1 **Title:** Sex-biased gene expression across

² tissues reveals unexpected differentiation in

³ the gills of the threespine stickleback

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14 Abstract:

15 Sexual dimorphism can evolve through sex-specific regulation of the same gene set. However, sex chromosomes can also facilitate this by directly linking gene expression to sex. 16 17 Moreover, heteromorphic sex chromosomes often exhibit different gene equation which contributes to sexual dimorphism. Understanding patterns of sex-biased gene expression across 18 organisms is important for gaining insight about the evolution of sexual dimorphism and sex 19 chromosomes. Moreover, studying gene expression in species with recently established sex 20 21 chromosomes can help understand the evolutionary dynamics of gene loss and dosage 22 compensation. The threespine stickleback is known for its strong sexual dimorphism, especially during the reproductive period. Sex is determined by a young XY sex chromosome pair with the 23 non-recombining regions that have started to degenerate. Using the high multiplexing capability 24 of 3' QuantSeq to sequence the sex-biased transcriptome of liver, gills and brain, we provide the 25 first characterization of sex-specific transcriptomes from ~80 stickleback (40 males and 40 26 27 females) collected from a natural population during the reproductive period. We find that the 28 liver is extremely differentiated (36% of autosomal genes) and reflects ongoing reproduction, 29 while the brain shows very low levels of differentiation (0.78%) with no particular functional enrichment. Finally, the gills exhibit high levels of differentiation (5%), suggesting that sex should 30 be considered in physiological and ecotoxicological studies of gill responses in fishes. We also 31 find that sex-biased gene expression in k-inked genes is mainly driven by a lack of dosage 32 compensation. However, sex-biased expression of genes that have conserved copies on both sex 33 chromosomes is likely driven by the degeneration of Y allele expression and a down-regulation 34 35 of male-beneficial mutations on the X chromosome.

36 Keywords: sex, Liver, Gills, Brain, Stickleback, gene expression, dosage compensation

Introduction

38 Species with sexual reproduction often exhibit sexual dimorphism (Lande, 1980). Because sexes 39 share most of their genetic material except for potential sex chromosomes, sexual dimorphism can arise from the different regulation of the same set of genes (Ellegren & Parsch, 2007; Tosto et al., 40 41 2023). Sex chromosomes thus represent a key step in understanding the evolution of s \mathbf{x} s. Sex-42 biased gene expression has been described in many systems as dependent on both life stages 43 (Djordjevic et al., 2022) and tissues (Rodríguez-Montes et al., 2023). Compiled data for five tissues in five mammals and a bird species show that sex-biased gene expression varies in intensity across 44 45 tissues, species and sexual maturity, with the contribution of sex chromosomes being also variable 46 (Rodríguez-Montes et al., 2023). 47 The variety of sex determinism systems and reproductive behaviours present in teleost fish

48 make them an interesting vertebrate group to study sex-biased gene expression (Thresher, 1984; 49 Devlin & Nagahama, 2002; Kobayashi et al., 2013). Patterns of sex-biased gene expression have been described in fish somatic tissues, such as the brain or liver, which are known to play a role in 50 51 reproduction. Sex-biased gene differentiation in the brain seems highly species dependent, with 52 about a thousand genes identified in salmonids (Hale et al., 2018) but only a handful in the Gulp 53 pipefish syngnathus scovelli (Beal et al., 2018) or the zebrafish Danio renio (Yuan et al., 2019). In 54 cichlids, gene expression levels in the brain are associated with social status and gonadic sex (Renn et al., 2008; Schumer et al., 2011). Liver is sexually dimorphic, specifically in oviparous species (Qiao 55 et al., 2016; Darolti & Mank, 2023) and many genes have been identified as sexually biased in 56 salmonids (Sutherland et al., 2019) and across cichlid taxa (Lichilín et al., 2021). On the contrary, 57 other tissues such as the gills have received strong attention in the context of adaptation to salinity, 58 59 pollution or hypoxia (Scott et al., 2004; Van Der Meer et al., 2005; Gonzalez et al., 2006) but studies 60 rarely account for potential sex dimorphism in the response of this tissue (but see (Lichilín et al., 2021). Given the dynamic nature of sex-biased gene expression, we need a better characterization 61 62 of sex-biased gene expression in natural populations if we want to understand the processes 63 underlying the evolution of sexual dimorphism.

64 Sex chromosomes play an important role in sex dimorphism (Rice, 1984). However, understanding patterns of sex-biased gene expression on sex chromosomes is particularly complex 65 66 in species with non-recombining sex chromosomes, as they tend to degenerate and may involve dosage compensation (Bachtrog, 2013). The lowered effective size of the Y (or W) chromosome, 67 68 present in only one sex, leads to lowered efficiency of natural selection and the degeneration of Y chromosomes (Charlesworth & Charlesworth, 2000). Genes that have lost their Y or W copy 69 70 (hemizygous genes) are expected to exhibit a reduced expression level that does not come from 71 sex-specific gene regulation. However, lowered gene activity on sex-chromosome can have 72 widespread effects on autosomal genes (Wijchers et al., 2010), and mutation reestablishing the 73 ancestral level of expression in the heterogametic sex is expected to be advantageous, leading to the evolution of dosage compensation. Global dosage compensation, where the X (or Z) 74 75 chromosome is overexpressed to compensate for the loss of Y (or W) genes was long thought to be 76 necessary in systems with degenerated sex chromosomes, but accumulating literature outside

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Drosophila and mammals suggest that it is not necessarily the case (Mank, 2013), with many groups exhibiting no or partial dosage compensation. Moreover, many genes are dose insensitive (i.e., their expression level does not affect the phenotypic outcome), therefore they do not need to be compensated. In fish, global dosage compensation has rarely been found (Darolti et al., 2019) and we still lack knowledge about the extent of the evolution of dosage compensation in this highly diverse group.

