

1 A learning experience elicits sex-dependent neurogenomic responses in *Bicyclus* 2 *anynana* butterflies

3

4 Short title: Sexually dimorphic butterfly neurogenomics

5 David A. Ernst^{*1,2}, Gabrielle A. Agcaoili^{*1}, Abbigail N. Merrill¹, Erica L. Westerman¹

⁶ ¹Department of Biological Sciences, University of Arkansas, Fayetteville, AR 72701

⁷Bigelow Laboratory for Ocean Sciences, East Boothbay, ME 04544

8

9 *These authors contributed equally

10

11 Corresponding Author: Erica L. Westerman; ewesterm@uark.edu; 479-575-5348

12

13

14 **Abstract**

15 Sexually dimorphic behavior is pervasive across animals, with males and females
16 exhibiting different mate selection, parental care, foraging, dispersal, and territorial
17 strategies. However, the genetic underpinnings of sexually dimorphic behaviors are
18 poorly understood. Here we investigate gene networks and expression patterns associated
19 with sexually dimorphic imprinting-like learning in the butterfly *Bicyclus anynana*. In
20 this species, both males and females learn visual preferences, but learn preferences for
21 different traits and use different signals as salient, unconditioned cues. To identify genes
22 and gene networks associated with this behavior, we examined gene expression profiles
23 of the brains and eyes of male and female butterflies immediately post training and
24 compared them to the same tissues of naïve individuals. We found more differentially
25 expressed genes and a greater number of associated gene networks in the eyes, indicating
26 a role of the peripheral nervous system in visual imprinting-like learning. Females had
27 higher chemoreceptor expression levels than males, supporting the hypothesized sexual
28 dimorphic use of chemical cues during the learning process. In addition, genes that
29 influence *B. anynana* wing patterns (sexual ornaments), such as *invected*, *spalt*, and
30 *apterous*, were also differentially expressed in the brain and eye, suggesting that these
31 genes may influence both sexual ornaments and the preferences for these ornaments. Our
32 results indicate dynamic and sex-specific responses to social scenario in both the
33 peripheral and central nervous systems and highlight the potential role of wing patterning
34 genes in mate preference and learning across the Lepidoptera.

35

36 **Key words:** mate choice; sexual imprinting; butterfly; transcriptomics; wing patterning

37

38 **Introduction**

39 Sexually dimorphic behavior is pervasive across animal taxa. Males and females
40 may exhibit different mate selection strategies (Byrne and Rice, 2006; Kokko and
41 Johnstone, 2002; Talyan and Dowse, 2004), parental care behavior (Trivers, 1972; Zilkha
42 et al., 2017), foraging strategies (Ehl et al., 2018; Quillfeldt et al., 2011; Shannon et al.,
43 2006), dispersal (reviewed in (Greenwood, 1980; Trochet et al., 2016)), and territorial
44 displays (Reedy et al., 2017; Rosell and Thomsen, 2006). Though pervasive across
45 species and context, the genetic underpinnings of many types of sexually dimorphic
46 behavior are poorly understood. This is partially because males and females carry much
47 of the same genetic material; thus, sex-specific behavior is unlikely to be allele
48 dependent, except for the rare behaviors that are primarily associated with genes of large
49 effect on the sex chromosome. And, because behaviors are notoriously complex traits,
50 even sexually dimorphic behaviors influenced by genes of large effect on the sex
51 chromosome are likely to also be influenced by autosomal genes of minor effect
52 (Edwards et al., 2009; Lande, 1980).

53 Substantial headway has been made in elucidating the hormones and genes that
54 act as master regulators of sexually dimorphic traits and behaviors in model systems.
55 Sex-specific steroid hormone production is associated with sexually dimorphic behaviors
56 such as song production in song birds (Alward et al., 2013; Gurney and Konishi, 1980),
57 aggression in mammals (reviewed in (Hashikawa et al., 2018)), and spawning in fish
58 (Pradhan and Olsson, 2015). Similarly, sex-specific alternative splicing of master
59 regulator genes, such as *doublesex*, is associated with sexually dimorphic morphology

60 and behavior in arthropods (Kunte et al., 2014; Rideout et al., 2007; Rodriguez-Caro et
61 al., 2021; Wang et al., 2022). However, hormones and genes such as *doublesex* are often
62 upstream master regulators, and the presumably sexually dimorphic downstream gene
63 networks associated with hormone- and *doublesex*-related behaviors remain largely
64 unknown, outside of courtship initiation in the fruit fly *Drosophila melanogaster* (Datta
65 et al., 2008; Ruta et al., 2010) and song production in the zebra finch *Taeniopygia guttata*
66 (Olson et al., 2015; Woodgate et al., 2014) and the canary *Serinus canaria* (Alward et al.,
67 2018).

68 One sexually dimorphic behavior that is pervasive across animals is imprinting-
69 like mate preference learning. In imprinting-like mate preference learning, sexually
70 immature, or juvenile, individuals learn preferences for characteristics of adults (often,
71 but not always parents) of the opposite sex (Immelmann, 1975; ten Cate and Vos, 1999;
72 Verzijden et al., 2012). This behavior is inherently sexually dimorphic, as females learn
73 preferences for male traits, and males learn preferences for female traits (Kendrick et al.,
74 2001; ten Cate, 1985; Verzijden et al., 2008; Witte and Sawka, 2003). The sexual
75 dimorphism in trait learning can be quite extreme if adults are highly sexually dimorphic
76 or there are sex-specific signal modalities, such as male-limited pheromones or song.

77 To better understand the gene networks underlying sexual dimorphism in
78 imprinting-like learning, we examined sex-specific gene expression patterns in the brains
79 and eyes of *Bicyclus anynana* butterflies during an imprinting-like learning event. Both
80 male and female *B. anynana* butterflies exhibit imprinting-like learning, but they learn
81 preferences for different traits. Female *B. anynana* learn preferences for numbers of
82 dorsal forewing eyespots and are better at learning preferences for increasing numbers of

83 spots (Westerman et al., 2012). Conversely, male *B. anynana* learn preferences for dorsal
84 hindwing eyespots and are better at learning preferences for loss of spots (Westerman et
85 al., 2014). In addition to the observed sexual dimorphism in traits learned and
86 directionality of learning bias, females learn from males who exude a volatile sex
87 pheromone (Nieberding et al., 2008; Nieberding et al., 2012; Westerman and Monteiro,
88 2013), while males learn from females who, to our knowledge, do not have a volatile sex
89 pheromone. Thus, the two sexes are likely using different cues as unconditioned stimuli
90 to induce imprinting-like learning.

