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# Evolution of sex-biased gene expression during transitions to separate sexes in the *Silene* genus

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### 46 Abstract

- 47 Sexual dimorphism is widespread among species with separate sexes and its extent is thought to be governed by the differential expression of thousands of genes between males 48 and females (known as Sex-Biased Genes, hereafter SBGs). SBGs have been studied in 49 numerous species, but rarely in a comparative way, which curtails our understanding of 50 their evolution, especially during multiple independent transitions to separate sexes. We 51 52 sequenced the transcriptomes of nine dioecious species, two gynodioecious species (separate females and hermaphrodites) and two hermaphrodite species from the Silene 53 genus. Our dataset provides access to three independent transitions to dioecy (dating from 54 less than 1 Myo to about 11 Myo). We demonstrated that male-biased expression emerges 55 first during a transition to separate sexes, later followed by female-biased genes. 56 Furthermore, we showed that, despite a mixture of selective regimes, positive selection 57 significantly affects the evolution of some SBGs. Overall, this study provides new insights 58 on the causes of SBG evolution during transitions to separate sexes. 59
- 60 Teaser

This study describes the evolution of sex-biased gene expression during a transition to separate sexes in plants.

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### 65 MAIN TEXT

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### 67 Introduction

Separate sexes (i.e. gonochorism in animals and dioecy in plants) is the sexual system of 95% of 69 animals and 5% of flowering plants (1-3). The differences in the phenotypes of males and 70 females (called sexual dimorphism) can affect the physiology, morphology, and other life history 71 traits (4–7). The strength of sexual dimorphism varies widely between species and can be more 72 important than phenotypic differences between individuals of the same sex (8). In several species 73 with genetic sex determination, only one or two genes are sufficient to determine the sex of 74 individuals (9, 10). The sex determining genes then lead to the activation of a regulatory cascade 75 where both transcription factors and hormones determine the differential expression of up to 76 thousands of genes between males and females. The genes that are differentially expressed 77 78 between males and females, the so-called Sex-Biased Genes (SBGs), are common in dioecious plants (from 2 to 17% of all expressed genes) and are distributed along the entire genome (11– 79 14). Sex-Biased Gene Expression (SBGE) has been extensively described in several animals and 80 to a lesser extent in some plant species (discussed in (8, 15)). Previous studies have shown that 81 82 the proportion of SBGs could vary significantly among tissues and developmental stages (7, 12,

83 *16*).

Despite numerous analyses of SBGE conducted to date, very few have been done in a comparative way. Therefore, the evolutionary forces at play remain an open question. For example, while a study in birds suggested that sexual selection (approximated by the intensity of sexual dimorphism) had driven the evolution of SBGE (17), converse results were found in cichlid fish (18), in the plant genus Leucadendron (19), and in brown algae (20), where genetic drift was likely to be the strongest evolutionary force driving SBGE. These studies question the common belief that the extent of sexual dimorphism is correlated to the number of SBGs (*8*).

In flowering plants, dioecy has evolved between 871 and 5,000 times independently (1), thus 91 providing an exceptional opportunity for comparative analyses. Transitions 92 from hermaphroditism to dioecy are thought to require an intermediate step, often through monoecy 93 (female and male flowers on the same plant) or through gynodioecy (separate female and 94 95 hermaphrodite individuals) (2, 10, 17–19). The latter assumes the invasion of the hermaphrodite population by a male-sterile (female) mutant, leading to gynodioecy (reviewed in (2)). Theoretical 96 97 work suggests that hermaphrodites in gynodioecious populations gain most of their reproductive success through their male function (17, 20, 21), the loss of the female function in these 98 99 individuals can be selected when it increases male fitness, which can lead to the evolution of dioecy. The steps to dioecy through the monoecious pathway have received less attention from 100 modellers so the precise events and the associated selective pressures are less well formalised 101 (22). To our knowledge, no comparative study has explored the evolution of SBGE in the 102 103 monoecy nor the gynodioecy pathway in plants.

The *Silene* genus is a model for studying the evolution of plant sexual systems (23, 24). At least 104 three independent transitions to dioecy have been reported in *Silene* (25-27). It is likely that these 105 transitions occurred through the gynodioecy pathway, as the genus contains many gynodioecious 106 species. Dioecy evolved ~11 My ago in the *Melandrium* section, consisting of five dioecious 107 species (S. latifolia, S. dioica, S. heuffelii, S. marizii and S. diclinis, (25, 28–30)). Dioecy is 108 probably younger in section Otites (~2.3 My; (27, 31, 32)) and likely of very recent origin in S. 109 acaulis ssp exscapa (less than 1 My, (26)). XY sex chromosomes share a common origin in the 110 Melandrium section (33). In the Otites section, S. otites has ZW sex chromosomes, while S. 111 pseudotites and S. colpophylla have XY sex chromosomes (27, 31). The ZW and XY systems 112 evolved from different autosomes, although the exact evolutionary history (possibly involving 113 introgression or turnover) is not known (27). So far, no sex chromosomes have been identified in 114 S. acaulis. If a non-recombining region exists in S. acaulis, it is likely to be very small and carry 115 116 only a few genes (34).

The repeated independent evolution of separate sexes with different ages of dioecy in *Silene* makes it an interesting model to study SBGE evolution in a comparative framework. So far SBGs have only been studied in *S. latifolia (12)*.

In this study, we characterise SBGE in the nine *Silene* dioecious species listed above (from the 120 three independent transitions to dioecy) and two gynodioecious Silene species (S. vulgaris and S. 121 *nutans*). We use two hermaphrodite outgroup species (S. paradoxa and S. viscosa) to compare 122 SBGE in dioecious and gynodioecious species to homologous hermaphrodite expression. With 123 124 this dataset, we aimed to address the following questions: (1) Are there differences in the timing of the evolution of female- and male-biased genes? (2) Are gene expression changes occurring 125 mostly in one sex, as previously suggested in S. latifolia (12, 35)? (3) Do the same genes 126 repeatedly become sex-biased in the independent transitions towards dioecy? (4) What 127 128 evolutionary forces shape SBGE evolution, drift or selection?