83 The three-spined stickleback is a model fish species with a young XY sex-chromosome system, 84 at most 13–26 million years-old (Peichel et al., 2020), and strong sexual dimonitism. The sex chromosome consists of a pseudoautosomal region which is still recombining, and three 85 86 evolutionary strata which have evolved through successive inversion (Peichel et al., 2020). Studies have found sex-specific splicing and protein expression (Viitaniemi & Leder, 2011; Naftaly et al., 87 88 2021), but few have described sex-specific patterns of cere expression in that species. The brain is 89 the most studied tissue (Primmer et al., 2013; Kaitetzidou et al., 2022) and shows limited sex-biased 90 gene expression outside the sex chromosomes (but see (Kitano et al., 2020). Similar results have 91 been observed in the liver red ler et al., 2010). Accumulation of sex-biased genes on sex red 92 chromosomes seems to be associated with a lack of global dosage compensation (Leder et al., 93 2010; Schultheiß et al., 2015; White et al., 2015) in that species, coupled with a potential partial 94 dosage compensation in one of the evolution are strata of the Y chromosome. However, these 95 studies used laboratory-raised individuals outside the reproductive period when sticklebacks 96 exhibit the strongest sexual dimorphism, and thus more studies are needed to understand sex-97 biased gene expression in natural populations during the reproductive period.

98 In this study, we took advantage of the high sample multiplexing capability offered by QuantSeq 3'-UTR sequencing (Moll et al., 2014) to profile the transcriptome of ~40 samples per sex in three 99 100 tissues (liver, brain, and gills) in adults from a natural population of threespine stickleback from 101 eastern Canada. We aimed at 1) describing the sex-specific transcriptome of this species in each 102 tissue and 2) making use of the recently sequenced Y chromosome data to understand the 103 dynamics of dosage compensation. According to work in other species, we expected the liver to be 104 the most differentiated somatic tissue between sees, as it plays an important role during reproduction in teleost fish (Meng et al., 2016). The brain is known to be sexually dimorphic during 105 106 the reproduction of the threespine stickleback (Kotrschal et al., 2012) and we expected substantial 107 sex-biased gene expression for that tissue. Finally, sex is not a factor usually accounted for when 108 studying gills, an extremely important tissue for physiological regulation, and when it is, there is 109 almost no sex-biased expression (Lichilín et al., 2021). We therefore predicted that this would be a 110 neutral tissue with little to no sex-biased expression. We also expected to find that most genes on 111 sex-chromosome exhibit sex-biased gene expression caused by the lack of global dosage 112 compensation in that species.

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Material and methods

114 **Ethics statement**

- 115 This study was approved by the Comité de Protection des Animaux de l'Université Laval (CPAUL,
- 116 approval number SIRUL 109096). A fish permit was issue by the Ministère des Forêts, de la Faune et
- des Parcs du Québec (permit number 2018 04 11 005 01 S P) for sampling. 117

118 Sampling and Sequencing:

119 We collected adult anadromous three-spined sticklebacks from tide pools of the St Lawrence 120 River at Baie de l'Isle verte (48.009961, -69.407070). Brain, liver, and gills were dissected (under five, seven and ten minutes respectively) and preserved in RNAlater at -20 C. In 2022, we performed 121 RNA extractions using the RNeasy mini Kit (Qiagen). We disrupted samples is 700 µL (brain) or 122 123 1400 µL (Gills, Liver) of trizol using a mixermix 400 at 30 Hz for 3 minutes or until complete tissue disruption. After three minutes, we added 140 µL (or 280 µL) of chloroform, homogenized the 124 125 solution and waited five minutes before centrifuging for 15 min at 12,000g. We collected the upper 126 phase and added 550 µL (or 1100 µL) of ethanol before transferring 700 µL into a RNeasy Mini 127 column (Qiagen). We then centrifuged for 15s at 11,000g, discarded the flow-through and repeated 128 the operation until all the collected phase has been used. We then proceeded with the extraction 129 protocol following manufacturer's instruction, including a DNase step, but replacing buffer RW1 130 by buffer RWT from miRNeasy Mini Kit (Qiagen), as it yielded better results for the brain. We then 131 generated OuantSeg libraries using 3' mRNA-Seg Library Prep Kit (Lexogen) with dual indexing to identify each individual and 18 PCR cycles for library amplification. After quality check on a 2100 132 133 Bioanalyzer (Agilent Technologies) and concentration estimation using Quant-iT PicoGreen 134 (Invitrogen), 227 libraries were pooled to equimolarity and sent to the Centre d'Expertise et de 135 Services Génome Québec (Montréal, QC, Canada) for 50 bp single-end sequencing on 2 lanes of an 136 Illumina Novaseg X. Tissue disruption and quality check were performed at the Plateforme

137 d'Analyse Genomique of Laval university (Québec, OC, Canada).