91 This sexual dimorphism in learning could be associated with sexual dimorphism
92 in perception, sexual dimorphism in downstream neural processing, or a combination of
93 these two processes. Previous studies suggest that male *B. anynana* have larger eyes and
94 more facets (ommatidia) than female *B. anynana*, and consequently, they potentially have
95 greater spatial acuity (Everett et al., 2012; Macias-Muñoz et al., 2015). If the observed
96 sexual dimorphism in learning is primarily associated with sexual dimorphism in visual
97 perception, we expect to see differential gene expression in the eyes of female and male
98 butterflies and in visual processing genes in the brain. Alternatively, the observed sexual
99 dimorphism in learning could be associated with sex-specific downstream processing, as
100 is seen in *D. melanogaster*'s response to pheromones (Datta et al., 2008; Ruta et al.,
101 2010). In this case we expect to find differential expression of genes unrelated to visual
102 processing in the brains of males and females. We might also find differential expression
103 of putative “magic genes,” genes subject to divergent selection that also pleiotropically
104 affect reproductive isolation, potentially by being associated with both the production of
105 and preference for given a trait (Servedio et al., 2011), such as butterfly wing patterning

106 genes. Many wing patterning genes are expressed in the heads of *B. anynana* (Ernst and
107 Westerman, 2021), and males and females have different wing patterns, with males
108 having brighter UV-reflective eyespots than females (Everett et al., 2012; Prudic et al.,
109 2011) while females have more dorsal hindwing spots than males (Westerman et al.,
110 2014). Additionally, because males but not females produce pheromones that can act as
111 the unconditioned stimuli for learning (Nieberding et al., 2008; Westerman and Monteiro,
112 2013), we may identify female-specific expression of genes in chemosensory processing
113 pathways.

114

115 **Materials and Methods**

116 *Study Species and Husbandry*

117 *Bicyclus anynana* is a sub-tropical African butterfly that has been reared in the lab
118 since 1988. The colony at the University of Arkansas was established in spring 2017
119 from ~1,000 eggs derived from a population in Singapore. Butterflies at the University of
120 Arkansas were reared in a climate-controlled greenhouse at ~27°C, 70% humidity, and
121 under a 13:11h light:dark cycle to mimic wet season conditions and ensure development
122 of the wet season phenotype (Brakefield and Reistma, 1991). Butterflies bred in the
123 laboratory have levels of genetic diversity comparable to those in natural populations, as
124 suggested by similar single-nucleotide polymorphism frequencies found in laboratory and
125 natural populations (Beldade et al., 2006; de Jong et al., 2013).

126 All adult butterflies used in this study hatched from eggs laid on young corn
127 plants (*Zea mays*) in breeding colony cages containing ~200-500 male and female *B.*
128 *anynana* butterflies. Plants with eggs were moved to cages containing additional corn

129 plants for larval consumption, and larvae were fed *ad libitum* until pupation. Upon
130 pupation, pupae were placed in mesh cages (31.8 cm × 31.8 cm × 31.8 cm; Bioquip,
131 Compton, CA, USA) until emergence. Upon emergence, butterflies were transferred to
132 sex- and age-specific cages to isolate the sexes from one another. All butterflies were
133 provided with fresh banana every other day.

134

135 *Behavioral assays and sample collection*

136 To examine sex-specific gene expression in the brains and eyes of *B. anynana*
137 butterflies during an imprinting-like learning event, both male and female *B. anynana*
138 butterflies were either subjected to an imprinting-like learning event with a conspecific of
139 the opposite sex bearing modified wing ornaments or were placed in a cage alone as a
140 control (Fig. 1A). These two treatments mirror the experiences of trained and naïve
141 individuals prior to mate choice assays in published butterfly imprinting-like learning
142 studies (Westerman et al., 2012; Westerman and Monteiro, 2013; Westerman et al.,
143 2014).

144 All behavioral assays and sample collection took place between November 2018 -
145 July 2019. Within one hour of dawn, assays were conducted by placing butterflies in a
146 novel mesh cage (39.9 cm × 39.9 cm × 59.9 cm; Bioquip, Compton, CA, USA) for a
147 three-hour observation period (Fig. 1A). Training behavioral assays consisted of either:
148 (1) a newly emerged male paired with a two-day-old, zero-spot female, for which black
149 paint (Enamel Glossy Black 1147, Testors, Rockford, IL, USA) was applied directly on
150 top of her two dorsal hindwing eyespot pupils to block all UV reflectance (for details see
151 (Westerman et al., 2014)) or (2) a newly emerged female paired with a two-day-old, four-

152 spot male, for which UV-reflective paint (White, FishVision, Fargo, ND, USA) was
153 applied between the two natural dorsal forewing eyespot pupils to create two extra
154 eyespot pupils (for details see (Westerman et al., 2012)). The UV-reflective paint closely
155 replicated the reflectance spectra of natural *B. anynana* eyespot pupils (Westerman et al.,
156 2012). All eyespot manipulations were performed one day prior to behavioral watches.
157 Control assays consisted of either one newly emerged male or one newly emerged female
158 placed in a novel mesh cage (39.9 cm × 39.9 cm × 59.9 cm; Bioquip, Compton, CA,
159 USA) in isolation, as this mirrored the control (naïve) treatment used in prior behavioral
160 assays assessing imprinting-like learning in *B. anynana* butterflies (Westerman et al.,
161 2012; Westerman and Monteiro 2013; Westerman et al., 2014). It is unknown what
162 effect, if any, being paired with a same-sex individual during this time period would have
163 on subsequent mating decisions, thus we did not collect heads from focal animals paired
164 with same-sex individuals. For any given training assay, a control assay using the same
165 sex as the training assay focal animal was conducted concurrently (e.g., for a newly
166 emerged male + zero-spot female training assay, a control assay consisting of a newly
167 emerged male in isolation was run in tandem). All behaviors exhibited by the observed
168 butterflies were recorded using SpectatorGo! (BIOBSERVE; Bonn, Germany). Observed
169 behaviors included: *flutter*, *fly*, *walk*, *rest* (wings closed), *bask* (wings open greater than
170 45°), *antenna wiggle*, *court* (as defined in (Nieberding et al., 2008)), and *copulate*.
171 Because *B. anynana* butterflies have sexually dimorphic wing patterns, these treatments
172 were not conducted blind. However, the behavioral analyses, final RNA-seq analyses,
173 and original observations/head collections were conducted by different people to help
174 reduce potential for observer bias.

175 After the three-hour behavioral watch, each butterfly's head was removed with
176 RNase-free scissors, transferred into a RNase-free microcentrifuge tube (Biotix; San
177 Diego, CA, USA), and immediately flash frozen in liquid nitrogen. Frozen samples were
178 then stored in a -80°C freezer until dissection and RNA extraction. We collected the
179 heads of ten individuals per group (trained male, trained female, naïve male, and naïve
180 female) to account for variation in response to training, as previous studies suggest that
181 ~75% of females and ~80% of males learn to prefer the trainer phenotype after a three-
182 hour training exposure (Westerman et al., 2012; Westerman et al., 2014).

183

184 *RNA extraction and cDNA library preparation*

185 To prevent RNA degradation during processing, heads were immersed in 500 µL
186 of pre-chilled RNAlater-ICE (Ambion; Austin, TX, USA) and incubated at -20°C for
187 approximately 18 hours prior to dissection. Thawed heads were then dissected under a
188 dissecting microscope (Zeiss Stemi 508; Jena, Germany) while submerged in RNAlater-
189 ICE to isolate eye and brain tissue. The eyes and brain for each sample were
190 mechanically disrupted separately in lysis buffer using RNase-free, disposable pestles,
191 and small (<200 nucleotides) and large (>200 nucleotides) RNA were extracted
192 separately for each tissue with the NucleoSpin® miRNA kit (Macherey-Nagel; Düren,
193 Germany). RNA quality and quantity were determined using a NanoDrop 2000 (Thermo
194 Fisher Scientific; Waltham, MA, USA), Qubit 2.0 (Invitrogen; Waltham, Massachusetts,
195 USA), and TapeStation 2200 (Agilent; Santa Clara, CA, USA).