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### 131 Results

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# 133 <u>Transcriptome assemblies and mapping results</u>

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The *S. nutans* and *S. vulgaris* assemblies were composed of 23,836 genes and 31,526 genes, respectively (see Supplementary Table S1). A BUSCO (version 3.1.0; (64)) analysis showed that the *S. vulgaris* transcriptome assembly is more complete than that of *S. nutans* (Supplementary Table S1).

We mapped the RNA-seq data of the 9 dioecious species on both transcriptome assemblies and found that the mapping rate on *S. vulgaris* assembly was more similar among all the species (50%) than the one on *S. nutans* assembly (Supplementary Table S2). Coupled with the BUSCO results, we decided to keep the mapping on *S. vulgaris* for the rest of the analyses.

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### 144 <u>Numbers and proportions of SBGs in dioecious and gynodioecious species</u>

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We used three different tools to identify sex-biased genes: (1) DESeq2, (2) edgeR, (3) Limma-Voom. These three methods differ slightly in the way they assess sex-biased gene expression due to differences in the family distribution used for read counts. The two firsts rely on a negative binomial distribution and the latter on log-normal distribution. To limit biases, the genes with a log(foldchange)>2 and a *p*-value<10<sup>-4</sup> in at least 2 of the three methods were considered as sexbiased. The number of sex-biased genes and the number of sex-biased genes identified as autosomal or sex-linked by SEX-DETector are presented in Supplementary Table S3. Figure 1
 represents the proportions of sex-biased genes among expressed genes for the eleven species.

For the rest of the analysis, we will report the genes over-expressed in hermaphrodites of the gynodioecious species as male-biased, as hermaphrodites of gynodioecious species reproduce mainly through the male function (*21*). Also, we checked for methodological biases by repeating the analyses with different *p*-values and fold-change thresholds for sex-biased genes inferences, and to test for an effect of sample size we repeated all analyses with 4 males and 4 females only for all species (Supplementary Figure S1 to S5 and Supplementary Tables S4 and S5). We found qualitatively similar results on these controls.

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As shown in Figure 1, species in section Melandrium have the highest proportion of female- and 162 163 male-biased genes. This difference is stronger for female-biased genes, with species in section *Melandrium* having about 4 times more female-biased genes than those in section *Otites*, and ten 164 times more than gynodioecious species. The proportion of male-biased genes is much lower in 165 gynodioecious species than in sections Melandrium and Otites, with S. acaulis being somewhat 166 167 intermediate. Autosomal and sex-linked genes were identified for the eight dioecious species with a known pair of sex chromosomes. The pattern of SBG proportions is similar between autosomal 168 genes and all genes, as expected as most SBGs are autosomal, with male-biased genes being more 169 numerous than female-biased genes (Figure 1). Strikingly, however, female-biased genes are 170 overrepresented in sex-linked genes compared to male-biased genes in section Melandrium, but 171 not in section Otites. 172

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# 174 <u>SBGs accumulate over time after the evolution of separate sexes</u>

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We used a generalised linear model to investigate the relationship between the number of SBGs 176 and the age of dioecy (using a negative binomial family, and by accounting for the different 177 number of expressed genes among species through adding an offset, see Materials and Methods 178 for details). A significant positive correlation was found between the age of dioecy and the 179 number of female-biased, male-biased and the total number of SBGs ( $p < 10^{-7}$ ,  $R^2 > 0.9$ , 180 Supplementary Table S6, Fig. 2). The number of male-biased genes seemed to reach a plateau as 181 the age of dioecy increased (Figure 2). We therefore used a polynomial regression for the 182 relationship between male-biased genes and the age of dioecy (Materials and Methods equation 1, 183 184 Supplementary Table S6), which explained more variance compared to a linear model. The same was true for the relationship between the number of total SBGs and the age of dioecy (Materials 185 186 and Methods equation 1, Figure 2, Supplementary Table S6). On the other hand, the number of female-biased genes significantly increased with the age of dioecy without reaching a plateau (Materials and Methods equation 2, Figure 2, Supplementary Table S6). The positive correlations between the number of SBGs and the age of dioecy remained significant when accounting for species phylogeny using generalised least squares (equation 4, Supplementary Table S6).

The positive correlations observed between the number of SBGs and the age of dioecy suggest it takes time for SBGE to evolve, as species with older dioecy have more SBGE. Male-biased genes evolve early, as they are already present in gynodioecious species, but, after a few My, their numbers reach a plateau in dioecious species. Female-biased genes evolve later, after the transition to dioecy. We did not detect a plateau for female-biased gene numbers over time, but older dioecious species should be studied to address this question.

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### 198 High turnover of SBGs in Silene

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The proportion of species-specific SBGs is larger than that of SBGs shared among several species (Figure 3). Indeed, there is no species for which the number of specific SBGs is smaller than the number of SBGs shared with at least another species. This result shows that there is a high turnover in SBGE evolution in *Silene*. This is consistent with studies in other organisms (65, 66).