138 **Alignment and Expression Counts**

139 After guality check using FASTQC v0.11.8, we used fastp v 0.15.0 (Chen et al., 2018) to trim poly-140 A tails, Illumina adapters, and the first 12bp of each read, as they showed biased composition. We discarded reads shorter than 20bp long and proceeded with the alignment. We used STAR v2.7.2b 141 142 (Dobin et al., 2013) two-pass mode to align reads to the stickleback reference genome V5 (Peichel 143 et al., 2020; Nath et al., 2021), accessible on NCBI as RefSeg assembly GCF 016920845.1), excluding 144 the Y reference sequence for the females and its pseudo-autosomal region (PAR) for males. We used 145 STAR two-pass mode to discover reads junctions and improve mapping accuracy in the second 146 pass, then quantified gene expression using HTSeq v0.11.3. (Anders et al., 2015) in union mode after 147 filtering out multi-mapping reads. Counts from each sample were merged using custom R scripts, 148 leading to four datasets: the total datasets comprising all samples, and one dataset for each tissue 149 (Liver, Gills and Brain).

150 Filtering, normalization, and quality check

151 Unless stated otherwise, analyses were performed in R v 4.3.2 (R Core Team, 2021) and python 152 3.9.12 (Rossum & Drake, 2010). For each dataset, we applied the same filtering procedure. First, 153 samples with fewer than 5,000,000 raw reads counts were excluded, as preliminary principal 154 component analysis (PCA) showed that they clustered together (result not shown). Then, we kept 155 only genes with one count per million (cpm) in at least 10 samples. To identify potential errors in 156 the dataset (in particular, samples where tissue was misidentified), we first performed a PCA on 157 autosomal genes across all samples, using blind Vst normalization as implemented in DESeq2 158 v1.40.2 (Love et al., 2014). For all other analyses, read counts normalization was carried out 159 independently for each tissue using the average of ratio normalization factor implemented in 160 DESeq2. Given the specificity of genes on sex chromosomes, only autosomal genes were used for 161 the calculation of the scaling factors in each tissue, which were then used to normalize sex-162 chromosome genes independently. Note that gene length was not accounted for in the 163 normalization process, as it could generate a bias in our dataset as OuantSeg only sequences the 164 poly-A tail of each transcript, not the full transcript.

165 Differential Expression Analysis of Autosomal Genes

Within each tissue, we used Wilcoxon rank-sum tests to identify differentially expressed genes (DEG), using the Benjamini-Hochberg procedure to control the false discovery rate (Benjamini & Hochberg, 1995). This approach was selected as a recent study suggested that the classically used negative binomial models implemented in Deseq2 are subject to increased false positive rates in large sample size datasets (Li, Ge, et al., 2022) We also calculated the log-fold change (LFC) of gene expression between sexes as, for each gene:

$$LFC_g = \frac{\sum_{m=1}^{N_m} log2(g_m + 0.5)}{N_m} - \frac{\sum_{f=1}^{N_f} log2(g_f + 0.5)}{N_f}$$

with gm and gf being the normalized read count for each male and female, and Nm and Nf thenumber of individuals from each sex.

175 Functional Characterization of DEG

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176 To explore common functions among sex-biased genes, we performed Gene Ontology (GO) enrichment analysis. To do so, we used blastX (Camacho et al., 2009) to gather the Swiss-Prot 177 (Schneider et al., 2009) annotation for each sequence of the three-spined stickleback 178 179 transcriptome available on NCBI (RefSeq assembly GCF 016920845.1) and gathered gene ontology 180 information from the associated UniProt entry (The UniProt Consortium, 2023). We then 181 summarized transcript-level GO at the gene level using information from the NCBI annotation of 182 our reference genome with a custom python script (lien?). We used goatools (Klopfenstein et al. 183 2018) to perform Fisher's exact test for enrichment at a q-value threshold of 0.05 using the 184 Benjamini-Hochberg procedure. We also combined Zfin (zfin.atlassian.net), genecards 185 (www.genecards.org) and Uniprot (www.uniprot.org) databases to provide a more precise

186 functional characterization of 1) the 10 genes with the lowest q-value and 2) the 10 genes with the

highest LFC for each tissue, as well as all DEG shared by all tissues. Functional annotationsdescribed in the results section are based on information from these databases unless otherwise

189 noted.

To explore the genomic distribution of DEGs, we performed a Fisher test for enrichment analysis for each chromosome to test whether 1) some chromosomes are enriched in DEG considering their number of genes and 2) DEG within a chromosome are enriched toward male-biased or femalebiased genes considering the global distribution of sex bias toward each sex. We used a Benjamini-Hochberg procedure to control the false discovery rate independently for the two hypotheses

195 tested.