196 Libraries were prepared for the eyes (left and right eye together; n=40) and brain
197 (n=40) for each individual using the KAPA mRNA HyperPrep Kit and Unique Dual-

198 Indexed Adapters (KAPA Biosystems; Wilmington, MA, USA), with 100 ng of large
199 RNA as input. After running all cDNA libraries on a TapeStation 2200 (Agilent; Santa
200 Clara, CA, USA) and confirming that they were of high quality, libraries were shipped to
201 the University of Chicago Genomics Facility on dry ice. All libraries were subjected to an
202 additional quality assessment using a 5300 Fragment Analyzer (Agilent; Santa Clara, CA,
203 USA), followed by 50 base pair (bp) single end (SE) sequencing across eight lanes of a
204 HiSeq 4000 (Illumina; San Diego, CA, USA).

205

206 *Read trimming, alignment, and quantification*

207 We concatenated the raw fastq files from all eight lanes for each library and
208 performed an initial quality assessment using FastQC v0.11.5
209 (<http://www.bioinformatics.babraham.ac.uk/projects/fastqc/>). One sample (TME_A3, a
210 trained eye sample) failed to sequence properly, so was discarded from downstream
211 analysis. Trimmomatic v0.38 was used to remove any Illumina sequencing adapters from
212 the raw reads (Bolger et al., 2014). We then aligned the adapter-trimmed reads for each
213 sample to the most recent *B. anynana* reference genome (v1.2; (Nowell et al., 2017))
214 using STAR v2.7.1a (Dobin et al., 2013) and quantified all reads using the “--quantMode
215 GeneCounts” option, which is equivalent to counts produced by the htseq-count script
216 from HTSeq (Anders et al., 2015).

217

218 *Differential gene expression analyses*

219 The read counts generated by STAR were used as input for the DESeq2 v1.24.0
220 package (Love et al., 2014) for R (Version 3.6.2, R Foundation for Statistical Computing,

221 Vienna, Austria) to conduct differential expression analyses. Specifically, we used the
222 generalized linear model design:

223 $y \sim sex + condition + sex:condition$

224 where expression (y) is a function of *sex* (male or female), *condition* (trained or naïve),
225 and their interaction (*sex:condition*). With this design, we made five different tissue-
226 specific comparisons: (1) naïve females vs. naïve males; (2) trained females vs. trained
227 males; (3) trained females vs. naïve females; (4) trained males vs. naïve males; and (5)
228 the interaction of *sex* and *condition*. To investigate the overall effect of training while
229 controlling for differences in expression specific to sex, we performed an additional
230 tissue-specific analysis that utilized the design:

231 $y \sim sex + condition$

232 Only genes with ≥ 10 total mapped reads were used for the differential expression
233 analyses. Gene expression comparisons were conveyed as the binary log of the
234 expression fold change ($\log_2 FC$), with $\log_2 FC$ shrinkage performed using the *ashr* method
235 (Stephens, 2017) to obtain more accurate estimates of effect size. Genes were considered
236 differentially expressed if they had a false discovery rate (FDR; (Benjamini and
237 Hochberg, 1995)) < 0.05 .

238 In addition to these standard differential expression analyses, we also performed
239 permutation tests similar to those utilized in Ghalambor et al. (2015) and Bloch et al.
240 (2018). Because this method does not assume gene independence (an unlikely assumption
241 given the nature and abundance of gene co-expression networks), the risk of over-
242 correction is reduced compared to other multiple testing correction methods, resulting in
243 a more accurate representation of the expression data structure (Slonim, 2002). For each

244 tissue, we randomly assigned both the sex and treatment for each sample to create 1,000
245 permuted sample phenotype tables. For each of the reassigned sample sets, we ran the
246 DESeq2 analysis exactly as we had for the original analysis, ultimately resulting in a null
247 distribution of 1,000 p-values for every gene. For any given gene, if the p-value from the
248 original analysis was less than the 1% tail of the permuted null distribution, it was
249 considered differentially expressed. Annotations for all differentially expressed genes,
250 including the identified putative vision- and chemsensory-related gene annotations, were
251 extracted from the *B. anynana* reference genome functional annotation from (Ernst and
252 Westerman, 2021).

253

254 *Weighted gene co-expression network analyses*

255 We performed separate weighted gene co-expression network analyses
256 (WGCNA) for the brain and eyes using the WGCNA v1.70-3 R package (Langfelder and
257 Horvath, 2008) following the WGCNA package developers' recommendations. We first
258 preprocessed the expression data by removing all genes with <10 reads in >90% of the
259 samples to minimize noise from lowly-expressed genes, and a variance-stabilizing
260 transformation was performed on the remaining data using the
261 "varianceStabilizingTransformation" function in DESeq2. Signed co-expression
262 networks for each tissue were constructed by building an adjacency matrix with type =
263 "signed," topological overlap matrix (TOM) with TOMType = "signed," and the soft-
264 thresholding power set to 12 for brains and 14 for eyes. We then identified modules of
265 co-expressed genes using the "cutreeDynamic" function with the following parameters:
266 deepSplit = 2, pamRespectsDendro = FALSE, and minClusterSize = 30. After initial

267 module identification, we merged modules of high co-expression similarity by first
268 calculating and clustering their eigengenes (the first principal component of a module
269 representing its gene expression profile (Langfelder and Horvath, 2008)) and employing
270 the “mergeCloseModules” function with “cutHeight” set to 0.25.

271 To identify modules that were significantly associated with any of the sample
272 traits, we used the “binarizeCategoricalVariable” function to create pairwise binary
273 indicators (“traits”) for our contrasts of interest (i.e., naïve male vs. naïve female, trained
274 female vs. naïve female, trained male vs. naïve male, and trained female vs. naïve
275 female) and correlated eigengenes with these sample traits. We then adjusted all p-values
276 using the FDR method (Benjamini and Hochberg, 1995), and any module-trait
277 correlations with an FDR <0.05 were considered significant. For all modules that showed
278 significant associations with sample traits, hub genes (genes with the highest
279 connectivity) were identified using the “chooseTopHubInEachModule” function.

280 For visualization and further analysis, both networks were then exported to
281 Cytoscape v3.8.2 (Shannon et al., 2003) using the “exportNetworkToCytoscape” function
282 with “threshold” set to 0.02. The Cytoscape “Network Analyzer” tool was used to obtain
283 further statistics regarding the connectivity of genes within the networks. Specifically, we
284 calculated three statistics for each gene: (1) degree (the number of other genes connected
285 to a given gene, with a larger number indicating a more highly connected gene), (2)
286 neighborhood connectivity (the average connectivity of all of a gene’s neighboring
287 genes), and (3) clustering coefficient (how connected a gene is to its neighboring genes
288 relative to how connected it could be, with “0” representing completely unconnected and
289 “1” representing maximum connectivity).

290

291 *Gene Ontology Analyses*

292 To facilitate the characterization of differentially expressed gene (DEG) sets and
293 significant modules, gene ontology (GO) enrichment analyses were performed using the
294 Fisher's Exact Test function in Blast2GO v5.2.5 (Conesa et al., 2005) with the GO
295 annotations extracted from Ernst and Westerman (2021). In each case, all genes in the
296 expression set (for the WGCNA analysis, all genes that were used in the co-expression
297 analysis) for the respective tissue were used as the reference set, and an FDR threshold of
298 <0.05 was set to identify significantly enriched GO terms. All DEG sets and significant
299 modules were tested for GO enrichment.

