summary statistics,  $\beta$  (beta score), 708 to search for signals of balancing selection across the genome for each aspen species 709 (Siewert & Voight, 2017). As we did for positive selection, we only consider variants 710 with  $\beta$  scores falling in the top 1% as candidate variants. Furthermore, variants 711 simultaneously detected in all three species are considered as potential targets of 712 long-term balancing selection. With this criteria we identified a total of 519 variants 713 putatively under long-term balancing selection across the three aspen species (Figure 714 6A,B). These variants were unevenly distributed in the genome, and to make them 715 comparable to our previous analyses we clustered them into 32 regions of 10 Kbp 716 windows (Figure 6A). We found significantly higher nucleotide diversity, higher 717 recombination rates, lower  $F_{ST}$ , and higher  $d_{xy}$  in the regions under balancing selection 718 compared to the genomic background (Figure 6C). Moreover, we found lower 719 weightings of the 'species topology', higher ILS, and lower  $f_d$  in the candidate balancing

selection regions although the results were not significant, likely due to the small number of windows showing evidence for balancing selection (Figure 6C,D). We therefore infer that long-term balancing selection may not only influence the genomic landscape of diversity and divergence but may also play a role in shaping the genealogical relationship and barriers to introgression among closely related species (Charlesworth, 2006; Wang et al., 2019).

726 Finally, to assess whether there were any specific biological functions that were 727 significantly over-represented on genes located in regions identified as undergoing 728 either positive (506 genes) or long-term balancing selection (32 genes), we performed 729 gene ontology (GO) enrichment analysis. We did not detect over-representation for any 730 functional category among the candidate genes under long-term balancing selection. In 731 contrast, we identified 31 significantly enriched GO categories (Fisher's exact test, 732 P < 0.01) for genes under positive selection (Table S23). These GO clusters were 733 primarily associated with metabolic processes (DNA, nucleic acid, cellular 734 macromolecule and aromatic compound, molybdopterin confactor), biosynthetic 735 processes (molybdopterin confactor, vitamin B6), cell morphogenesis and gene 736 expression regulation. Together these functional clusters are biologically relevant for 737 plant adaptation, because the biosynthesis of a panoply of diverse natural chemicals 738 serve as important adaptive strategies for sessile long-lived trees to adapt to 739 ever-changing abiotic and biotic environments (Weng, 2014).

740

### 741 **4. Discussion**

Much of our knowledge of how genomic landscape builds in the speciation process is drawn from studies focusing on two young species pairs with ongoing gene flow. Very few examples of now-allopatric species pairs along the speciation continuum have been

745 investigated. Here, we focus our research on four widespread *Populus* species that are 746 allopatrically distributed in northern Hemisphere. After characterizing their speciation 747 and demographic histories, we find that species in different continent exhibited 748 idiosyncratic responses to Pleistocene climate changes. In addition, ancient gene flow 749 was detected between extant Eurasian and North American aspen species (P. tremula 750 and P. tremuloides). We also investigated the evolutionary forces that have shaped 751 genome-wide patterns of variations within and between species. Our results have found 752 substantial variation in genetic diversity, divergence, species relationships and the 753 extent of introgression along the genome. Variation in these patterns is predictable and 754 can be largely explained by genome-wide variation in the strength and extent of both 755 recent and ancient selection, which depends on the recombination rate and the local 756 density of functional sites. Our findings therefore provide evidence of how recurrent 757 selection interacts with genomic features to shape the genomic landscape during species 758 divergence. We further demonstrate that not only background selection, positive and 759 long-term balancing selection also play crucial roles in shaping genomic variation and 760 phylogenetic relationship among the recently diverged aspen species. Overall, this study 761 highlights the striking impacts of natural selection in shaping within- and between-762 species genomic variation through speciation.

763

### 764 Acknowlegements

All analyses were performed on resources provided by the Swedish National
Infrastructure for Computing (SNIC) at Uppsala Multidisciplinary Center for Advanced
Computational Science (UPPMAX ) under the projects SNIC2016-7-89 and SNIC
2017/1-499. Financial support was provided by National Natural Science Foundation of
China (31971567) and the Fundamental Research Funds for the Central Universities.