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# 205 Selective pressures on SBGE evolution

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In order to test whether SBGE evolved under positive selection, we calculated the  $\Delta_x$  statistic for 207 each species and each gene. This statistic summarises the change in expression of a gene in a 208 focal species with respect to an outgroup species, normalised by the standard deviation in the 209 focal species (see Materials and Methods). It is based on the double expectation that positive 210 selection leads to larger than average changes in expression levels between species, as well as 211 more similar expression levels between individuals within a species (58, 67, 68). We considered 212 genes with  $\Delta_x$  values higher than the 75 quantile as evolving under positive selection (as in (12); 213 see below for a more stringent threshold). In order to test for an enrichment of selection in SBGE, 214 215 the proportion of SBGs and unbiased genes evolving under selection were compared using a Chisquare test for each species, sex and type of sex-bias (Figure 4, Supplementary Tables S7 and S8). 216 217

As shown in Figure 4, female-biased expression is due both to increased female expression and decreased male expression compared to the hermaphrodite outgroup. Similarly, male-biased gene expression is due both to decreased expression in females and increased expression in males compared to the hermaphrodite outgroup. In order to assess whether these expression changes in

SBGs were driven by selection, we tested for an enrichment in selection in SBGs compared to 222 unbiased genes (Supplementary Tables S7 and S8). First, in both sections *Melandrium* and *Otites*, 223 female-biased gene expression that evolved through decreased expression in males compared to 224 225 the hermaphrodite outgroup was enriched in positive selection compared to unbiased genes. Second, for the *Melandrium* section only, increased expression in females for the female-biased 226 genes is also enriched in positive selection compared to unbiased genes. For male-biased gene 227 expression, significant enrichment in positive selection was also found among genes for which 228 229 expression decreased in females compared to the hermaphrodite outgroup. However, increased male expression compared to hermaphrodite outgroups was significantly depleted in positive 230 231 selection for male-biased genes in eight out of eleven species, suggesting that male expression evolves mostly under drift or purifying selection in male-biased genes. To differentiate between 232 233 drift and purifying selection, we considered expression variation within species (standard deviation). Male expression was the most variable in male-biased genes, especially when male 234 expression increased compared to the outgroup (Supplementary Figure S6), suggesting drift was 235 the driving force for the evolution of expression in this category. 236

Results were qualitatively similar when considering contigs with  $\Delta_X > 10$  as under positive 237 selection (as done in Scharmann *et al.* 2021 (69)), instead of using the quantile 75 (Supplementary 238 Table S9). Using a threshold of  $\Delta_X > 10$  is more stringent to infer positive selection because the 239 species quantile 75 of the  $\Delta_x$  ranged from 2.5 to 4.6. Results were also unaffected when we 240 repeated the analyses on autosomal genes only (for species without sex chromosomes all genes 241 were kept, for species with sex chromosomes, only genes inferred as autosomal by SEX-242 DETector were kept, Supplementary Table S10). As another control, we ran the same analysis on 243 leaf tissues (instead of flower buds) in S. latifolia only, using S. viscosa leaf data as a 244 hermaphrodite outgroup to compute the  $\Delta_x$ . We detected a significant enrichment in selection for 245 leaf male-biased genes in *S. latifolia* when male expression increased compared to the outgroup, 246 as well as when female expression decreased compared to the outgroup (Supplementary Table 247 248 S11).

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# 251 Selected feminization of the X chromosome

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We investigated whether the increase in the proportion of female-biased genes among sex-linked genes in the *Melandrium* section can be attributed to the feminization of the X chromosome. Feminization of the X is an enrichment of female-beneficial genes on the X, expected to occur because the X chromosome spends two thirds of its time in females and only one third of its time

in males (70, 71). To test for X feminization, we compared the proportion of female-biased genes 257 on the X that have an expression evolving under positive selection (1) to the proportion of male-258 biased genes on the X with an expression evolving under positive selection, and (2) to the 259 260 proportion of female-biased genes on the autosomes with an expression evolving under positive selection. We found that the proportion of female-biased genes evolving under positive selection 261 262 was significantly higher on the X compared to the other two categories in the *Melandrium* section (Chi-square test; see Supplementary Tables S12 and S13). This shows that the X is significantly 263 264 enriched in female-biased genes under positive selection in the Melandrium section, suggesting active X feminization. Interestingly, we observed more positive selection signatures for a 265 266 reduction of expression in males than for an increase of expression in females. These results tend confirm a feminization of the X chromosomes in the Melandrium 267 section. to 268 The numbers of female-biased genes in the Otites section were too small to conduct such an analysis. 269

### 270 Evolution of SBGs under drift

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We hypothesised that if drift is a strong driver of sex-biased gene expression, species with lower 272 273 effective population size may have more SBG. On the contrary, if selection is mostly driving the evolution of SBGs, species with higher effective population size  $(N_e)$  should have more SBGs. In 274 order to test for an effect of the intensity of selection on the number of sex-biased genes, we ran a 275 generalised linear model between the number of sex-biased genes and the synonymous nucleotide 276 277 diversity  $\pi_s$  (a proxy for  $N_e$ , equations 3 and 5). No significant correlation was found in either direction (Supplementary Figure S7, Supplementary Table S14), suggesting that drift and 278 279 selection do not explain differences in SBG numbers among species, or cancel each other.

As done by Scharmann et al. (2021), we tested whether sex-biased genes had an increased 280 281 expression evolutionary rate compared to unbiased genes. To avoid rates being affected by SBGE evolution, we computed rates of SBGE evolution after removing the species for which the gene is 282 sex-biased, so that the rates correspond to expression changes before the gene became sex-biased. 283 We therefore compared expression evolution rates between genes that are always unbiased in all 284 species and genes that are sex-biased in at least one species, after removing species with sex-285 biased expression from the analysis. We found, as Scharmann *et al.* (2021), that genes that are 286 sex-biased in at least one species have a higher rate of expression change, measured as the mean 287 of absolute PICs (91.91 on average) compared to genes that are always unbiased (51.93 on 288 average, one-sided permutation test p-value  $< 2.2 \times 10^{-16}$ , Supplementary Figure S8). Scharmann *et* 289 290 al. (2021) interpreted this result as an indication that genes that become sex-biased have faster-

evolving expression levels, even before becoming sex-biased (69). To further test this 291 interpretation, we splitted the analysis of PICs for genes that were detected as evolving under 292 positive selection in at least one species and genes that never evolve under positive selection 293 (using the previous  $\Delta_x$  analysis). We found that SBGs that evolve under positive selection in at 294 least one species have the highest rate of expression change, even before becoming sex-biased 295 (94.96 on average, permutation tests p-values  $< 10^{-3}$ , Supplementary Figure S8). The rate of 296 expression change was lowest for unbiased genes that never evolve under positive selection 297 (mean 10.94, permutation tests p-values  $< 10^{-13}$ , Supplementary Figure S9). Therefore both 298 positive selection and drift seem to accelerate expression evolutionary rates. 299