300 To further explore the differences between male and female tissues for each
301 condition, we used GOExpress v1.20.0 (Rue-Albrecht et al., 2016) to identify GO terms
302 that best classify the samples from two groups (e.g., female trained brains and male
303 trained brains) based on their gene expression profiles. For these analyses, reads were
304 first normalized to counts per million (CPM) with edgeR v3.28.1 (Robinson et al., 2010),
305 and only genes with ≥ 1 CPM for at least 10 samples (the maximum number of replicates
306 per group) were retained for the input expression matrix. The random forest was set to
307 10,000 trees, and GO terms that were associated with at least five genes and with a p-
308 value <0.05 after 1,000 permutations were considered significant.

309

310 *Identification of wing patterning genes*

311 In addition to examining differential expression, co-expression networks, and GO
312 signatures, we also investigated the expression patterns of known wing patterning genes,

313 as these genes have been hypothesized to act as “magic genes” and to have the capacity
314 to influence both preference as well as the preferred trait (Servedio, 2009; Smadja and
315 Butlin, 2011; Westerman, 2019). Specifically, we used the functional annotations and
316 butterfly wing patterning gene list from Ernst and Westerman (2021) to identify wing
317 patterning genes expressed in eye and brain tissue and to determine if they were
318 differentially expressed between the sexes. The genes included numerous *B. anynana*
319 wing patterning genes (Beldade and Peralta, 2017; Bhardwaj et al., 2018; Connahs et al.,
320 2019; Matsuoka and Monteiro, 2018; Monteiro et al., 2013; Monteiro et al., 2006;
321 Monteiro and Prudic, 2010; Ozsu et al., 2017; Prakash and Monteiro, 2018, 2020; Saenko
322 et al., 2011), as well as genes characterized in other butterfly species (Ficarrotta et al.,
323 2022; Martin and Reed, 2010; Nadeau et al., 2016; Reed et al., 2011; Westerman et al.,
324 2018; Woronik et al., 2019).

325

326 *Analysis of Behavior*

327 We first conducted a Shapiro-Wilk test to assess normality of the behavioral data.
328 We then performed a Kruskal-Wallis test to examine the effect of sex on behavior,
329 followed by a second Kruskal-Wallis test subset by treatment (naïve, trained, and trainer)
330 to test for the effect of sex on behavior in each treatment. We conducted a principal
331 components analysis (PCA) on behavior to search for hidden correlations and create new
332 composite variables (Table S1). We then performed a Kruskal-Wallis test to test for the
333 effect of sex on PC1, PC2, and PC3. We calculated a Bonferroni correction to account for
334 multiple testing, producing an adjusted significance value of $p = 0.0025$.

335

336 *Ethical Note*

337 All *B. anynana* butterflies were maintained in laboratory conditions as specified
338 by U.S. Department of Agriculture APHIS permit P526P-17-00343. Butterflies not used
339 for this experiment were maintained with ample food and water until natural death.

340

341

342 **Results**

343 We sequenced the eye and brain transcriptomes of observed animals, n=10 per
344 treatment per sex, which generated a total of nearly three billion high-quality 50 bp SE
345 reads (Table S2). Approximately 1.6 million reads (0.05% of raw reads) were removed
346 during adapter trimming, with 2.7 billion of the remaining reads (90% of trimmed reads)
347 mapping to the *B. anynana* reference genome (Nowell et al., 2017). Across all brain
348 libraries, 16,785 genes (74% of annotated genes in the genome) had at least 10 mapped
349 reads, while this was the case for 16,612 genes (73%) for eye libraries. For each tissue,
350 these gene sets were used as input for differential expression analyses.

351 During data quality assessment, gene expression clustering analysis revealed that
352 one sample (TMB_E2, a trained male brain sample) was likely mislabeled, as it clustered
353 with eye samples (Fig. S1). Because the two tissue types exhibited distinct clustering
354 patterns and tissue type accounted for approximately 85% of the variance, this sample
355 was discarded and not included in downstream analyses.

356 For all differential gene expression comparisons, we used DESeq2 to perform
357 both a standard differential expression analysis as well as a permutation-test-based
358 analysis, a method that eliminates the assumption of gene independence and provides a

359 more accurate representation of the data structure of gene expression datasets (Bloch et
360 al., 2018; Ghalambor et al., 2015; Slonim, 2002). Nearly all genes that were determined
361 to be differentially expressed in the standard DESeq2 analyses (Tables S3-S14) were also
362 identified as differentially expressed when employing the permutation test analyses
363 (Tables S3-S14). Moreover, because the permutation test analyses reduce potential over-
364 correction by multiple testing correction methods, a larger number of DEGs was found
365 for all comparisons. Therefore, all downstream analyses were conducted with the results
366 of the permutation-based differential expression tests. While all DEG sets obtained from
367 these analyses were tested for GO term enrichment, GO term enrichment results are only
368 reported for DEG sets with significantly enriched GO terms. Behavioral data analyses
369 found similar activity levels across sexes, confirming that sex-specific expression
370 patterns were not the result of sexually dimorphic activity levels (Tables S15 & S16).

371

372 *Trained male and female brains have distinct expression patterns*

373 Contrasting naïve female and male brains revealed a baseline of 253 genes that
374 were differentially expressed (Fig. 1B,C; Table S3). Conversely, 158 genes were found to
375 be differentially expressed between trained female and male brains (Fig. 1B,C,E; Table
376 S4). Of these gene sets, 127 genes were unique to the training contrast (Fig. 1C), several
377 of which are linked to various neural processes, including neurodevelopment, neural
378 signaling, eye development, and phototransduction (Fig. 2; Table S17). Additionally, four
379 genes with putative chemosensory functions were differentially expressed, all of which
380 were upregulated in females relative to males (chemosensory protein 6,
381 *BANY.I.2.gI2995*; ejaculatory bulb-specific protein 3-like, *BANY.I.2.gI2992*; ejaculatory

382 bulb-specific protein 3-like, *BANY.1.2.g12993*; and odorant receptor Or2-like,
383 *BANY.1.2.g25738*) (Ernst and Westerman, 2021). Finally, a gene encoding vitellogenin-
384 like (*BANY.1.2.g11921*), a protein known to influence the social behavior of numerous
385 insect species (Morandin et al., 2019; Nelson et al., 2007; Roy-Zokan et al., 2015), was
386 also upregulated in females.

387 GOExpress analyses, which find GO terms that best classify samples from two
388 separate groups, identified 171 GO terms that were significantly associated with
389 differences between naïve female and male brains ($p < 0.05$; Table S18), while 166 GO
390 terms differentiated trained female and male brains ($p < 0.05$; Table S19). To eliminate
391 baseline differences, we removed significant terms that were also found in the naïve
392 results, resulting in 51 GO terms linked to differences specific to training (Table S19). Of
393 these terms, several are linked to neural processing, including calmodulin binding ($p =$
394 0.004), vesicle docking involved in exocytosis ($p = 0.042$), gap junction ($p = 0.046$), and
395 neuropeptide signaling pathway ($p = 0.008$).