| 770        |  |
|------------|--|
| 771        | References   |
| 772        |  |
| 773        | Abbott, R., Albach, D., Ansell, S., Arntzen, J. W., Baird, S. J., Bierne, N., Buggs, R.  |
| 774        | (2013). Hybridization and speciation. Journal of Evolutionary Biology, 26(2),  |
| 775        | 229-246.   |
| 776        | Al-Shahrour, F., Minguez, P., Marqués-Bonet, T., Gazave, E., Navarro, A., & Dopazo,  |
| 777        | J. (2010). Selection upon genome architecture: conservation of functional  |
| 778        | neighborhoods with changing genes. PLoS Computational Biology, 6(10),  |
| 779        | e1000953.  |
| 780        | Alexa, A., & Rahnenführer, J. (2009). Gene set enrichment analysis with topGO.   |
| 781        | Bioconductor Improv, 27.   |
| 782        | Bai, W. N., Yan, P. C., Zhang, B. W., Woeste, K. E., Lin, K., & Zhang, D. Y. (2018).   |
| 783        | Demographically idiosyncratic responses to climate change and rapid  |
| 784        | Pleistocene diversification of the walnut genus Juglans (Juglandaceae) revealed  |
| 785        | by whole-genome sequences. New Phytologist, 217(4), 1726-1736.   |
| 786        | Begun, D. J., & Aquadro, C. F. (1992). Levels of naturally occurring DNA   |
| 787        | polymorphism correlate with recombination rates in D. melanogaster. <i>Nature</i> ,  |
| 788        | 356(6369), 519.  |
| 789        | Browning, B. L., & Browning, S. R. (2009). A unified approach to genotype imputation   |
| 790        | and haplotype-phase inference for large data sets of trios and unrelated   |
| 791        | individuals. The American Journal of Human Genetics, 84(2), 210-223.   |
| 792        | Browning, B. L., & Browning, S. R. (2013). Improving the accuracy and efficiency of  |
| 793        | identity-by-descent detection in population data. Genetics, 194(2), 459-471.   |
| 794        | Burri, R. (2017). Interpreting differentiation landscapes in the light of long-term linked   |
| 795        | selection. Evolution Letters, 1(3), 118-131.   |
| 796        | Burri, R., Nater, A., Kawakami, T., Mugal, C. F., Olason, P. I., Smeds, L.,  |
| 797        | Garamszegi, L. Z. (2015). Linked selection and recombination rate variation  |
| 798        | drive the evolution of the genomic landscape of differentiation across the   |
| 799        | speciation continuum of Ficedula flycatchers. Genome Research, 25(11),   |
| 800        | 1656-1665.   |
| 801        | Chan, A. H., Jenkins, P. A., & Song, Y. S. (2012). Genome-wide fine-scale  |
| 802<br>803 | recombination rate variation in Drosophila melanogaster. <i>PLoS Genetics</i> , 8(12),   |
| 803        | e1003090.<br>Charlesworth P (1008) Measures of divergence between populations and the effect of  |
| 805        | Charlesworth, B. (1998). Measures of divergence between populations and the effect of forces that reduce variability. <i>Molecular Biology and Evolution</i> , <i>15</i> (5), 538-543. |
| 806        | Charlesworth, B. (2012). The effects of deleterious mutations on evolution at linked   |
| 807        | sites. <i>Genetics</i> , 190(1), 5-22.   |
| 808        | Charlesworth, B., Morgan, M., & Charlesworth, D. (1993). The effect of deleterious   |
| 809        | mutations on neutral molecular variation. <i>Genetics</i> , 134(4), 1289-1303.   |
| 810        | Charlesworth, D. (2006). Balancing selection and its effects on sequences in nearby  |
| 811        | genome regions. PLoS Genetics, 2(4), e64.  |
| 812        | Comeron, J. M., Williford, A., & Kliman, R. (2008). The Hill-Robertson effect:   |
| 813        | evolutionary consequences of weak selection and linkage in finite populations.   |
| 814        | Heredity, 100(1), 19.  |
| 815        | Cruickshank, T. E., & Hahn, M. W. (2014). Reanalysis suggests that genomic islands of  |
| 816        | speciation are due to reduced diversity, not reduced gene flow. Molecular  |
| 817        | <i>Ecology</i> , <i>23</i> (13), 3133-3157.  |

| 818        | Cutter, A. D., & Payseur, B. A. (2013). Genomic signatures of selection at linked sites:                              |
|------------|---|
| 819        | unifying the disparity among species. <i>Nature Reviews Genetics</i> , 14(4), 262.                                    |
| 820        | Danecek, P., Auton, A., Abecasis, G., Albers, C. A., Banks, E., DePristo, M. A.,                                      |
| 821        | Sherry, S. T. (2011). The variant call format and VCFtools. Bioinformatics,   |
| 822        | 27(15), 2156-2158.  |
| 823        | DeGiorgio, M., Huber, C. D., Hubisz, M. J., Hellmann, I., & Nielsen, R. (2016).                                       |
| 824        | SweepFinder2: increased sensitivity, robustness and flexibility. Bioinformatics,                                      |
| 825        | 32(12), 1895-1897.  |
| 826        | Degnan, J. H., & Salter, L. A. (2005). Gene tree distributions under the coalescent                                   |
| 827        | process. <i>Evolution</i> , 59(1), 24-37.   |
| 828        | Delmore, K. E., Lugo Ramos, J. S., Van Doren, B. M., Lundberg, M., Bensch, S., Irwin,                                 |
| 829        | D. E., & Liedvogel, M. (2018). Comparative analysis examining patterns of   |
| 830        | genomic differentiation across multiple episodes of population divergence in  |
| 831        | birds. Evolution Letters, 2(2), 76-87.  |
| 832        | DePristo, M. A., Banks, E., Poplin, R., Garimella, K. V., Maguire, J. R., Hartl, C.,                                  |
| 833        | Hanna, M. (2011). A framework for variation discovery and genotyping using  |
| 834        | next-generation DNA sequencing data. <i>Nature Genetics</i> , 43(5), 491.   |
| 835        | Du, S., Wang, Z., Ingvarsson, P. K., Wang, D., Wang, J., Wu, Z., Zhang, J. (2015).                                    |
| 836        | Multilocus analysis of nucleotide variation and speciation in three closely   |
| 837        | related P opulus (S alicaceae) species. <i>Molecular Ecology</i> , 24(19), 4994-5005.                                 |
| 838        | Durand, E. Y., Patterson, N., Reich, D., & Slatkin, M. (2011). Testing for ancient                                    |
| 839        | admixture between closely related populations. Molecular Biology and  |
| 840        | Evolution, 28(8), 2239-2252.  |
| 841        | Dutheil, J. Y., Munch, K., Nam, K., Mailund, T., & Schierup, M. H. (2015). Strong                                     |
| 842        | selective sweeps on the X chromosome in the human-chimpanzee ancestor   |
| 843        | explain its low divergence. <i>PLoS Genetics</i> , 11(8), e1005451.   |
| 844        | Eckenwalder, J. E. (1996). Systematics and evolution of Populus. <i>Biology of Populus</i>                            |
| 845        | and its Implications for Management and Conservation, 7, 32.  |
| 846        | Edwards, S., & Beerli, P. (2000). Perspective: gene divergence, population divergence,                                |
| 847        | and the variance in coalescence time in phylogeographic studies. <i>Evolution</i> ,                                   |
| 848        | 54(6), 1839-1854.   |
| 849        | Ellegren, H., & Galtier, N. (2016). Determinants of genetic diversity. <i>Nature Reviews</i>                          |
| 850<br>951 | Genetics, 17(7), 422.   |
| 851        | Excoffier, L., Dupanloup, I., Huerta-Sánchez, E., Sousa, V. C., & Foll, M. (2013).                                    |
| 852<br>852 | Robust demographic inference from genomic and SNP data. <i>PLoS Genetics</i> , 0(10) - 1002005                        |
| 853<br>954 | 9(10), e1003905.<br>Eader L L Even S D & Novil D (2012) The companies of  |
| 854<br>855 | Feder, J. L., Egan, S. P., & Nosil, P. (2012). The genomics of  |
| 855<br>856 | speciation-with-gene-flow. <i>Trends in Genetics</i> , 28(7), 342-350.  |
| 856<br>857 | Flaxman, S. M., Wacholder, A. C., Feder, J. L., & Nosil, P. (2014). Theoretical models                                |
| 858        | of the influence of genomic architecture on the dynamics of speciation. <i>Molecular Ecology</i> , 23(16), 4074-4088. |
| 859        | Flowers, J. M., Molina, J., Rubinstein, S., Huang, P., Schaal, B. A., & Purugganan, M.                                |
| 860        | D. (2011). Natural selection in gene-dense regions shapes the genomic pattern of                                      |
| 861        | polymorphism in wild and domesticated rice. <i>Molecular Biology and Evolution</i> ,                                  |
| 862        | 29(2), 675-687.   |
| 863        | Fontaine, M. C., Pease, J. B., Steele, A., Waterhouse, R. M., Neafsey, D. E., Sharakhov,                              |
| 864        | I. V., Kakani, E. (2015). Extensive introgression in a malaria vector species   |
| 865        | complex revealed by phylogenomics. <i>Science</i> , <i>347</i> (6217), 1258524.                                       |
| 500        | complex revealed of phylogenomics. selence, 577 (0217), 1250524.  |