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### 301 Functional analysis of SBGs

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We explored if the SBGs are enriched for functions or pathways linked to sexual reproduction. 303 304 We tested the enrichment for four sets of genes (1) the whole set of male- or female-biased genes (2) the male- or female-biased genes in gynodioecious species (3) the male- or female-biased 305 genes in dioecious species (4) the male- or female-biased genes under positive selection (using 306 the previous  $\Delta_x$  analysis, see Supplementary Table S15 for more information). We then looked 307 for enrichment in functions explicitly linked to sexual selection in each of these sets of genes. We 308 also produced wordcloud figures to highlight the main functions or pathways (Supplementary 309 Figure S10 & S11). Only two GO terms are explicitly linked to a reproductive function 310 (GO:0090567: reproductive shoot system development and GO:0048437: floral organ 311 *development*). Those two GO terms are found while testing the whole set of female-biased genes 312 against the whole annotation. 313

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### 319 **Discussion**

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We studied Sex-Biased Gene Expression (SBGE) in the flower buds of eleven sexually dimorphic *Silene* species, including nine dioecious species and two gynodioecious species. The nine dioecious species originated from three independent transitions to dioecy. The youngest transition occurred less than one million years ago and the oldest approximately eleven million years ago (*26*, *28*, *29*).

Overall, the 11 species displayed more male-biased genes than female-biased genes 326 (Figure 1), which has already been observed in various plant species before (15). Two possible 327 explanations for this observation are (i) that drift is stronger in males due to a more variable 328 329 reproductive success and a smaller effective population size, or (ii) stronger sexual selection in males due to strong competition among males. The age of the dioecy is positively correlated with 330 both the number of male-biased genes and the number of female-biased genes. The dynamics, 331 however, seem to differ between sexes: male-biased gene numbers increase early and seem to 332 333 reach a plateau, whereas female-biased genes evolve more gradually and continuously. A possible explanation for the plateau reached by the number of male-biased genes is that an equilibrium is 334 attained among mutations, selection and drift. Mutations create new SBGs in dioecious species 335 and selection and drift filter them through time. 336

337 In gynodioecious species, we consider genes with higher expression in the hermaphrodite individuals as male-biased, since the hermaphrodites' main reproductive output is through the 338 male function (20). A possible explanation as to why male-biased genes are already present in 339 gynodioecious species but female-biased genes are nearly absent is that a gene could become 340 341 male-biased simply through the reduction of expression in female flowers, as a result of the loss of the male function. Therefore, although female flowers evolve first in the gynodioecy pathway, 342 female-biased genes mainly evolve later, when female functions are suppressed in male flowers 343 (i.e., when full dioecy evolves). 344

The patterns of male- and female-biased genes enrichment are reversed in the non-345 recombining region of the sex chromosomes in the Melandrium section (species from the oldest 346 transition to dioecy, Figure 1). We tested whether the female-biased genes on the X chromosome 347 bear footprints of positive selection, using the  $\Delta_x$  statistic (see (58)). In brief, if selection drove 348 the evolution of a SBG, we should observe a strong change in the expression level and a small 349 variance between individuals of the same sex in a species. The  $\Delta_{\rm X}$  analysis showed that female-350 biased genes in the non-recombining region of the X chromosome are significantly enriched in 351 positive selection compared to male-biased genes on the non-recombining region of the X 352 chromosome or female-biased genes on autosomes. This result supports an active feminization of 353 354 the X chromosome in the Melandrium section.

We used the  $\Delta_x$  statistic to study the selective regime of all the SGBs in the different species. With the exception of female-biased genes in *S. acaulis* (the species from the most recent transition to dioecy and very few female-biased genes), the reduction of expression in males for female-biased genes, or reduction of expression in females for male-biased genes is enriched in genes with an expression evolving under positive selection for all the dioecious species. In contrast, the increase of expression is enriched in genes evolving under positive selection only in

females of the Melandrium section for the female-biased genes. This suggests that, even if SBGs 361 result from changes in both sexes, increases in gene expression do generally not occur through 362 positive selection, while the reduction in expression generally does. For gynodioecious species 363 364 and *S. acaulis* (which evolved dioecy recently), the decrease in female expression of male-biased genes was significantly enriched in selection (Figure 4). These footprints of positive selection 365 differ from a previous analysis in the *Leucadendron* genus (69), where sex-biased genes were not 366 enriched in positive selection on expression levels compared to unbiased genes, suggesting that 367 368 they mostly evolved under relaxed selection. In order to test whether this difference between the two studies was due to the sampled tissue (flower buds in *Silene* versus leaves in *Leucadendron*), 369 we used leaf tissue available in *S. latifolia* and *S. viscosa* to compute the  $\Delta_X$  in *S. latifolia* leaves 370 (Supplementary Table S11). Leaf male-biased genes are significantly enriched in adaptive 371 372 evolution compared to unbiased genes in S. latifolia. Therefore, the differences between Silene and *Leucadendron* are not attributable to the sampled tissue. 373