396

397 *Trained male and female eyes have distinct expression patterns*

398 Differential expression analysis found a baseline of 443 genes that were
399 differentially expressed between naïve female and male eyes (Fig. 1B,D; Table S5). By
400 contrast, 180 DEGs were found for the trained female vs. male comparison (Fig. 1B,D,F;
401 Table S6). In total, 142 genes were unique to the trained eye contrast (Fig. 1D), including
402 genes encoding proteins linked to neurodevelopment, neural signaling, hormone
403 signaling, and vision (Fig. 2; Table S17). Moreover, three genes putatively linked to
404 circadian rhythms showed differential expression, including circadian clock-controlled

405 protein-like (*BANY.1.2.g04378*), which was upregulated in males, and circadian clock-
406 controlled protein-like (*BANY.1.2.g05915*) and protein takeout-like (*BANY.1.2.g05914*),
407 which were both upregulated in females. The takeout gene (*to*) is also associated with
408 male courtship behavior in *D. melanogaster* (Dauwalder et al., 2002), making its
409 upregulation in sexually immature *B. anynana* females during a training period
410 intriguing.

411 GOExpress analyses revealed 165 and 138 GO terms that were significantly
412 linked to expression differences between the sexes for naïve and trained eyes,
413 respectively ($p < 0.05$; Tables S20, S21). Removal of terms that overlapped both the
414 naïve and trained sets resulted in 37 GO terms linked to sex-specific differences in
415 response to training (Table S21). A number of these terms were associated with neural
416 processes and sensory transduction, including chloride transmembrane transport ($p =$
417 0.007), chloride channel activity ($p = 0.01$), vesicle docking involved in exocytosis ($p =$
418 0.017), and G protein-coupled peptide receptor activity ($p = 0.025$).

419

420 *Training has sex-dependent effects on expression patterns in brains and eyes*

421 Sex-specific pairwise comparisons between trained and naïve tissues revealed
422 many DEGs in all sex-dependent comparisons.

423 Starting with the female comparisons, a total of 135 genes were found to be
424 differentially expressed between trained and naïve female brains (Fig. 1B,C; Table S7),
425 many of which have potential roles in neural development, neural signaling, hormone
426 metabolism, and eye-related processes (Fig. 2; Table S17).

427 For the trained vs. naïve female eyes comparison, differential expression analysis
428 identified 291 DEGs (Fig. 1B,D; Table S8). GO enrichment analysis found 12 GO terms
429 enriched in this gene set, with the top being mitochondrion ($FDR=4.04\times10^{-4}$),
430 intracellular organelle ($FDR=4.04\times10^{-4}$), and organelle ($FDR=5.23\times10^{-4}$) (Table S22).
431 There were several genes of interest in the trained vs. naïve female eye contrast,
432 including genes linked to neural development and signaling, hormone signaling, eye
433 development, and vision (Fig. 2; Table S17).

434 Similar to the female brains comparison, the trained vs. naïve male brains
435 comparison found 135 DEGs (Fig. 1B,C; Table S9), including several genes associated
436 with neurodevelopment, neural signaling, and eye development (Fig. 2; Table S17).

437 Differential expression analysis revealed 243 DEGs for the trained vs. naïve male
438 eyes comparison (Fig. 1B,D; Table S10). Again, numerous genes involved with neural
439 development, neural signaling, hormone signaling, vision, and eye development were
440 found to be differentially expressed between trained and naïve male eyes (Fig. 2; Table
441 S17).

442 Moreover, 63 genes in the brain and 80 genes in the eye were found to have a
443 significant sex:condition interaction, indicating that training differentially affected their
444 expression in females versus males (Fig. 1B,C,D; Tables S11, S12). In both tissues, these
445 sex:condition interactions were found for genes involved with neural development and
446 signaling, and interactions were also found for genes linked to eye development in the
447 eye comparison (Table S17). In addition, a gene putatively involved with chemoreception
448 (olfactory receptor 21, *BANY.1.2.g12009*; (Ernst and Westerman, 2021)) and a gene
449 associated with regulating circadian rhythms (protein LSM12 homolog,

450 *BANY.1.2.g13734*; (Lee et al., 2017)) showed significant sex:condition interactions in the
451 brain and eyes, respectively.

452

453 *Training has a sex-independent effect on gene expression in brains*

454 Testing for the overall effect of training while controlling for differences in
455 expression due to sex revealed 283 genes that were differentially expressed in trained vs.
456 naïve brains (Fig. S2A; Table S13). Many of the genes in this gene set have functions
457 related to neurodevelopment, neural signaling, hormone signaling, and eye development
458 (Fig. 2; Table S17). Moreover, LSM12 homolog (*BANY.1.2.g13734*), which showed a
459 significant sex:condition interaction in the eyes, was also differentially expressed and was
460 upregulated in naïve brains.

461

462 *Training has a sex-independent effect on gene expression in eyes*

463 In total, 658 DEGs were identified for the trained vs. naïve eyes comparison when
464 controlling for sex (Fig. S2B; Table S14). GO enrichment analysis revealed 30 enriched
465 GO terms, with the top terms being mitochondrion (FDR=1.92×10⁻⁶), protein-containing
466 complex (FDR=3.03×10⁻⁶), and intracellular organelle (FDR=5.17×10⁻⁶) (Table S23).

467 Several of these DEGs have putative functions in neurodevelopment, neural
468 signaling, hormone signaling, eye development, and vision (Fig. 2; Table S17). In
469 addition, a number of genes linked to learning and memory were differentially expressed
470 between trained and naïve eyes. Several of these genes were upregulated in trained eyes,
471 including nipped-B protein (*BANY.1.2.g01712*), Ca(2+)/calmodulin-responsive adenylylate
472 cyclase (*BANY.1.2.g01825*), transcription factor Adf-1-like (*BANY.1.2.g03430* and

473 *BANY.1.2.g08959*), adenylate cyclase type 8 (*BANY.1.2.g03804*), neurobeachin-like
474 (*BANY.1.2.g12252* and *BANY.1.2.g12258*), and ataxin-2 homolog isoform X1
475 (*BANY.1.2.g13668*). Conversely, cyclic AMP response element-binding protein B
476 isoform X3 (*BANY.1.2.g01685*), transcription factor Adf-1-like (*BANY.1.2.g24076*),
477 probable RNA helicase armi isoform X1 (*BANY.1.2.g17424*), and fatty acid-binding
478 protein-like (*BANY.1.2.g17524*) were upregulated in naïve eyes. Finally, two genes
479 involved with male courtship in *Drosophila* (calcium/calmodulin-dependent 3',5'-cyclic
480 nucleotide phosphodiesterase 1 isoform X1, *BANY.1.2.g07806*; and cytoplasmic dynein 2
481 heavy chain 1, *BANY.1.2.g19627*) were upregulated in *B. anynana* eyes in the training
482 condition.

483

484 *One gene network is associated with training condition in the brain*

485 To investigate gene networks that are associated with an imprinting-like learning
486 experience, we performed tissue-specific WGCNAs. Brain co-expression network
487 analysis identified 17 modules, which was reduced to 11 after merging highly correlated
488 modules (Fig. 3A; Fig. S3A). Of these modules, only one (the red module) was
489 significantly correlated with a trait, specifically the trained male brain vs. naïve male
490 brain contrast (i.e., the red module was significantly correlated with training condition for
491 male brains; $r=0.6$; $FDR=0.004$) (Fig. 3C; Fig. S3B). This module consisted of 655 genes
492 (Table S24), with the top hub gene (i.e., the most highly connected gene) identified as
493 NADH dehydrogenase [ubiquinone] 1 beta subcomplex subunit 7-like
494 (*BANY.1.2.g00209*). GO enrichment analyses found five significantly enriched GO terms

495 in the red module, which were linked to nucleic acid and cyclic compound binding and
496 mRNA metabolism (Table S25; Fig. 4A).