| 866<br>867 | Fumagalli, M., Vieira, F. G., Korneliussen, T. S., Linderoth, T., Huerta-Sánchez, E.,<br>Albrechtsen, A., & Nielsen, R. (2013). Quantifying population genetic |
|------------|--|
| 868        | differentiation from next-generation sequencing data. Genetics, 195(3), 979-992.   |
| 869        | Fumagalli, M., Vieira, F. G., Linderoth, T., & Nielsen, R. (2014). ngsTools: methods   |
| 870        | for population genetics analyses from next-generation sequencing data.   |
| 871        | Bioinformatics, 30(10), 1486-1487.   |
| 872        | Gao, Z., Przeworski, M., & Sella, G. (2015). Footprints of ancient-balanced  |
| 873        | polymorphisms in genetic variation data from closely related species. Evolution,   |
| 874        | <i>69</i> (2), 431-446.  |
| 875        | Green, R. E., Krause, J., Briggs, A. W., Maricic, T., Stenzel, U., Kircher, M., Fritz,   |
| 876        | M. HY. (2010). A draft sequence of the Neandertal genome. Science,   |
| 877        | 328(5979), 710-722.  |
| 878        | Guerrero, R. F., & Hahn, M. W. (2017). Speciation as a sieve for ancestral   |
| 879        | polymorphism. Molecular Ecology, 26(20), 5362-5368.  |
| 880        | Hamzeh, M., & Dayanandan, S. (2004). Phylogeny of Populus (Salicaceae) based on  |
| 881        | nucleotide sequences of chloroplast TRNT-TRNF region and nuclear rDNA.   |
| 882        | American Journal of Botany, 91(9), 1398-1408.  |
| 883        | Han, F., Lamichhaney, S., Grant, B. R., Grant, P. R., Andersson, L., & Webster, M. T.  |
| 884        | (2017). Gene flow, ancient polymorphism, and ecological adaptation shape the   |
| 885        | genomic landscape of divergence among Darwin's finches. Genome Research,   |
| 886        | 27(6), 1004-1015.  |
| 887        | Harris, K., & Nielsen, R. (2016). The genetic cost of Neanderthal introgression.   |
| 888        | Genetics, 203(2), 881-891.   |
| 889        | Hart, J., De Araujo, F., Thomas, B., & Mansfield, S. (2013). Wood quality and growth   |
| 890        | characterization across intra-and inter-specific hybrid aspen clones. Forests,   |
| 891        | 4(4), 786-807.   |
| 892        | Hobolth, A., Dutheil, J. Y., Hawks, J., Schierup, M. H., & Mailund, T. (2011).   |
| 893        | Incomplete lineage sorting patterns among human, chimpanzee, and orangutan   |
| 894        | suggest recent orangutan speciation and widespread selection. Genome   |
| 895        | Research, 21(3), 349-356.  |
| 896        | Hudson, R. R., & Kaplan, N. L. (1995). Deleterious background selection with   |
| 897        | recombination. <i>Genetics</i> , 141(4), 1605-1617.  |
| 898        | Hurst, L. D., Pál, C., & Lercher, M. J. (2004). The evolutionary dynamics of eukaryotic  |
| 899        | gene order. Nature Reviews Genetics, 5(4), 299.  |
| 900        | Jansson, S., & Douglas, C. J. (2007). Populus: a model system for plant biology. Annual  |
| 901        | Review of Plant Biology, 58, 435-458.  |
| 902        | Kaplan, N. L., Hudson, R., & Langley, C. (1989). The" hitchhiking effect" revisited.   |
| 903        | Genetics, 123(4), 887-899.   |
| 904        | Koch, M. A., Haubold, B., & Mitchell-Olds, T. (2000). Comparative evolutionary   |
| 905        | analysis of chalcone synthase and alcohol dehydrogenase loci in Arabidopsis,   |
| 906        | Arabis, and related genera (Brassicaceae). Molecular Biology and Evolution,  |
| 907        | 17(10), 1483-1498.   |
| 908        | Korneliussen, T. S., Albrechtsen, A., & Nielsen, R. (2014). ANGSD: analysis of next  |
| 909        | generation sequencing data. BMC Bioinformatics, 15(1), 356.  |
| 910        | Lamichhaney, S., Berglund, J., Almén, M. S., Maqbool, K., Grabherr, M.,  |
| 911        | Martinez-Barrio, A., Zamani, N. (2015). Evolution of Darwin's finches and  |
| 912        | their beaks revealed by genome sequencing. <i>Nature</i> , 518(7539), 371.   |
|            |  |