Some SBG categories are significantly enriched in positive selection (Figure 4), but other 374 categories seem mostly driven by drift as they exhibit a high within-species variation in 375 376 expression levels (Supplementary Figure S6). We therefore clearly observe the effects of both selection and drift on SBGE evolution in *Silene*. This is also visible when studying expression 377 evolutionary rates (Supplementary Figure S9). In our Silene dataset, sex-biased genes that are 378 never under selection in any species (according to the  $\Delta_x$  analysis) have faster expression 379 evolutionary rates than unbiased genes that are never under selection, suggesting that SBGE leads 380 to faster expression evolutionary rates because of drift. Expression evolutionary rates are even 381 further accelerated by selection, because SBGs that evolve under selection (according to the  $\Delta_x$ 382 analysis) in at least one species have higher expression evolutionary rates than SBGs that never 383 evolve under selection (Supplementary Figure S9). We therefore confirm the theoretical 384 prediction by Dapper and Wade (72) that SBGs mainly evolve under relaxed selection, with some 385 exceptions. For some SBGs, positive selection is especially strong and contributes to accelerated 386 rates of expression evolution in Silene. 387

To our knowledge, this analysis is the first comparative analysis of SBGE between 388 389 gynodioecious species and dioecious species from independent transitions to dioecy. Indeed, despite numerous analyses of SBGE conducted to date, very few have been done in a comparative 390 391 way (but see (65, 66, 69, 73)). This limits our understanding of its evolution and the evolutionary forces that shape it, especially in a transition from hermaphroditism to dioecy or gonochorism. 392 393 Here, we show that the proportion of sex-biased genes correlates with the age of dioecy and that, through the gynodioecious pathway, male-biased genes emerge first. Also, our results support a 394 395 combined action of positive selection and genetic drift in the evolution of SBGE. This nuances

the theoretical prediction that most sex-biased genes should evolve under relaxed selection, simply because sex-specific expression reduces selection coefficient of a gene (72). Our study therefore calls for more investigation in other groups to enlighten why in some species SBGE seems to evolve mostly under drift (like *Leucadendron*), while other species show positive selection driving SBGE (such as *Silene*).

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### 402 Materials and Methods

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- 404 <u>Data</u>
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406 - Crossing and sequencing for the *Melandrium* section

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For *S. latifolia* and *S. vulgaris*, data have been reused from Zemp *et al*, (2016) and Zemp *et al*. 408 (2018)(12),37)). For S. dioica, S. heuffelii, S. marizii and S. diclinis, we have crossed a female and 409 410 a male from two different populations. Seeds from the crosses were sown to produce F1 individuals. Three flower buds (~2-3 mm) without the calvx were sampled for multiple females 411 and males and their parents (see Supplementary Table S16 for details on sample sizes). High 412 quality RNA (RIN > 9) has been extracted using the Plant Total RNA Mini Kit from Geneaid. 413 RNAseq libraries were prepared using Ultra II RNA Library Prep Kit for Illumina from 414 NEBNext. The libraries were then sequenced on a Hiseq4000 instrument using the paired end 415 416 150bp protocol at the Functional Genomic Center, Zurich.

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418 - Sampling and sequencing of *S. acaulis* 

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Flower buds from males and females of *Silene acaulis* have been sampled from a natural population, in 2018, at "Rocher Blanc" ("massif d'Allevard", France, between 2800m and 2900m above sea level).

The RNA preparation was done by the AGAP institute (Montpellier, France). For all individuals,
fresh tissues were sent, then flash-frozen (Freshfreeze method). RNA was extracted following the
SIGMA protocol and sequenced using the HiSeq3000-HWI-J00115 technology, producing 150bp
paired reads.

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428 - Published dataset for Otites section

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430 For *S. otites* and *S. pseudotites*, we used publicly available data from Martin *et al.* (2019) (31).

431 For *S. colpophylla*, we used data from Balounova *et al.* (2019)(27).

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433 - Published dataset for hermaphrodite species, gynodioecious species, and *Dianthus*434 *chinensis*

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For *S. nutans*, *S. paradoxa* and *S. viscosa* (the two hermaphrodite outgroups), as well as *Dianthus chinensis* we used publicly available RNAseq data from Muyle *et al.* (2021)(36).

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# 439 Transcriptome assemblies

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441 We assembled a *de novo* transcriptome for both gynodioecious species: *S. vulgaris* and *S. nutans*.

442 To this end, we used the tool DRAP (version 1.92,(*37*)), which allows merging and compacting

443 several transcriptome assemblies into a single "meta-assembly".

For *S. vulgaris*, we first independently assembled two transcriptomes from two hermaphrodite
individuals and one transcriptome from a female (tool RunDrap from Drap – default parameters).
Then, we merged these three transcriptomes into a single one with RunMeta (from DRAP, default
parameters).

For *S. nutans*, we independently assembled two hermaphrodite transcriptomes and two female
transcriptomes that we merged in a single one (using the default parameters for RunDrap and
RunMeta, as we did for *S. vulgaris*).

451 DRAP provides several assemblies. We used the one filtered with TransDecoder 452 (https://github.com/TransDecoder/TransDecoder) in order to obtain the Open Reading Frame 453 (ORF) of every gene.

454

# 455 Trimming, filtering and mapping of reads

456

We filtered PCR duplicates with Condetri filterPCRdupl(38). The reads with a Phred quality 457 score lower than 64 were filtered with trimmomatic (option PE -phred64)(version 0.39; Bolger, 458 Lohse, and Usadel 2014) and the adapters were removed using prinseq-lite (options -trim\_tail\_left 459 460 5 -trim\_tail\_left 5)(version 0.20.4; (39)). Once filtered, the reads were mapped on both transcriptome assemblies using GSNAP (option m 0.1)(version 2019-09-12;(40)). In order to 461 increase the amount of reads mapped for distant species, we re-ran GSNAP with the SNP-tolerant 462 option and SNPs identified in the first mapping (method previously employed in Prentout *et al.* 463 (2020)(14)). This iteration has been done once for each species, except when mapping S. vulgaris 464 and S. nutans on their respective transcriptome. Samtools version 1.9 (41) was used to remove 465 466 unmapped reads and sort the mapping outputs to bam files (view -F 4 | sort).