196 Identification of Shared Genes Between X and Y

197 The study of sex-biased gene expression on sex chromosomes is complexified by independent 198 gene gain or loss on their non-recombining region. To identify gene loss or gain, we first extracted 199 transcript sequences from the reference genome using gffread (Pertea and Pertea 2020) and the 200 NCBI genome annotation for our genome version, using -C option to remove transcripts with no 201 CDS. We did the same using the available ninespine stickleback reference genome (Varadharajan 202 et al., 2019) and annotation (GenBank accession GCA 949316345.1), then used Orthofinder v2.5.5 203 (Emms & Kelly, 2019) to identify orthogroups with default parameters. We used a custon python 204 script to identify transcripts likely to be orthologs between X and Y chromosomes and summarize 205 the information at the gene level, as each gene can have several transcripts. We accepted an 206 orthologous relationship if 1) an orthogroup was composed of one transcript from X, one from the 207 Y and other members originated from the nine spined stickleback. To account for the fact that one 208 gene can have several transcripts, we accepted an orthogroup with many X or Y transcripts if they 209 belonged to the same X or Y gene, but filtered out genes for which transcripts did not all belong to the same orthogroup (except if the transcript was not associated with any other orthogroup). 210 211 Transcripts that fell in an orthogroup with only Y or X transcripts were categorized as hemiploid Y 212 (no gene copy on X) or hemiploid X (no gene copy on Y). Orthogroups that contained autosomal 213 genes, likely reflecting gene gain on the sex chromosome, were removed from analysis as well as 214 genes with multiple copies on either sex chromosome. Finally, genes for which transcripts couldn't 215 be assigned to any orthogroup were considered as hemiploid X or Y. Gene counts for genes still 216 shared between X and Y chromosomes were pooled in males. We assigned each gene to one of the 217 three known evolutionary strata of sex chromosomes using its central position, and breakpoints defined in Peichel et al. (2020). Given that the pseudoautosomal region of the Y chromosome was 218 219 excluded from the read mapping step, read counts for that region were already correct and genes 220 were considered as still sharing a copy ignoring Orthofinder results.

221 Sex-Biased Gene Expression on the Sex Chromosomes

We used the merged counts to test for sex-biased gene expression on sex chromosome using the same method as for the autosome. To test for potential dosage compensation, we estimated the autosome to sex chromosome median expression ratio for all genes, and independently for

225 hemiploid X and Y genes for males and females. The autosomal median was calculated as the 226 median across all genes of the mean log2 normalized read counts across all samples. Median 227 expression for genes on the sex chromosome was calculated similarly but separating individuals 228 by sex. We estimated one median for all genes, genes that still have a copy on both chromosomes 229 and genes specific to each sex chromosome. This calculation was done for the whole chromosome 230 and for each stratum independently (PAR, strata I, strata II and strata III). Confidence intervals (CI) 231 were calculated using bias correction bootstraping for both autosomal and sex chromosome genes 232 and significance assessed using overlap of the CI with 0. Finally, to understand the processes 233 underlying the evolution of sex-biased gene expression for genes with a copy conserved on each 234 chromosome, we estimated X and Y allele expression in males. We then compared the expression 235 level of female, male and X and Y alleles in sex-biased genes to their expression levels in unbiased 236 genes using Wilcoxon rank-sum test.

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Results and discussion

238 Sequencing, Mapping and Filtering

The two lines combined rendered 4,247,758,804 reads with an average of 20,319,408 [Cl 95%: 239 240 18,047,379 - 22,591,436] for the gills, 18,847,630 [17,937,603 - 19,757,656] for the brain and 17,073,329 [14,606,317 – 19,540,341] for the liver. The average read length after quality trimming 241 242 was 38 bp. After removing samples with fewer than 5,000,000 reads (ten for the liver, one for the 243 brain), we kept 67 samples in the liver (35 Females; 32 Males), 77 for the brain (38; 39) and 72 in gills 244 (36; 36). Dataset include 59 samples sequenced in all tissue, but 10 were specific to gills and brain, 245 five to brain and liver and three to gills and liver. Three samples were sequenced only in brain. We 246 had a percent mapping of uniquely mapped reads to the reference genome ranging from 44.3% to 247 88.61% (median 76.76%). After filtering, we identified five over expressed genes in the liver but none 248 in the gills or the brain. Liver was the tissue with the lowest number of expressed autosomal genes 249 (14,402) compared to gills (17624) and brain (17930), with 13957 autosomal genes expressed in all 250 three tissues. Using PCA to screen our dataset for potential cross tissue contamination or 251 mislabelling revealed no evident issue (Fig1 A) as each tissue formed a distinct group, confirming the quality of the dataset. 252

253 Tissues Differ in the Magnitude of the Sex-Biased Expression

254 Patterns of sex-biased gene expression varied greatly between liver, gills and brain, both in terms of the number of genes differentially expressed and their function (figure 1B). Liver 255 256 transcriptomes showed strong sex specificity, with 5303 sex-biased genes (hereafter SBG, "sex-257 biased gene") with a q-value \leq 5% after a Benjamini-Hocheberg correction. In comparison, using 258 the same threshold, we found 973 SBG in gills and only 141 in the brain (Figure 1B). Genes also exhibited a wider range of differential expression in the liver compared to gills and brain (Figure 259 260 1 C-D-E). Across all tissues, no chromosome showed enrichment for SBG (Fig. 2, Fisher's test q-261 value> 0.4).

Sex-biased genes found in all tissues are implicated in cell physiology, cell-cell signalling and gene expression modulation

Most SBG are unique to a tissue, with only 42 genes significient in all three tissues (figure 1B, table S1). Eight of them are related to basic cell physiology such as growth, cytoskeleton, and differentiation. Five genes are involved in cell-cell signalling or adhesion and are mainly known to play a role in neuron communication and development. Seven genes are involved in gene expression modulation and affect either DNA methylation, transcription, or alternative splicing. If fish, sex-specific methylation is known for its role in modulating the expression level of reproduction-related genes (Laing et al., 2018; Li, Chen, et al., 2022) and in sex determinism





Figure 1: Patterns of autosomal sex-biased gene expression in threespine stickleback. A) PCA
of gene expression on all tissues. B) Overlap of sex-biased genes between tissues. Inset
barplot represents tissue specific repartition of male (blue) and female-biased genes.
Volcano plots of sex-biased gene expression in C) liver, D) gills and E) brain. Coloured dots
correspond to genes significant at a 5% false discovery rate based on a Wilcoxon-rank-sum
test. Dotted lines represent a log-fold change of 1 (doubled expression).