- Lee, T.-H., Guo, H., Wang, X., Kim, C., & Paterson, A. H. (2014). SNPhylo: a pipeline
  to construct a phylogenetic tree from huge SNP data. *BMC Genomics*, 15(1),
  162.
- Li, H. (2013). Aligning sequence reads, clone sequences and assembly contigs with
   BWA-MEM. *arXiv:1303.3997*.
- Li, H., & Durbin, R. (2009). Fast and accurate short read alignment with
  Burrows–Wheeler transform. *Bioinformatics*, 25(14), 1754-1760.
- Li, H., Handsaker, B., Wysoker, A., Fennell, T., Ruan, J., Homer, N., . . . Durbin, R.
  (2009). The sequence alignment/map format and SAMtools. *B* ioinformatics, 25(16), 2078-2079.
- Lin, Y.-C., Wang, J., Delhomme, N., Schiffthaler, B., Sundström, G., Zuccolo, A., ...
  Cossu, R. M. (2018). Functional and evolutionary genomic inferences in
  Populus through genome and population sequencing of American and European
  aspen. *Proceedings of the National Academy of Sciences, 115*(46),
  E10970-E10978.
- Lohmueller, K. E., Albrechtsen, A., Li, Y., Kim, S. Y., Korneliussen, T., Vinckenbosch,
  N., . . . Grarup, N. (2011). Natural selection affects multiple aspects of genetic
  variation at putatively neutral sites across the human genome. *PLoS Genetics*,
  7(10), e1002326.
- Lohse, M., Bolger, A. M., Nagel, A., Fernie, A. R., Lunn, J. E., Stitt, M., & Usadel, B.
  (2012). R obi NA: A user-friendly, integrated software solution for
  RNA-Seq-based transcriptomics. *Nucleic Acids Research*, 40(W1),
  W622-W627.
- Ma, T., Wang, K., Hu, Q., Xi, Z., Wan, D., Wang, Q., . . . Abbott, R. J. (2018). Ancient
  polymorphisms and divergence hitchhiking contribute to genomic islands of
  divergence within a poplar species complex. *Proceedings of the National Academy of Sciences*, 115(2), E236-E243.
- Mailund, T., Munch, K., & Schierup, M. H. (2014). Lineage sorting in apes. *Annual Review of Genetics*, 48, 519-535.
- Martin, S. H., Davey, J. W., & Jiggins, C. D. (2014). Evaluating the use of
  ABBA–BABA statistics to locate introgressed loci. *Molecular Biology and Evolution*, 32(1), 244-257.
- Martin, S. H., Davey, J. W., Salazar, C., & Jiggins, C. D. (2019). Recombination rate
  variation shapes barriers to introgression across butterfly genomes. *PLoS Biology*, 17(2), e2006288.
- Martin, S. H., & Van Belleghem, S. M. (2017). Exploring evolutionary relationships
  across the genome using topology weighting. *Genetics*, 206(1), 429-438.
- Matthey-Doret, R., & Whitlock, M. C. (2019). Background selection and FST:
  consequences for detecting local adaptation. *Molecular Ecology*. doi: 10.1111/mec.15197.
- McVicker, G., Gordon, D., Davis, C., & Green, P. (2009). Widespread genomic
  signatures of natural selection in hominid evolution. *PLoS Genetics*, 5(5),
  e1000471.
- Meisel, R. P., & Connallon, T. (2013). The faster-X effect: integrating theory and data.
   *Trends in genetics, 29*(9), 537-544.
- Munch, K., Nam, K., Schierup, M. H., & Mailund, T. (2016). Selective sweeps across
  twenty millions years of primate evolution. *Molecular Biology and Evolution*, 33(12), 3065-3074.
- Nachman, M. W., & Payseur, B. A. (2012). Recombination rate variation and
   speciation: theoretical predictions and empirical results from rabbits and mice.