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467

# 468 Transcriptome annotation

469

We annotated the transcriptome of *S. vulgaris* as it is the one that we used for the rest of the analysis (see results section). We used diamond to blast the nucleotide CDS, provided by DRAP, against the nr database (nr version of April 2022)(diamond v2.0.4.142, blastx -p 4 --max-hsps 3 -e 1e-5 -f 5)(42). The diamond output (xml format) was provided to Blast2GO for the gene ontology mapping (Blast2GO Basic v6.0)(43, 44).

- To statistically test if a set of genes is enriched for specific functional pathways, we used two tools: GOstats (version 2.62.0, (45)) and clusterprofiler (version 3.15.0, (46)), and kept the GO term with an adjusted *p*-value < 0.05.
- 478

# 479 Sex-linked genes identification

480

481 Sex-linked genes are genes located in the non-recombining region of the Y (or W) chromosome 482 or the homologous region on the X (or the Z) chromosome. In order to identify sex-linked genes 483 in dioecious species, we first inferred the genotype of each individual with Reads2snp version 2.0 484 (47). We accounted for allelic expression bias, without filtering for paralogous SNPs and retained 485 positions with a minimum coverage of 3 (-aeb -par 0 -min 3).

- SEX-DETector (*48*), a tool based on the analyses of allele segregation within a cross, was used to identify sex-linked transcripts in every dioecious species of the Otites and Melandrium sections. This tool is based on an SEM algorithm and computes, for each gene, a posterior probability of being autosomal ( $P_A$ ), XY ( $P_{XY}$ ) or X-hemizygous ( $P_{X-hemi}$ ). We considered a gene as sex-linked (or autosomal) if  $P_{XY} + P_{X-hemi} > 0.8$  (respectively  $P_A > 0.8$ ), and if at least one SNP was classified as sex-linked (or autosomal) without genotyping error.
- Three models have been implemented in SEX-DETector: (1) XY sex chromosome system, (2)
  ZW sex chromosome system, (3) a system without sex chromosomes.
- In all species, the type of sex chromosome has already been identify, so we run SEX-DETector with the corresponding model (i.e. ZW for *S. otites* and XY for the seven other species; (*27*, *28*, 31)).
- As mentioned in the introduction, no sex chromosomes have been identified in *S. acaulis* so far
  (34). Because their detection is beyond the scope of this analysis, we didn't detect sex-linked
  genes in this species.
- 500

502

The expression level of each gene was computed with samtools idxstats (Version 1.9; (41)). Then, three tools were used to classify a gene as sex-biased: EdgeR (Version 3.36.0; (49)), DESeq2 (Version 1.34.0; (50)) and Limma-Voom (Version 3.50.3; (51)). We classified a gene as sexbiased if at least two of the three methods classified it as sex-biased with *p*-value lower than  $10^{-4}$ and greater than 2 (log<sub>2</sub>FC > 1).

To infer in which sex the expression changed compared to the ancestral expression level before 508 509 separate sexes evolution, we computed the mean fragment per kilobase of transcript per million mapped reads (FPKM) for each gene in every individual, and then, the mean FPKM for each gene 510 511 in each sex (males, females or hermaphrodites). The difference in mean expression between the focal dioecious (or gynodioecious) species and the closest fully hermaphrodite species (either S. 512 513 *paradoxa* or *S. viscosa*) was used to infer an increase or a decrease in gene expression compared to ancestral expression before separate sexes evolution. For S. diclinis, S. dioica, S. heuffelii, S. 514 *latifolia*, *S. marizii* and *S. vulgaris*, we used the hermaphrodite species *S. viscosa* as an outgroup. 515 For S. acaulis, S. colpophylla, S. nutans, S. otites and S. pseudotites, we used the hermaphrodite 516 species *S. paradoxa* as an outgroup. 517

518

### 519 Phylogenetic reconstruction

520

*Dianthus chinensis* was used as the outgroup species for the phylogenetic reconstruction (we used 521 2 hermaphrodite individuals). In order to build the species tree, we kept transcripts of autosomal 522 genes for which the sequence was available in all individuals of all species ( $N_{individuals} = 143$ ) with a 523 maximum of 30% of Ns in the sequence (740 genes in total). In each individual, only one of the 524 two alleles of each gene was kept for phylogenetic reconstruction. We concatenated the sequences 525 of the 740 genes in each of the 143 individuals, which led to a sequence of 873,747 bp per 526 individual. The phylogeny was inferred with IQ-TREE2 (version 2.1.3; (52)) using the GTR+G4 527 model and 100 replicates for the bootstraps. 528

529

# 530 Linear regressions between the number of sex-biased genes and the age of dioecy

531

The number of sex biased genes was correlated to the age of dioecy using a generalised linear model with negative binomial 1 family (appropriate for large count data) implemented in the glmmTMB R package (53). In order to account for the different number of sampled genes among species, the total number of expressed genes was log transformed and used as an offset. For the total number of sex-biased genes and the number of male-biased genes, the model that explained bioRxiv preprint doi: https://doi.org/10.1101/2023.10.02.560480; this version posted October 3, 2023. The copyright holder for this preprint (which was not certified by peer review) is the author/funder. All rights reserved. No reuse allowed without permission.