(Gemmell et al. 2019). Similarly, sex-specific transcript usage can provide an alternative route from
gene regulation to generate sexual dimorphism (Telonis-Scott et al., 2009; Naftaly et al., 2021).
Hence, those genes could play an important role in regulating sex-biased gene expression and

dimorphism across tissues. Other functions found in shared SBG among tissues involve the
 immune system, testosterone response (one gene) and two nuclear genes with mitochondrial
 function.

In most cases, genes showed the same directionality in all tissues (Fig. 3), except for two genes: slc16a13, a monocarboxylic acid transporter, and esr2b, an estrogen receptor. Both are femalebiased in liver but male-biased in the brain and gills. While the function of slc16a13 is hard to interpret in our context, as the substrate of this member of a large family of solute transporter is unknown (Halestrap, 2012), the gene esr2b code for an estrogen receptor. In teleosts, estrogen receptors are involved in several biological processes, including reproductive processes (Nelson & Habibi, 2013). In the brain, esr2b is thought to play a role in reproduction through the





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Figure 2: Proportion of sex biased genes across chromosomes and sex in each tissue. Chromosome VII and XVIII show enrichment toward male-biased function in liver (q-value ≤0.05), as well as the mitochondria with lower confidence (q-value = 0.12. No chromosomes are significantly enriched in sex-biased genes.

regulation of gonadotropin production, which is involved in gametogenesis (Muriach et al., 2008)

- in both sexes and have been found to have a higher expression in males in the pituitary gland of
- 298 the fathead minnow (Pimephales promelas) (Filby & Tyler, 2005). In the liver, esr2
- 299 expression levels and was female biased (LFC of -0.35), and could be associated with vitellogenesis
- 300 process, although it seems to vary across species (Dominguez et al., 2014; Chen et al., 2019). We
- 301 still lack knowledge on the effect of sex hormones in the gills.
- In the case of a pattern of directionality in gene expression shared by only two tissues, we only
 found discordance when the comparison included the liver (Fig. S1). While part of this is explained

304 by the liver having both more SBG and more shared SBG with other tissues in general, it suggests

305 that this tissue might have a different usage of the same gene set.

306



307Figure 3: Heatmap of log-fold change in gene expression between sexes for 42 genes308significantly differentially expressed in all tissues. Bar on top shows concordance in the309direction of expression bias.

310 Sex-biased genes in the brain are few and not enriched for particular functions

311 The brain showed the lowest number of SBG with 141 genes differentially expressed between 312 sexes on the autosomes (0.78%) of expressed genes), equally distributed between males and 313 females and across chromosomes (Figure 2). We found no enrichment for any gene ontology term 314 using the 5% threshold (supplementary tables). These results are in accordance with a similar 315 study in the same species in which they found a higher number of expressed genes but included 316 sex chromosomes in their analyses (Kaitetzidou et al., 2022). Looking into the most significant 317 genes (10 with highest p-value and 10 with highest LFC), we found that only 12 of them are specific 318 to the brain (Table S2). We were unable to annotate three of them (LOC120812970, LOC120817963 319 and LOC120833148). The remaining 9 genes were associated with various biological functions. The 320 growth hormone-releasing hormone (ghrh), more highly expressed in males, is the first hormone 321 secreted in the growth hormone axis, which in fish is not only involved in growth but also 322 reproduction, metabolism and immune function (Chang & Wong, 2009). TTC29 is involved in cilium 323 movement and is mainly described in sperm flagellum (Bereketoğlu et al., 2022). Other genes 324 included ihhb (LOC120819658), which is involved in neural and chondrocye development (Wu et al., 2001; Chung et al., 2013), hcn3 (si:dkey-197j19.6), an ion channel which is essential for neuronal 325 326 function, MMP13 or 18 (LOC120822795), which modulates angiogenesis in the brain (Ma et al., 327 2016), and ecm1a (LOC120810788), which codes for an extracellular matrix protein involved in 328 signal transduction.

329 Sex-biased genes in gills are associated with ion-related functions and immune defense

We identified 973 SBG in the gills (5.5% Expressed genes), of which 60.8% are male-biased. Significant genes are distributed homogeneously in the genome, with no chromosome significantly enriched in SBG of biased toward a sex (Fig. 2). Synaptic signaling and organisation represent 48% of significantly enriched GO terms (Table S3), most of them (48% of total significant terms) related to synaptic signalling and organization. However, looking at descriptions of genes within those GO categories on Zfin or Genbank revealed that many genes code for ion channels or pumps, which 336 are a core function of the gill tissue (Perry et al., 2003), yet the associated GO functions have only 337 been described in the brain (Table S4). This suggests that gene ontology analysis in gills suffer from 338 the lack of gill-specific information. Other GOs include various biosynthetic and metabolic 339 processes, as well as cell adhesion, communication, and development. Most strongly differentiated 340 genes (Table S5) in gills involve two genes with potential role in pathogen resistance, hhipl1 and 341 CLEC4M (LOC120817010) and genes with basic cellular functions (LOC120828377, si:dkeyp-92c9.4 342 and LOC120810538). Asic2 codes for an ion channel, and this gene family is involved in Na+ intake 343 in rainbow trout gills (Dymowska et al., 2014). Three genes are involved in neuronal function, 344 including one ion channel, rem2, and a galanin receptor, galr2b. Dpysl3, is also male biased in the 345 liver is supposed to have an effect of peripheric axon growth. As for the gene ontology, the function 346 of these genes in the gills is unclear. Finally, three genes (LOC120816929, LOC120817829 and 347 LOC120821053) could not be annotated.