| 963<br>964 | Philosophical Transactions of the Royal Society B: Biological Sciences, 367(1587), 409-421.                                   |
|------------|---|
| 965        | Nadachowska-Brzyska, K., Burri, R., Olason, P. I., Kawakami, T., Smeds, L., &   |
| 966        | Ellegren, H. (2013). Demographic divergence history of pied flycatcher and  |
| 967        | collared flycatcher inferred from whole-genome re-sequencing data. <i>PLoS</i>  |
| 968        | <i>Genetics</i> , 9(11), e1003942.  |
| 969        | Nadeau, N. J., Whibley, A., Jones, R. T., Davey, J. W., Dasmahapatra, K. K., Baxter, S.                                       |
| 970        | W., Blaxter, M. L. (2012). Genomic islands of divergence in hybridizing   |
| 971        | Heliconius butterflies identified by large-scale targeted sequencing.   |
| 972        | Philosophical Transactions of the Royal Society B: Biological Sciences,   |
| 973        | 367(1587), 343-353.   |
| 974        | Neale, D. B., & Ingvarsson, P. K. (2008). Population, quantitative and comparative  |
| 975        | genomics of adaptation in forest trees. Current opinion in plant biology, 11(2),  |
| 976        | 149-155.  |
| 977        | Neale, D. B., & Kremer, A. (2011). Forest tree genomics: growing resources and  |
| 978<br>070 | applications. <i>Nature Reviews Genetics</i> , 12(2), 111.  |
| 979        | Nielsen, R., Korneliussen, T., Albrechtsen, A., Li, Y., & Wang, J. (2012). SNP calling,                                       |
| 980<br>981 | genotype calling, and sample allele frequency estimation from new-generation sequencing data. <i>PloS One</i> , 7(7), e37558. |
| 981<br>982 | Nordborg, M., Hu, T. T., Ishino, Y., Jhaveri, J., Toomajian, C., Zheng, H., Goyal, R.   |
| 983        | (2005). The pattern of polymorphism in Arabidopsis thaliana. <i>PLoS Biology</i> ,  |
| 984        | 3(7), e196.   |
| 985        | Nosil, P., Funk, D. J., & Ortiz-Barrientos, D. (2009). Divergent selection and  |
| 986        | heterogeneous genomic divergence. Molecular Ecology, 18(3), 375-402.  |
| 987        | Pamilo, P., & Nei, M. (1988). Relationships between gene trees and species trees.   |
| 988        | Molecular Biology and Evolution, 5(5), 568-583.   |
| 989        | Patterson, N., Price, A. L., & Reich, D. (2006). Population structure and eigenanalysis.                                      |
| 990        | PLoS Genetics, 2(12), e190.   |
| 991        | Pease, J. B., & Hahn, M. W. (2013). More accurate phylogenies inferred from low-  |
| 992        | recombination regions in the presence of incomplete lineage sorting. Evolution,   |
| 993        | 67(8), 2376-2384.   |
| 994        | Phung, T. N., Huber, C. D., & Lohmueller, K. E. (2016). Determining the effect of   |
| 995        | natural selection on linked neutral divergence across species. <i>PLoS Genetics</i> , 12(0) 100(100)                          |
| 996<br>007 | 12(8), e1006199.  |
| 997<br>998 | Prüfer, K., Munch, K., Hellmann, I., Akagi, K., Miller, J. R., Walenz, B., Winer, R.  |
| 998<br>999 | (2012). The bonobo genome compared with the chimpanzee and human genomes. <i>Nature</i> , 486(7404), 527.                     |
| 1000       | Ravinet, M., Faria, R., Butlin, R., Galindo, J., Bierne, N., Rafajlović, M., Westram,   |
| 1000       | A. (2017). Interpreting the genomic landscape of speciation: a road map for   |
| 1002       | finding barriers to gene flow. Journal of Evolutionary Biology, 30(8),  |
| 1003       | 1450-1477.  |
| 1004       | Ravinet, M., Yoshida, K., Shigenobu, S., Toyoda, A., Fujiyama, A., & Kitano, J.   |
| 1005       | (2018). The genomic landscape at a late stage of stickleback speciation: High   |
| 1006       | genomic divergence interspersed by small localized regions of introgression.  |
| 1007       | PLoS Genetics, 14(5), e1007358.   |
| 1008       | Sankararaman, S., Mallick, S., Dannemann, M., Prüfer, K., Kelso, J., Pääbo, S.,   |
| 1009       | Reich, D. (2014). The genomic landscape of Neanderthal ancestry in present-day  |
| 1010       | humans. Nature, 507(7492), 354.   |