497 Many genes within the red module are linked to various neural and sensory
498 processes. Of particular interest, 41 DEGs identified in the trained vs. naïve male brain
499 contrast were also present in the red module network (Table S24). Many of these genes
500 encode proteins linked to neural development, such as protein smoothened
501 (*BANY.1.2.g01253*), protein abrupt-like isoform X5 (*BANY.1.2.g17381*), histone
502 acetyltransferase Tip60 isoform X6 (*BANY.1.2.g17798*), Down syndrome cell adhesion
503 molecule-like protein (*BANY.1.2.g23099*), Down syndrome cell adhesion molecule-like
504 protein CG42256 (*BANY.1.2.g23100*), and helicase domino (*BANY.1.2.g24509*).
505 Additionally, others encode proteins involved with neural signaling, such as piezo-type
506 mechanosensitive ion channel component isoform X1 (*BANY.1.2.g11981*) and V-type
507 proton ATPase subunit a (*BANY.1.2.g18298*) and eye development, such as *trr*,
508 (*BANY.1.2.g04855*) and *crb* (*BANY.1.2.g13186*) (Table S17). In addition to its role in eye
509 development, *trr* is also involved with short term courtship memory in *D. melanogaster*
510 (Sedkov et al., 2003).

511

512 *Several gene networks are associated with training condition in the eyes*

513 Eye co-expression network analysis identified 20 modules, which was reduced to
514 13 after merging highly correlated modules (Fig. 3B, Fig. S4A). Of these modules, seven
515 (the black, blue, cyan, grey60, magenta, midnight blue, and tan modules) were
516 significantly correlated with at least one contrast, and DEGs for the correlated contrast(s)
517 were present in all seven of these modules (Fig. 3D, Fig. S4; Tables S26-S38).

518 Two of these modules (the black and magenta modules), both of which were
519 significantly correlated with the trained male vs. naïve male eyes contrast, were of
520 particular interest based on their GO enrichment profiles. The black module ($r=0.66$;
521 $FDR=2.00\times 10^{-4}$) consisted of 366 genes centered around the top hub gene gamma-
522 aminobutyric acid type B receptor subunit 2 (*BANY.1.2.g00039*), a component of the
523 receptor for the neurotransmitter GABA (S27 Table; Fig. 3D, Fig. S4C). Moreover, 73
524 GO terms were enriched in this module, most of which are associated with neural
525 processes (e.g., neurotransmitter receptor activity involved in regulation of postsynaptic
526 membrane potential, chemical synaptic transmission, and excitatory postsynaptic
527 potential) (Table S29; Fig. 4B). A total of 32 DEGs from the trained male vs. naïve male
528 eyes contrast were found in the black module, nearly half of which are associated with
529 neural and eye development and neural signaling. Differentially expressed development
530 genes include protein unc-80 homolog isoform X10 (*BANY.1.2.g05052*), microtubule-
531 associated protein futsch-like (*BANY.1.2.g08693*), delta and Notch-like epidermal growth
532 factor-related receptor (*BANY.1.2.g09881*), protein abrupt-like isoform X1
533 (*BANY.1.2.g17383*), and *rst* (*BANY.1.2.g15359*) (Table S17; Table S28). Moreover,
534 differentially expressed neural signaling genes include sodium channel protein para
535 (*BANY.1.2.g00003*), potassium voltage-gated channel subfamily KQT member 1 isoform
536 X2 (*BANY.1.2.g01557*), adenylate cyclase type 8 (*BANY.1.2.g03804*), neuroligin-4, Y-
537 linked isoform X1 (*BANY.1.2.g06479*), acetylcholine receptor subunit alpha-like 2
538 (*BANY.1.2.g06669*), potassium channel subfamily T member 2 isoform X10
539 (*BANY.1.2.g09307*), calcium/calmodulin-dependent protein kinase kinase 1
540 (*BANY.1.2.g12425*), sodium leak channel non-selective protein (*BANY.1.2.g19402*),

541 gamma-aminobutyric acid type B receptor subunit 2 isoform X3 (*BANY.1.2.g21830*), and
542 dopamine receptor 2-like, (*BANY.1.2.g24500*) (Table S17; Table S28).

543 The magenta module ($r=0.59$; $FDR=0.002$) consisted of 417 genes with a hub
544 gene of disintegrin and metalloproteinase domain-containing protein 33-like (Fig. S4D;
545 Table S30) and showed an enriched GO term profile similar to that of the black module
546 (Fig 4C; Table S31). Specifically, the terms transmembrane signaling receptor activity, G
547 protein-coupled receptor signaling pathway, G protein-coupled receptor activity,
548 signaling receptor activity, and molecular transducer activity were found to be enriched
549 in both the black and magenta modules. In total, 21 DEGs from the trained male vs. naïve
550 male eyes contrast were found in the magenta module, a third of which have putative
551 functions in neurodevelopment (protein smoothened isoform X2, *BANY.1.2.g01254*;
552 putative defective proboscis extension response, *BANY.1.2.g12002*; rho GTPase-
553 activating protein 100F, *BANY.1.2.g12733*; and dynamin-like 120 kDa protein,
554 mitochondrial, *BANY.1.2.g23042*), neural signaling (regulating synaptic membrane
555 exocytosis protein 1 isoform X1, *BANY.1.2.g10739*; and dopamine receptor 1,
556 *BANY.1.2.g24271*), and eye development (adenylyl cyclase-associated protein 1 isoform
557 X1, *BANY.1.2.g04305*) (Tables S17, S30).

558

559 *Wing patterning genes are differentially expressed in both the brain and eyes*

560 To investigate whether putative “magic genes,” or genes that influence both a
561 given trait as well as preference for that trait, are expressed in the brain and eyes of *B.*
562 *anynana*, we also explored the expression patterns of known butterfly wing patterning
563 genes. A total of 53 wing patterning genes were found to be expressed in the brain, while

564 50 were expressed in the eyes (Table S39). Although none of these wing patterning genes
565 exhibited sex-specific expression (meaning only expressed in one sex) in either tissue, 46
566 were in common across the two tissues. Seven genes showed brain-specific expression,
567 including homologs for cortex (*BANY.1.2.g04256*), engrailed (*BANY.1.2.g14935*), CD63-
568 antigen (*BANY.1.2.g12556*), aristaless (*BANY.1.2.g21346* and *BANY.1.2.g24453*), and
569 BarH-1 (*BANY.1.2.g19326* and *BANY.1.2.g22154*), while four exhibited eye-specific
570 expression, including homologs for hedgehog (*BANY.1.2.g04016*) and CD63-antigen
571 (*BANY.1.2.g20540*, *BANY.1.2.g25497*, and *BANY.1.2.g25594*).