348 Most studies on gills transcriptomes focused on their role in osmoregulation and respiratory 349 processes in responses to anoxia, salinity, or various contaminants (Scott et al., 2004; Van Der Meer 350 et al., 2005; Gonzalez et al., 2006). Works have also been interested in gills' function in defence 351 against pathogens, as they represent a direct entry for infection and parasites (Mitchell & Rodger, 352 2011). However, a survey of the physiology literature illustrates that these studies do not usually 353 account for sex. When they do, few SBG are identified, for example, in African cichlids (Lichilín et 354 al., 2021). However, our results identify numerous SBG in animals all found in the same 355 environmental conditions. This unexpected resulting the importance of accounting for sex 356 when studying gills, as the extent to which this tissue might respond differently to various 357 challenges between sexes is also poorly understood.

358 The Liver is a Hotspot of Sex-Biased Gene Expression

359 We identified 5303 SBG in the liver (36.8% of total expressed genes), 60.3% of which are male-360 biased. SBG are uniformly distributed among chromosomes (Fisher's exact test qvalue \geq 0.45, 361 Figure 2), except for chromosomes V and XVIII, which show enrichment in male-biased genes, and 362 the mitochondria which shows marginal enrichment for male-biased function (FDR of 0.12). While 363 comparing the number of genes between studies is complex as life stages, condition and filtering 364 have a deep impact on detected SBG, widespread sex-biased gene expression has been found in 365 the liver of other fish species, such as Salvelin solution for the species of the 366 total gene expression using more stringent filtering (LFC>= 1.5) than we applied (Sutherland et al., 367 2019). Similarly, very low levels of SBG are identified in cichlids (Lichilín et al., 2021) using a LFC of 368 2 as a cutoff but these observations vary across species. In our study, only 396 (2.6%) in the liver 369 passed this cutoff (644 for the 1.5 cutoff), suggesting that sex-specific regulation of gene expression 370 in the liver mostly occurs through subtle regulatory changes, with a median absolute LFC for 371 significant genes at 0.63. Enriched gene ontology terms in the liver are mainly related to metabolic 372 and biosynthetic processes. The immune system also seems differentiated between the sexes, with 373 enriched processes such as humoral immune response and response to external stimulus. We also 374 identified an enrichment in hemostasis and coagulation regulation (Table S6). Among the most 375 significant genes in terms of p-value and fold change (Table S7), numerous genes were involved in

376 response to estrogen and estradiol (fam20cl, vtg3, LOC100190882, LOC100190880, LOC120823934
377 blasting to vtg1, and two vtg2). Other genes showed functions related to gene expression
378 regulation (e.g. lbx2, st18), response to pathogens (LOC120810467, LOC120820940, blasting to the
379 fucolectin-1 and CHIT1), and cellular differentiation (LOC120824638, blasting to srda3a).

380 We identify five genes representing more than 15% of reads in at least one sample: apoa2, 381 lect2.1, LOC120808851, LOC120810467 and LOC120823934, hereafter referred to as overexpressed 382 genes (Figure 4). All five overexpressed genes showed sex-biased gene expression, according to 383 Wilcoxon rank-sum tests (p.value <10-6). Apoa2 (apolipoprotein A-II) and lect2.1 (leukocyte cell 384 derived chemotaxin 2.1), which were more highly expressed in males, have functions related to 385 lipid transport and immune system. Apolipoproteins are involved in lipid transports in vertebrates 386 but have also been found to have antimicrobial activity in teleost fish (Concha et al., 2003), among 387 other functions. Leukocyte cell derived chemotaxin2 have been known to have chemotactic 388 activity in humans, but also have antibacterial activity in other vertebrates and in teleost fish. 389 BlastX results for females-biased genes (LOC120808851, LOC120810467 and LOC120823934, figure 390 4) are indicative of ongoing preparation for reproduction. LOC120808851 is located on the sex 391 chromosome and shows similarity to the ZP3 (Zona pellucida sperm-binding protein 3) Uniprot 392 entry, a protein that mediates sperm-binding during fertilization. According to Orthofinder results, 393 it is part of a cluster of duplicated genes on the chrXIX (LOC120808849, LOC120809240, 394 LOC120808850, LOC120808851) with a single copy conserved on the Y chromosome, which 395 supports the importance of this function for females. LOC120810467 shows similarity to the 396 Fucolectin-1 entry, which belongs to a family of genes involved in innate immunity (Honda et al., 397 2000) that has been found to be accumulating in European seabass' (Dicentrachus labras) eggs (Parisi et al., 2010). Finally, LOC120823934 shows similarity to Vitellogenin-2, which is a precursor 398 399 to several egg-yolk proteins (Tata, 1976). This result is concordant with the observation of high 400 levels of estrogen receptors in liver as described before, and further confirmed by the presence of 401 vtg3, another vitellogenin coding gene, and vtg-2 among the list of most significant genes in liver 402 (LFC = -5.69). Moreover, as described before, other genes related to response to estrogen also are 403 among the most significant genes. Moreover, both ZP3 and vitellogenin are genes known to be 404 expressed in liver (Sano et al., 2017), at least in recent teleosts, further confirming the quality of the 405 dataset