| 1011 | Sankararaman, S., Mallick, S., Patterson, N., & Reich, D. (2016). The combined           |
|------|--|
| 1012 | landscape of Denisovan and Neanderthal ancestry in present-day humans.                   |
| 1013 | <i>Current Biology</i> , 26(9), 1241-1247.   |
| 1014 | Scally, A., Dutheil, J. Y., Hillier, L. W., Jordan, G. E., Goodhead, I., Herrero, J.,    |
| 1015 | Marques-Bonet, T. (2012). Insights into hominid evolution from the gorilla               |
| 1016 | genome sequence. <i>Nature</i> , 483(7388), 169.   |
| 1017 | Schiffels, S., & Durbin, R. (2014). Inferring human population size and separation       |
| 1018 | history from multiple genome sequences. Nature Genetics, 46(8), 919.                     |
| 1019 | Schumer, M., Cui, R., Powell, D. L., Rosenthal, G. G., & Andolfatto, P. (2016). Ancient  |
| 1020 | hybridization and genomic stabilization in a swordtail fish. Molecular Ecology,          |
| 1021 | 25(11), 2661-2679.   |
| 1022 | Seehausen, O., Butlin, R. K., Keller, I., Wagner, C. E., Boughman, J. W., Hohenlohe, P.  |
| 1023 | A., Brännström, Å. (2014). Genomics and the origin of species. Nature                    |
| 1024 | Reviews Genetics, 15(3), 176.  |
| 1025 | Siewert, K. M., & Voight, B. F. (2017). Detecting long-term balancing selection using    |
| 1026 | allele frequency correlation. Molecular biology and evolution, 34(11),                   |
| 1027 | 2996-3005.   |
| 1028 | Smith, J. M., & Haigh, J. (1974). The hitch-hiking effect of a favourable gene. Genetics |
| 1029 | <i>Research</i> , 23(1), 23-35.  |
| 1030 | Stamatakis, A. (2014). RAxML version 8: a tool for phylogenetic analysis and             |
| 1031 | post-analysis of large phylogenies. <i>Bioinformatics</i> , 30(9), 1312-1313.            |
| 1032 | Stankowski, S., Chase, M. A., Fuiten, A. M., Rodrigues, M. F., Ralph, P. L., &           |
| 1033 | Streisfeld, M. A. (2019). Widespread selection and gene flow shape the genomic           |
| 1034 | landscape during a radiation of monkeyflowers. PLoS Biology, 17(7), e3000391.            |
| 1035 | Tarailo-Graovac, M., & Chen, N. (2009). Using RepeatMasker to identify repetitive        |
| 1036 | elements in genomic sequences. Current Protocols in Bioinformatics, 25(1),               |
| 1037 | 4.10. 11-14.10. 14.  |
| 1038 | Turner, T. L., Hahn, M. W., & Nuzhdin, S. V. (2005). Genomic islands of speciation in    |
| 1039 | Anopheles gambiae. PLoS Biology, 3(9), e285.   |
| 1040 | Tuskan, G. A., Difazio, S., Jansson, S., Bohlmann, J., Grigoriev, I., Hellsten, U.,      |
| 1041 | Salamov, A. (2006). The genome of black cottonwood, Populus trichocarpa                  |
| 1042 | (Torr. & Gray). Science, 313(5793), 1596-1604.   |
| 1043 | Van Doren, B. M., Campagna, L., Helm, B., Illera, J. C., Lovette, I. J., & Liedvogel, M. |
| 1044 | (2017). Correlated patterns of genetic diversity and differentiation across an           |
| 1045 | avian family. <i>Molecular Ecology</i> , 26(15), 3982-3997.                              |
| 1046 | Vicoso, B., & Charlesworth, B. (2006). Evolution on the X chromosome: unusual            |
| 1047 | patterns and processes. Nature Reviews Genetics, 7(8), 645.                              |
| 1048 | Vijay, N., Weissensteiner, M., Burri, R., Kawakami, T., Ellegren, H., & Wolf, J. B.      |
| 1049 | (2017). Genomewide patterns of variation in genetic diversity are shared among           |
| 1050 | populations, species and higher-order taxa. Molecular Ecology, 26(16),                   |
| 1051 | 4284-4295.   |
| 1052 | Wang, B., Mojica, J. P., Perera, N., Lee, CR., Lovell, J. T., Sharma, A., Rokhsar,       |
| 1053 | D. S. (2019). Ancient polymorphisms contribute to genome-wide variation by               |
| 1054 | long-term balancing selection and divergent sorting in Boechera stricta. Genome          |
| 1055 | <i>Biology</i> , 20(1), 126.   |
| 1056 | Wang, J., Street, N. R., Scofield, D. G., & Ingvarsson, P. K. (2016a). Natural selection |
| 1057 | and recombination rate variation shape nucleotide polymorphism across the                |
| 1058 | genomes of three related Populus species. Genetics, 202(3), 1185-1200.                   |

- Wang, J., Street, N. R., Scofield, D. G., & Ingvarsson, P. K. (2016b). Variation in
  linked selection and recombination drive genomic divergence during allopatric
  speciation of European and American aspens. *Molecular Biology and Evolution*,
  33(7), 1754-1767.
- 1063 Weng, J. K. (2014). The evolutionary paths towards complexity: a metabolic 1064 perspective. *New Phytologist*, 201(4), 1141-1149.
- Wolf, J. B., & Ellegren, H. (2017). Making sense of genomic islands of differentiation
   in light of speciation. *Nature Reviews Genetics*, 18(2), 87.
- Wu, C. I. (2001). The genic view of the process of speciation. *Journal of Evolutionary Biology*, 14(6), 851-865.
- Yin, T., DiFazio, S. P., Gunter, L. E., Zhang, X., Sewell, M. M., Woolbright, S. A., ...
  Wang, M. (2008). Genome structure and emerging evidence of an incipient sex chromosome in Populus. *Genome Research*, 18(3), 422-430.

1072

1074

- 1073 Data Accessibility Statement
- 1075 Raw whole genome resequencing data generated for this study have been deposited in 1076 the NCBI short read archive under accession number PRJNA576115

1077

### 1078 Author Contributions

1079

1080 J.W. conceived the study, analyzed the data and wrote the manuscript. E.J.P. provided 1081 the materials of *P. davidiana* used in this study. N.R.S., J.L., P.K.I. read and 1082 commented on the manuscript. All authors approved the final manuscript.

### 1083 Figure legends:

10841085 Figure 1. Phylogenetic and population genetic analyses of four *Populus* species. (A) 1086 Sampling locations (black circle) of eight individuals from each of the four Populus 1087species included in this study. Species ranges for P. tremula, P. davidiana, P. 1088 tremuloides and P. trichocarpa are indicated by red, green, blue and purple shading, 1089 respectively. (B) Maximum-likelihood phylogenetic tree reconstructed based on 1090 complete chloroplast sequences. Color scheme for the four species is the same in A-C. 1091 (C) Historical effective population size of the four *Populus* species inferred using 1092 MSMC v2 based on sets of eight haplotypes, with solid lines representing medians and 1093 shading representing  $\pm$  standard deviation calculated across pairs of haplotypes. Yellow 1094 bar indicates Early Pleistocene cooling; Glacial and interglacial periods of the Late and 1095 Middle Pleistocene are indicated by dark and light grey bars, respectively; black bar 1096 indicates the period of Last Glacial Maximum (LGM). (D) Schematic of demographic 1097 scenarios of the three aspen species modeled using fastsimcoal2. The ancestral 1098 population is shown in light and dark grey respectively for different ancestral lineages. 1099 P. tremula is in red, P. davidiana is in green, and P. tremuloides is in blue. The arrows 1100 indicate the per generation migration rate (m) between species. Estimated divergence 1101 time, effective population size, and gene flow are detailed in Supplementary Table S7. 1102 1103 Figure 2. Genome-wide landscape of genetic diversity and divergence within and 1104 between species. (A) Chromosomal landscape of (a) the density of coding sequences 1105 (CD); (b) nucleotide diversity ( $\pi$ ); (c) recombination rate ( $\rho$ ); (d) the relative measure of 1106 genetic divergence ( $F_{ST}$ ) and (e) the absolute measure of genetic divergence ( $d_{xy}$ ). (B) 1107 Distribution of correlation coefficients (Spearman's  $\rho$ ) shown as violin plots for 1108 population summary statistics characterizing genomic features (neutral mutation rate  $\mu$ ) and variation within  $(\pi, \rho)$  and between species  $(F_{ST}, d_{xy})$  calculated at 100 Kbp 1109 1110 windows. Subscripts 'i, j' symbolize all possible combinations of correlations between 1111 two species i=1...(n-1) and j=(i+1)...n for within-species measures; Capital letters 'I, J' 1112 symbolize inter-species statistics. Correlations exclude pseudo-replicated species 1113 comparisons. Detailed information can be found in Supplementary Table S11. 1114 1115 Figure 3. Heterogeneous distribution of phylogenies in three aspen species. 1116 Chromoplots for 19 chromosomes show the distribution of three possible rooted 1117 phylogenetic relationships inferred from 100 Kbp genomic regions for *P. tremula* (*P.* 1118 tra), P. davidiana (P. dav) and P. tremuloides (P. trs), with P. trichocarpa as outgroup 1119 species. The colored vertical bars represent the windows with complete monophyly of 1120 the three alternative topologies as shown in the lower right, where the proportion of the