537	the most variance was a raw polynomial of degree 2 (equation 1). For female-biased genes, a		
538	simpler model without polynomial effects was used (equation 2). Fit of the model to the data was		
539	checked using the DHARMa R package by looking at residual plots (54).		
540			
541	Number of sex-biased genes ~ poly(Age dioecy, 2, raw=T) + offset(log(Total_expressed+1))		
542	(equation 1)		
543			
544	Number of sex-biased genes ~ Age dioecy + offset(log(Total_expressed+1)) (equation 2)		
545			
546	The regression output was plotted using the R package ggeffects to compute predicted values of		
547	the model with function ggpredict (55). The R <sup>2</sup> was computed using the function r.squaredGLMM		
548	of the R package MuMIn (56).		
549			
550	A similar model was run to test for an effect of the effective population size $N_e$ (the synonymous		
551	nucleotide diversity $\pi_s$ was used as a proxy for $N_e$ ). The negative binomial distribution was used		
552	and an offset was included:		
553			
554	Number of sex-biased genes ~ scale( $\pi_s$ ) + offset(log(Total_expressed+1)) (equation 3)		
555			
556	We also ran models that corrected for phylogenetic relationships among species using generalized		
557	least squares implemented in the nlme R package (57), using function gls and Martin's		
558	correlation structure. Since an offset cannot be implemented in such models, we did not include it		
559	As the negative binomial family is not available is gls, we log transformed the number of sex-		
560	biased genes:		
561			
562	log(Number of sex-biased genes + 1) ~ scale(Age dioecy) + corMartins(phylogeny) (equation 4)		
563			
564	$log(Number of sex-biased genes + 1) \sim scale(\pi_S) + corMartins(phylogeny) $ (equation 5)		
565			
566	$\Delta_x$ analysis		
567			
568	The $\Delta_x$ has become a widely used statistic in transcriptomics to evaluate selection pressures on		
569	gene expression (58). In order to compute the $\Delta_x$ for each sex, gene and species, the expression		
570	level of each gene and individual was first determined. The number of mapped reads was		

571 computed for each gene and individual using samtools version 1.10 idxstats and was normalised

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to reads per kilobase per million mapped reads (RPKM) for each contig and individual separately 572 as follows: 573 574 gene RPKM = raw number of mapped reads on gene / (contig length x individual mapped library 575 size) x  $10^9$ (equation 6) 576 578 Then, the  $\Delta_x$  was computed for each species and sex separately (i.e. for males and females 579 separately) as follows: 580 581  $\Delta_x$  = abs(mean(focal species expression) – mean(outgroup)) / standard deviation(focal species 582 (equation 7) 583 expression) 584 Where abs stands for absolute value. The hermaphrodite species used as the outgroup are the 585 586 same as in the "Gene expression level and sex-biased gene identification" section. For each species, contigs with  $\Delta_x$  values higher than the 75 quantile of  $\Delta_x$  values were considered 587 as under positive selection for expression evolution (as in (12)). We compared the proportion of 588 SBGs and unbiased genes under selection using a Chi-square test and corrected for multiple tests 589 using Benjamini & Hochberg correction (59). 590 Genes with sex-specific expression were excluded from  $\Delta_x$  analyses, to avoid the confounding 591 592 effect of including genes that are encoding tissues or functions sex-specific (*i.e.* androecium, gynoecium, etc), without the need to involve selection. 593 We also run this analysis on leaf tissues from S. latifolia and S. viscosa, to test if different tissues 594 show different results. 595 596 Phylogenetically independent contrasts (PICs) 597 598 Phylogenetic independent contrasts (PICs) correspond to the amount of change (here change in 599 expression level) between two taxa divided by the branch length separating them. The mean of 600 the absolute standardised PICs (60) per gene was employed as a measure of the rate of expression 601 evolution (61). For each gene, PICs were calculated based on the species tree and the mean 602 RPKM expression values per species, using the pic function in APE (62). Species exhibiting sex-603 biased expressions were excluded when calculating PICs, so that the PICs only measure gene 604 expression variation without sex bias (i.e. before the gene became sex-biased). Genes that are sex-605

biased in at least one species and genes that are always unbiased were then compared for their

606

- mean absolute PICs on the basis of 10,000 permutations, using the function permTS in the R
- 608 package perm v1.0 (63).
- 609
- 610
- 611
- 612
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836	Funding acquisition: GABM, AW
837	Project administration: GABM, AW
838	Software: DP, AM, BB
839	Formal analysis: DP, AM, AeF, BB
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842	Visualisation: DP, AM
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# 870 Figures and Tables

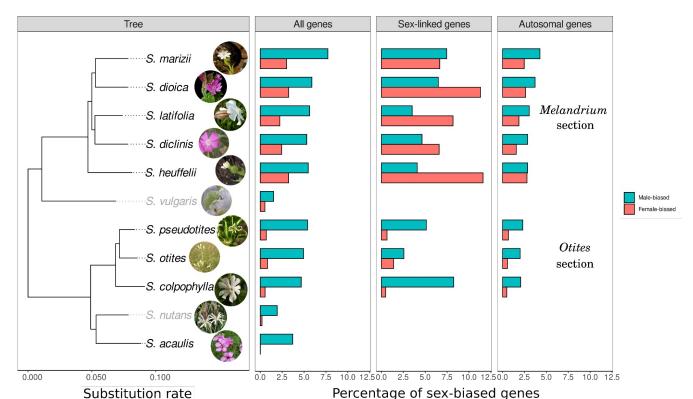


Figure 1: Phylogenetic reconstruction (left panel) of the eleven Silene species used in this study and sex-biased gene proportions in each species (the outgroup Dianthus chinensis was removed for this figure, see Supplementary Figure S12 for a complete phylogeny). Gynodioecious and dioecious species names are written in grey and black, respectively. The proportion of expressed genes which are female-biased (red) or male-biased (blue) is shown for different gene subsets: all expressed genes (middle left panel), sex-linked genes (middle right panel, only for Otites and Melandrium sections) autosomal genes (right panel, only for Otites and Melandrium sections). See Supplementary Table S3 for detailed gene numbers. (source of the S. colpophylla picture: www.earth.com).