572 Several wing patterning genes were identified as differentially expressed for
573 various contrasts, including between and within sexes, in both tissue types. For the naïve
574 female vs. male brain contrast, sal-like protein 1 (*BANY.1.2.g09547*) and CD63 antigen-
575 like (*BANY.1.2.g23713*) were both upregulated in females (Fig. 5, Table S3). In the
576 trained female vs. male brain contrast protein apterous-like isoform X2
577 (*BANY.1.2.g08342*) was upregulated in males (Fig. 5, Table S4). In the naïve female vs.
578 male eye contrast CD63 antigen-like (*BANY.1.2.g25497*) was upregulated in females
579 (Fig. 5, Table S5). Moreover, in the eye interaction contrast CD63 antigen-like
580 (*BANY.1.2.g25497*) was upregulated in trained females and naïve males (Fig. 5, Table
581 S12), and in the trained vs. naïve eye controlling for sex contrast CD63 antigen-like
582 isoform X2 (*BANY.1.2.g10818*) was upregulated in naïve eyes (Fig. 5, Table S14).

583 When comparing within sexes, three known wing patterning genes were
584 differentially expressed in male brains or eyes. In the trained vs. naïve male brain
585 contrast, protein bric-a-brac 2-like isoform X4 (*BANY.1.2.g17823*) was upregulated in
586 trained males while Homeobox protein invected (*BANY.1.2.g18817*) was upregulated in

587 naïve males (Fig. 5, Table S9). By contrast, in the trained vs. naïve male eye comparison
588 protein apterous-like isoform X2 (*BANY.1.2.g08342*) was upregulated in trained males
589 (Fig. 5, Table S10). No known wing patterning genes were differentially expressed in
590 female-specific contrasts.

591

592 **Discussion**

593 Here we identified a number of genes that were differentially expressed in the
594 brains and eyes of females and males during an imprinting-like learning event, as well as
595 several associated gene networks. We found DEGs in both tissue types, suggesting that
596 imprinting-like learning, and sexually dimorphic aspects of this learning process, are
597 associated with transcriptional changes in both the peripheral sensory system and the
598 brain. A number of chemosensory genes were upregulated in females relative to males,
599 supporting the hypothesized female-specific use of pheromones in the mate preference
600 learning process (Westerman and Monteiro, 2013; Westerman et al., 2014). Furthermore,
601 a suite of butterfly wing patterning genes, which have long been hypothesized to also
602 influence mate preference and potentially serve as “magic genes,” were also differentially
603 expressed in the eyes and brains of *B. anynana* butterflies during training events, further
604 supporting their hypothesized role in mate preference and speciation.

605 One of the more interesting aspects of sexually dimorphic imprinting-like learning
606 in *B. anynana* is the presence/absence of sex pheromones in males versus females.
607 Previous studies have shown that the male sex pheromone is an indicator of age
608 (Nieberding et al., 2012), is species-specific (Bacquet et al., 2015; Nieberding et al.,
609 2008), is equally weighted with visual signals during female mate selection (Costanzo

610 and Monteiro, 2007), and influences the valence females learn to associate with visual
611 signals during imprinting-like learning (Westerman and Monteiro, 2013). Thus, male
612 chemical cues are known to be important for female mate choice in this system. On the
613 other hand, a sex pheromone has not been discovered in female *B. anynana*, and it
614 remains unclear what unconditioned stimulus males use to assign positive valence to
615 number of hindwing spots. The results of this study appear to support this sex-specific
616 use of olfactory signals during the learning process. The most clear-cut finding
617 supporting this hypothesis is that chemosensory genes, including an odorant receptor, are
618 upregulated in females relative to males during the training period. Odorant receptors are
619 differentially expressed in response to training in other species that rely on olfactory
620 signals during mate preferences, such as female *Xiphophorus malinche* swordtail fish
621 (Cui et al., 2017) and male and female mice (*Mus musculus*) (Broad and Keverne, 2012).
622 While both sexes of *M. musculus* learn olfactory signals and exhibit olfaction-associated
623 differential gene expression after early odor exposure, it is unknown whether male *X.*
624 *malinche* fish respond to training with olfactory cues, or whether subsequent differential
625 expression of odorant receptors is sexually dimorphic. It would be interesting to see if the
626 sexual dimorphism in chemosensory gene expression we observed in *B. anynana* also
627 occurs in swordtail fish, or whether these patterns are more similar to mice, given that
628 both male and female swordtails exude olfactory signals (Cui et al., 2017; Wong et al.,
629 2005).

630 A second result that may be related to the differential use of olfactory cues during
631 the learning (and mate choice) process is that we found a larger set of gene networks
632 associated with the training condition in the brains and eyes of males than in females.

633 This could be a result of imprinting-like learning being more consistent in males than
634 females (80% vs 75% prefer the trainer phenotype) (Westerman et al., 2012; Westerman
635 et al., 2014). However, it could also be a side effect of females relying more heavily on
636 olfactory signals than males, as we did not include antennae in our analyses and
637 consequently may have missed learning-associated gene networks that reside in female
638 antennae. Female *Heliconius melpomene* and *Heliconius cydno* butterflies are sensitive to
639 male pheromones (Byers et al., 2020) and exhibit different antennae expression profiles
640 before and after copulation as well as sex-specific expression profiles (van Schooten et
641 al., 2020). It would be interesting to see if *B. anynana* females exhibit training-specific,
642 sexually dimorphic antennae expression profiles that correspond to their sex-specific
643 emphasis on olfactory signals during the preference learning and mate selection process.

644 While the gene expression patterns of the antennae are unknown for these
645 animals, we did find training-specific, sexually dimorphic gene expression patterns in *B.*
646 *anynana* eyes. Because female and male *B. anynana* butterflies learn preferences for
647 different visual signals and exhibit visual learning biases in different directions (gains and
648 losses, respectively (Westerman et al., 2012; Westerman et al., 2014)), one of our
649 hypotheses was that we would see sexually dimorphic expression of vision-related genes
650 during the learning process, especially in the eyes. Although we did not observe
651 differential expression of any opsins, we did find sex-dependent expression patterns of a
652 number of vision-related genes, including an ommochrome-binding protein, retinol
653 dehydrogenase 11, rhodopsin kinase 1 (*Gprk1*), and arrestin homolog isoform X2.
654 Ommochrome pigments act as filtering pigments in the eyes of butterflies, limiting the
655 wavelengths of light a butterfly can see (Arikawa and Stavenga, 2014; Stavenga, 2002).

656 These filtering pigments are sexually dimorphic in a number of different species,
657 including *H. cydno*, *H. melpomene*, *Heliconius pachinus*, and *Colias erate*, and are
658 hypothesized to influence mate choice in these systems (Buerkle et al., 2022; Ogawa et
659 al., 2013). It remains unclear whether filtering pigment type or distribution is sexually
660 dimorphic in *B. anynana*, or whether filtering pigment production or distribution in the
661 eye is plastic in response to circadian rhythms, social scenario, or age. However, our
662 findings of socially-dependent expression patterns of ommochrome-binding protein and a
663 number of other vision-related genes suggest that vision is highly dynamic, not just in the
664 context of light environment (Obara et al., 2008; Sakai et al., 2018; Wright et al., 2020)
665 and circadian rhythms (Li et al., 2008; Li et al., 2005), but also in response to social
666 environment.