three topologies in 100 Kbp and 10 Kbp (in parenthesis) across the genome are also
shown. Across all chromosomes, the *D* statistic generally tends toward positive values,
indicating ancient introgression between *P. tra* and *P. trs* may have been occurring
across the genome.

1125

1126 **Figure 4. Widespread impact of linked selection.** Relationship between

1127 recombination rate (blue), coding density (red) and (A) genetic diversity, (B)  $F_{ST}$ , (C)

1128 d<sub>xy</sub>, (D) incomplete lineage sorting (ILS), (E) weighting of the 'species' tree ([*P. tra*, *P.* 

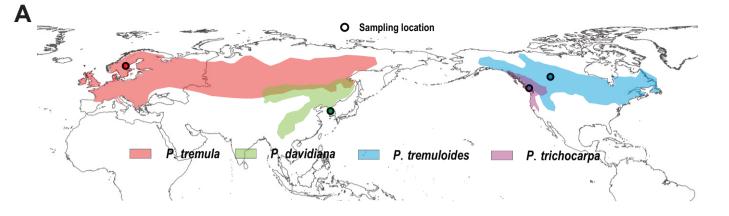
1129 dav], *P. trs*)) and (F) the estimated admixture proportion ( $f_d$ ) between *P. tra* and *P. trs*.

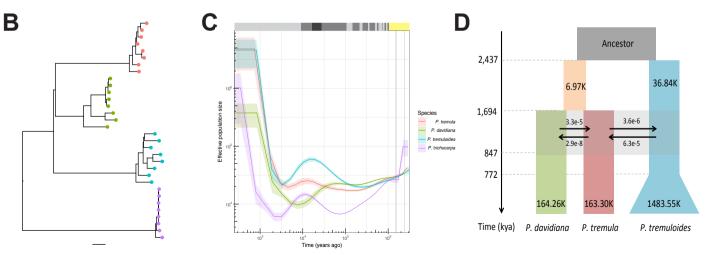
1130 Quantile binning is for visualization. The points and error bars indicate the means and

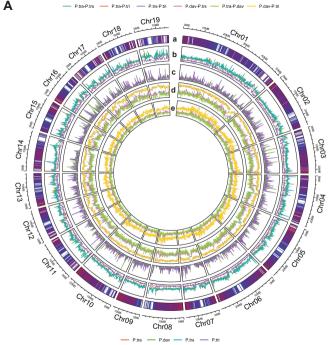
- 1131 1.96×standard errors. Statistical tests were performed on the unbinned data and detailed
- 1132 correlation coefficients are shown in supplementary Table S15-Table S22.

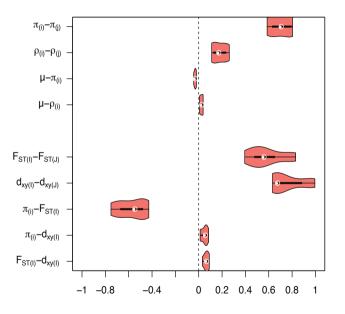
1133

1134 **Figure 5. Identification of positive selection.** (A) Positive selection analysis by 1135 SweepFinder2 reveals windows that are candidates for being under positive selection in 1136 the three aspen species: P. tremula (P. tra), P. davidiana (P. dav) and P. tremuloides (P. 1137 trs). Horizonal red line indicates the cut-off of composite likelihood ratio (CLR) 1138 statistics. (B) The Venn diagram represents shared and unique selected windows 1139 detected in the three species. (C) Comparison of genetic diversity, recombination rate, 1140  $F_{\rm ST}$ , d<sub>xy</sub>, and average weightings of the 'species' topology between candidate regions 1141 under positive selection (red boxes) and genomic background (grey boxes). (D) 1142 Comparison of incomplete lineage sorting (ILS) and the estimated admixture proportion 1143  $(f_d)$ ) between candidate regions under positive selection (red boxes) and genomic 1144 background (grey boxes). Asterisks designate significant differences between candidate 1145 positive selected regions and the rest of genomic regions by Mann-Whitney U-test (<sup>n.s.</sup> 1146 Not significant; \* P value<0.01; \*\* P value<0.001; \*\* *P* value <1e-4). 1147 1148 Figure 6. Identification of long-term balancing selection. (A) Signals of balancing 1149 selection across all chromosomes in the three aspen species: P. tremula (P. tra), P. 1150 davidiana (P. dav) and P. tremuloides (P. trs). Horizonal red line indicates the cut-off 1151of the  $\beta$  statistics. Only the signals detected in all three aspen species (red dots) were 1152considered as being under long-term balancing selection. (B) The Venn diagram 1153 represents shared and unique selected SNPs detected in the three species. (C) 1154 Comparison of genetic diversity, recombination rate,  $F_{ST}$ ,  $d_{xy}$ , and average weightings 1155 of the 'species' topology between candidate regions under long-term balancing 1156selection (red boxes) and genomic background (grey boxes). (D) Comparison of 1157 incomplete lineage sorting (ILS) and the estimated admixture proportion  $(f_d)$  between 1158 candidate regions under long-term balancing selection (red boxes) and genomic 1159background (grey boxes). Asterisks designate significant differences between candidate 1160 balancing selected regions and the rest of genomic regions by Mann-Whitney U-test (<sup>n.s.</sup> Not significant;  $^*P$  value<0.01;  $^{**}P$  value<0.001;  $^{***}P$  value<1e-4). 1161 1162