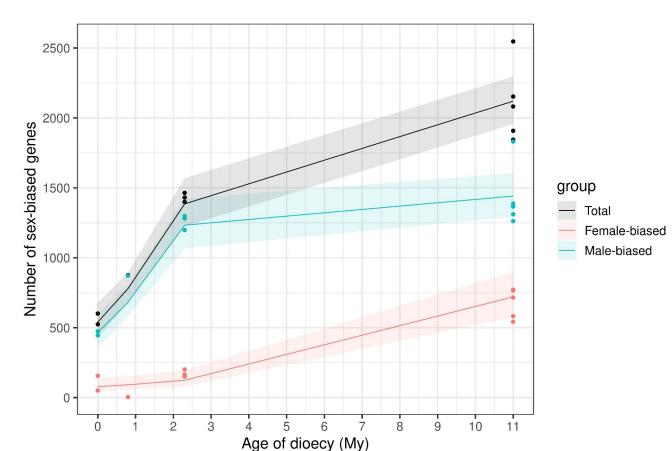
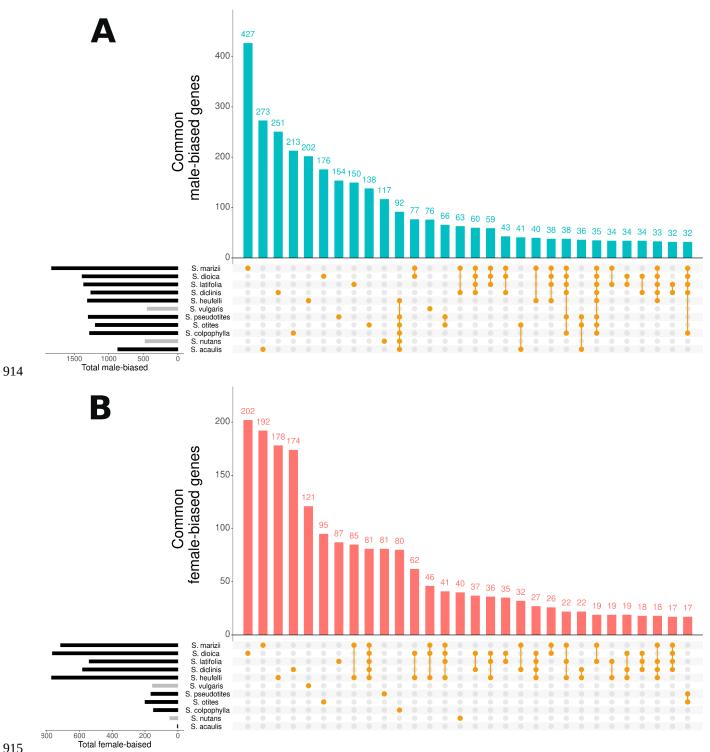


Figure 2: Number of sex biased genes as a function of the age of dioecy (separate sexes) in Million years (My). Gynodioecious species were plotted with age zero of dioecy, S. acaulis with age of dioecy 0.8 My, the Otites section 2.3 My and the Melandrium section 11 My. Total sex-biased gene numbers are shown in black, female-biased genes in red and male-biased genes in blue. Dots show the observed data, lines illustrate the predicted values by the generalised linear model detailed in Materials and Methods (equations 1 and 2), ribbons stand for the 95% confidence interval of predicted values. All regressions were significant with  $p < 1x10^{-7}$  and  $R^{2}>0.9$  (p-values and  $R^{2}$  of the models can be found in Supplementary Table S4). For total sex-biased and male-biased genes, the best model included a plateau, specified by a polynomial regression (see Supplementary Table S4 for details). The number of female-biased genes kept increasing with the age of dioecy without reaching a plateau.

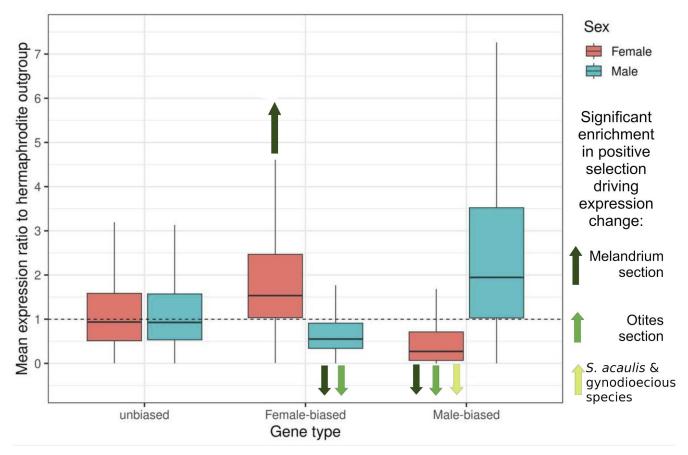
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916 Figure 3: Histogram of male-biased genes (A) and female-biased genes (B) indicating the number of genes that are unique or shared between several species. The yellow dots under each bar indicate the species in which 917 918 the genes are sex-biased (for example, 192 female-biased genes are unique to S. marizii and 85 are shared among S. marizii and S.heuffelii). For both graphs, only the 30 first bars have been represented (see 919 920 Supplementary Figure S13 & S14 for additional data).

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Figure 4: Boxplot of the expression ratio between focal species and their hermaphrodite outgroup. All species were plotted together (see Supplementary Figure S15 for a plot by groups of species). Values higher than one indicate higher expression in the focal dioecious species, and values below one lower expression in the focal species. The arrows summarise the results of the  $\Delta_x$  analysis (Supplementary Tables S7 and S8). Dark-green arrows indicate that sex-biased genes were significantly enriched in selection for increased or decreased expression in four species of the Melandrium section. Medium-shaded green arrows indicate that sex-biased genes were significantly enriched in selection for decreased expression in three species of the Otites section. The light-green arrow indicates that male-biased genes were significantly enriched in selection for decreased female expression in *S. acaulis* and in gynodioecious species.