406 The liver is the only tissue in which we observed sex-biased expression of mitochondrial genes. 407 We identified 13 genes with sex-biased gene expression (~56% of expressed genes in the liver's 408 mitochondria), all male-biased. These genes include ATP6 and 8, COX2, ND1,2,3,5 and two transfer RNA. In sticklebacks, parental care from the male during the reproductive period, coupled with 409 410 gonadal development, is associated with a strong depletion of energy reserves (Chellappa et al., 411 1989; Huntingford et al., 2001). While the development of eggs is also costly for females, the strong 412 involvement in nest building, defence, and parental care by males could generate a high energetic 413 need in males associated with the metabolic processing of energy reserves in the liver. 414





Figure 4: Normalized read counts distribution between sexes for five genes representing more than 15% of total read counts in at least one sample. All between-sex comparisons are significant using an FDR threshold of 5%.

418 Sex-biased Gene Expression on Sexual Chromosome Mostly Reflects Gene Loss in Non-419 Recombining Regions

420 Most geres ocated on sex chromosomes exhibited sex-biased gene expression (499 in liver, 755 421 in gills and 813 in brain). Contrasting with the autosomal pattern of sex-biased gene expression, 422 gills and brain exhibited the strongest pattern of SBG, and the higher number of genes expressed 423 in those tissues is not sufficient to explain it (respectively 71%, 83% and 87% of expressed genes in 424 liver, gills and brain). Most SBG are caused by genes having lost their Y copy (83.9%, 71.6% and 425 70.2% of significant genes in liver, gills and brain), suggesting a lack of global dosage compensation in all studied tissues. Genes orthology relationships for sex chromosomes are available in Table S8. 426 427 When looking at the ratio of gene expression between sex chromosomes and autosomes, we found 428 that gene expression was greatly lowered uniquely in males for genes having lost their Y copy (95% 429 confidence interval: [-1.77; -1.29] in brain, [-1.5;-1.00] in gills and [-1.50;-1.01] in liver for males; [-430 0.71; -0.28], [-0.41; -0.03] and [-0.70; -0.07] in females), but not for genes still having a Y orthologue 431 ([-0.48; 0.24], [-0.59,0.22] and [-0.26, 0.18] in males; [-0.23; 0.39], [-0.27;0.5] and [-0.34, 0.71] in 432 females). This pattern holds across all evolutionary strata and tissue (Fig. 5, Table S9). Estimated 433 ratios for the pseudo-autosomal regions or genes with coding sequences on both chromosomes in 434 non-recombining strata did not statistically differ from 0 (Table S9), except for female-biased expression in stratum II in the brain ([0.10, 1.35], and stratum I in the gills ([0.39, 1.61]). Genes 435 436 having lost their X copy exhibit a similar pattern but with overall higher median sex-chromosome 437 to autosome expression ratio. In stratum I, it is not statistically different from 0 ([-1.31, 0.02], [-1.44, 438 0.10] and [-0.92, 0.69]).

439



Figure 5: Sex chromosomes to autosome expression ratio across sex-chromosome evolutionary strata. Hemizygous X and hemizygous Y genes respectively lost their Y- and Xcoding sequence, while diploid genes are still have a copy on both chromosome. For diploid genes, strata was defined using the Y copy position Confidence intervals from 1000 bootstraps are shown. Sample sizes for each median are indicated in Table S8.

445 Lack of dosage compensation has already been described in the brain (Schultheiß et al., 2015; White et al., 2015). and our results extend this conclusion to liver in and gills, and to genes with a 446 447 lost X copy which had not been included in previous studies. Dosage compensation is expected to 448 evolve when reduced expression in the heterogametic sex affects phenotype, i.e., affects the 449 protein level and its interaction network within the organism. In sticklebacks, hemizigous genes 450 tend to be dosage insensitive, meaning that protein quantities are independent from its expression 451 level (Peichel et al., 2020). This suggests that there is no selective pressure to evolve dosage 452 compensation and is corroborated by the fact that conserved genes are dosage-sensitive and 453 evolving under purifying selection (White et al., 2015).

454 Apart from chromosome degeneration, gene expression on sex chromosomes is expected to 455 evolve through several processes. First, as the X chromosome is more often transmitted to females, 456 it is expected to accumulate dominant female-beneficial mutations that could lead to an increase 457 in expression of the X copy (Bachtrog et al., 2011). Sex chromosomes are also expected to be 458 enriched in both actived nd resolved sexual conflicts, in which case gene expression should 459 increase depending on the sex in which they are beneficial (Vicoso & Charlesworth, 2006; Bachtrog 460 et al., 2011). Finally, the lack of recombination and lowered sample size of the Y chromosome can 461 lead to the accumulation of loss-of-function mutations, leading to the progressive loss of Y-copy expression (Charlesworth & Charlesworth, 2000; Bachtrog, 2013). We observed a feminization of 462

stratum I in gi and II in brain, which had previously been described for stratum II (Leder et al.,
2010; White et al., 2015), suggesting a role for female-beneficial mutations in the evolution of gene
expression on the X chromosome. We did not observe feminization of the pseudo-autosomal region
as previously reported by White et al (2015). This could be caused by the use of autosomal
expression level instead of a closely related species to estimate ancestral expression rate.