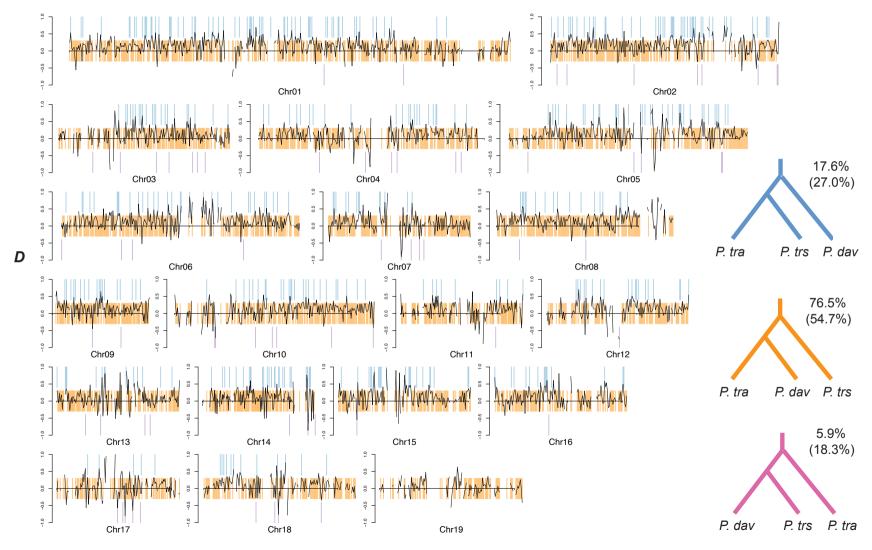




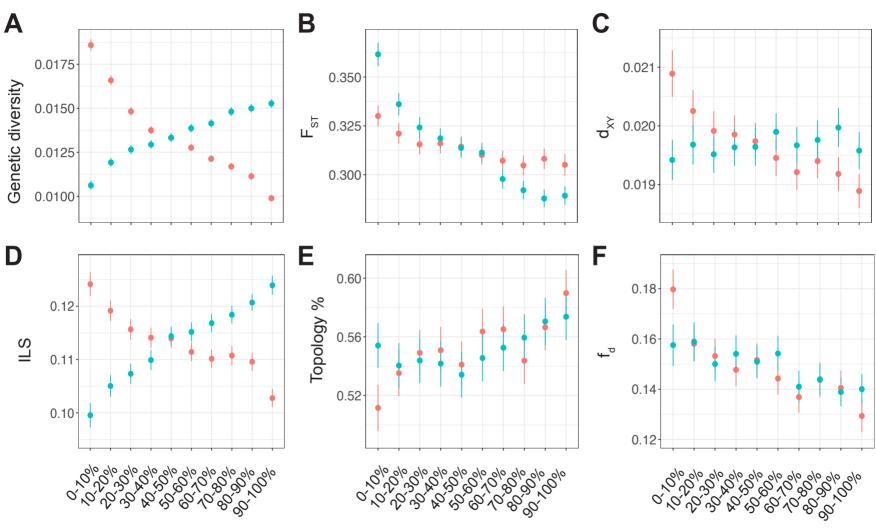




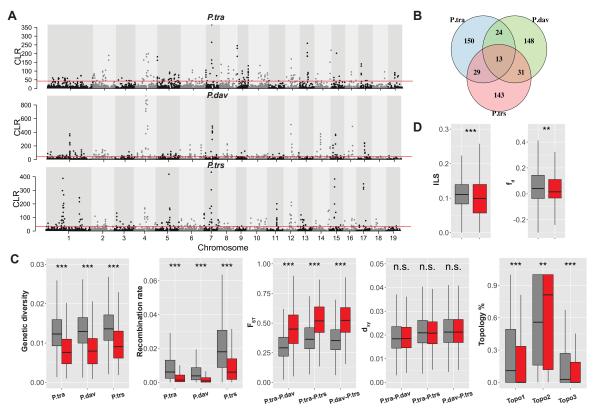
В

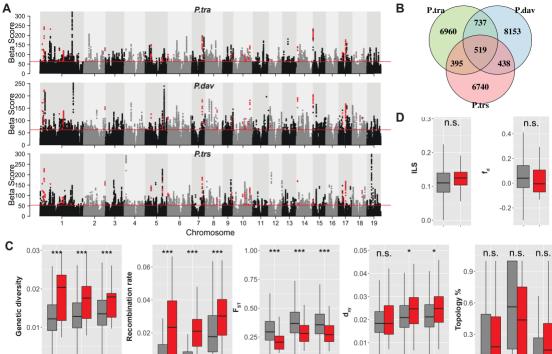


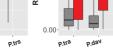
### 🔶 Coding density 🛛 🛉 Recombination rate



Percentile of coding density and recombination rate







P.trs

0.00

p.tra

P.dav



P.tra-P.dav

P.tra-P.trs



TOPO3