468 To better understand the drivers of sex-biased gene expression of sex chromosomes, we 469 compared expression of X and Y alleles in sex-biased genes with conserved copies on both 470 chromosomes (excluding the still recombining PAR) to the allelic expression of unbiased genes (Fig. 471 6). In all tissues, we found a lowered expression of the Y allele of female-biased genes compared to 472 unbiased genes (wilcoxon rank-sum test p-value: 1x10⁻⁴ in brain, 8x10⁻⁴ in gills and 2x10⁻² in liver) 473 while X expression remained similar (all p-value > 0.7), which also resulted in lowered expression 474 in males in the brain (p-value1x10⁻²). This suggests that the degeneration of the Y chromosome 475 coupled with the absence of dosage compensation in this species is the main driver of female-476 biased gene evolution, as suggested by previous work (White et al., 2015). Note that we also found 477 that in the liver overexpression in females also occurred in female-biased genes $(2x10^{-2})$. 478



479Figure 6: Genotype and allele-specific gene expression across male-biased, unbiased and480female-biased genes. Male-biased and female-biased genes were defined as genes with log2481fold change in expression under -0.5 and above 0.5. We assessed significance using Wilcoxon482rank-sum test comparing within genotype expression levels of male-biased and female-483biased genes to unbiased genes. *: p-value <0.05, ** p-value <0.01, *** p-value <0.001</td>

Similarly, we observed that male-biased gene expression in females $(6x10^{-5}, 1x10^{-2} \text{ and } 7x10^{-2})$ but not males (all p-value > $2x10^{-1}$) is reduced compared to unbiased genes. We also observed reduced expression of the X allele in males in the brain and gills $(1x10^{-4}, 7x10^{-3})$, suggesting that this could be the result of a systematic down-regulation of some genes on the X-chromosome, which 488 could be a signal of ongoing demasculinization, i.e. the loss of male-advantageous gene on the X
489 chromosome (Gurbich & Bachtrog, 2008) Concordant with that hypothesis, genes identified as
490 specific to the Y chromosome tended to have higher expression than genes specific to the X

491 chromosome in males, suggesting that they are associated with male-beneficial functions.

492 Conclusion

493 Our study characterizes the sex-specific transcriptome of brain, gills and liver for the threespine stickleback during its reproductive period. We find low levels of differentiation between sexes in 494 495 the brain compared to the level of dimorphism shown in behavioural and morphological studies. 496 On the opposite, the gills exhibit pronounced sexual dimorphism that is usually not reported or 497 accounted for in the literature, suggesting that the importance of sex as a cofactor in gill studies 498 has been underestimated. The liver appeared to be strongly differentiated between the sexes, as 499 expected for teleost fish. Sex chromosomes are a hotspot of intersex differentiation in all tissues, with ~70% of genes being differentially expressed. This pattern seems to be caused both by an 500 501 ongoing degeneration of the non-recombining region of this sex chromosome coupled with the 502 absence of dosage compensation mechanism, and a potential repression of male-advantageous mutations on the X chromosome, although further investigation of gene sequence evolution would 503 504 be necessary.

505

506 Acknowledgement:

507 Authors are thankful to I. Caza-Allard E. Reni-Nolin for their help during fieldwork and tissue 508 dissection. We thank S. Delaive and F-A Deschênes-Picard for a second year of sampling, although 509 not used in this manuscript. We also thank S. Bernatchez, R. Bouchard, A. Perreault-Payette and C. 510 Berger for occasional assistance and advice during fieldwork. We thank B. Bougas for her help 511 during mRNA extraction and library construction, and Y. Dorant and E. Normandeau for their help 512 during data processing. We also thank C. Venney for english-proofing the manuscript. This project 513 is part of the Ressources Aquatiques Québec (RAQ) research program. L. Bernatchez, who co-514 conceptualized and co-supervised this project as the PhD advisor of the first author, passed away 515 before the end of it. We are extremely grateful for his involvement, support and motivation until the end. 516

517 Data accessibility:

518 Raw sequencing reads and unfiltered read counts are available through NCBI GEO, 519 accession GSE269432. All analysis in the manuscript and related code are available at 520 <u>https://doi.org/10.5281/zenodo.11477976</u>

521 Authors contributions:

L.B and N.A.H conceptualized and supervised the project. F.S did the fieldwork, generated and
filtered the dataset, and performed analyses. N.A.H helped with interpretation. F.S wrote the draft
of the manuscript, and N.A.H reviewed and approved it.

525 Funding:

526 This research was funded by a Fonds de recherche du Québec - Nature et technologies 527 (https://frqnet.frq.gouv.qc.ca/) team grant to L.B. and N.A.-H. (grant number: 254,537). The funders 528 had no role in study design, data collection and analysis, decision to publish, or preparation of the 529 manuscript.

530 **Conflict of interest**

- 531 The authors have no conflict of interest to declare.
- 532

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