667 In addition to finding vision-associated differentially expressed genes, a number
668 of learning and memory genes were differentially expressed during training/imprinting,
669 specifically in the eyes, including dopamine receptors. This pattern is strongest in males,
670 though it is also observed when the data for both sexes are pooled. Moreover, the most
671 highly connected gene for a gene network associated with training condition in male eyes
672 (the black module) encodes a component of the receptor for the neurotransmitter GABA,
673 gamma-aminobutyric acid type B receptor subunit 2. This network also contained a
674 variety of genes involved with neural processing that were differentially expressed
675 between trained and naïve male eyes, including additional neurotransmitter receptors
676 (acetylcholine receptor subunit alpha-like 2, gamma-aminobutyric acid type B receptor
677 subunit 2 isoform X3, and dopamine receptor 2-like). While there is some debate over
678 whether eyes should be considered part of the peripheral nervous system or the central

679 nervous system in vertebrates (London et al., 2013), there has been less attention given to
680 the potentially broad cognitive role of the retina in comparison to the optic lobe in insects
681 (as illustrated by (Perry et al., 2017)). Our findings indicate that transcription in the
682 butterfly eye changes in response to social scenario (presence/absence of a sexually
683 mature conspecific of the opposite sex) and that this change includes the transcription of
684 genes associated with higher processing. These results suggest that neurogenomic
685 processes associated with cognition might not be limited to the optic lobe and central
686 brain in insects, but might also occur in the retina. It is interesting to note that dopamine
687 is not only important for learning (Schwaerzel et al., 2003), but is also critical for eye
688 development (reviewed in (Zhou et al., 2017)) and consequently may influence visual
689 learning in *B. anynana* butterflies in both sensory processing and higher processing
690 pathways. The differential expression of dopamine receptors in males but not females
691 further supports the hypothesis that males may be placing greater emphasis on visual
692 signals than females during these social encounters.

693 It is important to keep in mind that we compared the transcriptomes of males and
694 females during social experiences that induce learning with the transcriptomes of naïve
695 individuals of the same age; we did not collect transcriptomic data for males and females
696 during mixed-sex social experiences that do not induce learning or during social
697 experiences with individuals of the same sex. Thus, some of the DEGs that we observed
698 are likely to be associated with sexually dimorphic responses to social interactions, not
699 learning per se, as has been previously shown in female *Xiphophorus* swordtail fish
700 (Cummings et al., 2008). It would be interesting to see if early social experience with
701 sexually mature individuals of the same sex also influences future mate choice, as that

702 has not been tested in this system (Westerman et al., 2012; Westerman & Monteiro 2013;
703 Westerman et al., 2014). It would also be intriguing to investigate whether exposure to
704 sexually mature individuals with wing patterns that are difficult to learn (e.g., 0 spots for
705 females and 2 spots for males) results in different suites of DEGs in the brain and/or eyes
706 of either sex. Moreover, it would be worthwhile to explore if similar suites of genes are
707 expressed in sexually mature females and males in a sexually dimorphic manner, as the
708 current experiment focused on females and males that were sexually immature (the
709 training period in this study occurs prior to sexual receptivity in both sexes (Westerman
710 et al., 2012; Westerman et al., 2014)).

711

712 *Broad role of sensory receptors and neurotransmitters in sexually dimorphic behavior*

713 Although neurogenomic assessment of sexually dimorphic behavior is relatively
714 rare to date, similarities between our results and those in other animal systems suggest
715 common mechanisms may underlie sexually dimorphic behavior across animal taxa.
716 Sensory receptors seem to be especially important and connected to downstream sexually
717 dimorphic gene networks. For example, odorant receptor expression influences female
718 receptivity and male ability to differentiate between the sexes in *D. melanogaster* (Datta
719 et al., 2008), male and female zebra finches exhibit different brain gene expression
720 profiles when listening to the same song (Gobes et al., 2009), a number of butterfly
721 species exhibit sexually dimorphic opsin expression patterns (Buerkle et al., 2022;
722 Everett et al., 2012), and *B. anynana* exhibit sexually dimorphic chemical receptor
723 expression during a mate preference learning event (this study). Sexually dimorphic
724 catecholamine-associated expression (receptors or binding proteins, for example) also

725 appears to be important for driving sexually dimorphic social behaviors across taxa, as
726 illustrated by sex-dependent distribution of tyrosine hydroxylase in male and female
727 plainfin midshipman fish brains (Goebrecht et al., 2014) and sexually dimorphic
728 association of dopamine receptors and binding proteins with social interactions in *B.*
729 *anynana* butterflies (this study). Pathways integrating sensory receptors and
730 catecholamine neurotransmitters may be particularly fruitful for future study of sexually
731 dimorphic behaviors across animal taxa.

732

733 *Wing patterning genes may be “magic” genes*

734 While butterfly wing patterning genes have long been hypothesized to play a role
735 in shaping both wing pattern and preference for wing pattern (Kronforst and Papa, 2015;
736 Kronforst et al., 2006; Merrill et al., 2015; Merrill et al., 2019; Naisbit et al., 2001),
737 evidence supporting this hypothesis has been rare. However, wing pattern elements
738 (eyespots, specific colors, and specific patterns) are known sexual ornaments in many
739 butterfly species (Ellers and Boggs, 2003; Ficarrotta et al., 2022; Jiggins et al., 2001;
740 Kronforst et al., 2006; Obara et al., 2008; Robertson and Monteiro, 2005; Westerman et
741 al., 2019), and the genes underlying a number of these sexual ornaments have been
742 functionally characterized (Ficarrotta et al., 2022; Kunte et al., 2014; Matsuoka and
743 Monteiro, 2018; Monteiro et al., 2013; Nadeau et al., 2016; Ozsu et al., 2017; Reed et al.,
744 2011; Westerman et al., 2018) (please note that neither of these citation lists are
745 exhaustive). Thus, butterflies are a great system for testing the hypothesis that genes
746 influencing sexual ornamentation may also influence preference for those sexual
747 ornaments. Here we show that a number of wing patterning genes are differentially

748 expressed in the brain and eyes during a sexual (training) encounter. Not only are these
749 genes associated with wing patterning in a range of butterfly species, but a subset of these
750 genes are specifically associated with aspects of eyespot production in *B. anynana*
751 (Brunetti et al., 2001; Ozsu and Monteiro, 2017; Prakash and Monteiro, 2018) and/or
752 with UV reflectance (Ficarrotta et al., 2022). Because male and female *B. anynana* learn
753 preferences for eyespot number, and specifically the UV-reflective center of the eyespots
754 (Westerman et al., 2012; Westerman et al., 2014), these genes that both influence
755 eyespots or UV scale production and are differentially expressed in the brain or eyes
756 during an intersexual social encounter (*invected*, *spalt*, *apterous*, *CD63 antigen-like*, and
757 *bric-a-brac*) are particularly promising candidate magic genes in the *B. anynana* system.
758 The brain and eye expression profiles of genes known to influence wing patterning traits
759 important for mate selection in other butterfly systems, such as *BarH-1* (Woronik et al.,
760 2019), *artistaless* (Westerman et al., 2018), *cortex* (Nadeau et al., 2016), and *doublesex*
761 (Kunte et al., 2014), support the hypothesis that these genes may be expressed in the
762 brains or eyes of the butterfly species using these genes to control wing pattern elements
763 under sexual selection. Future studies should explore the pervasiveness of genes
764 influencing both wing pattern (sexual ornamentation) and mate preference across the
765 Lepidoptera.

766

767 **Conclusions**

768 Here we show that sexually dimorphic, imprinting-like learning is associated with
769 sexually dimorphic gene expression in the brains and eyes of *B. anynana* butterflies
770 during a training event. Differentially expressed genes include sensory receptors and

771 genes associated with neurotransmitters in both tissue types, indicating dynamic and sex-
772 specific responses to social scenario in both the peripheral and central nervous systems.
773 Sexually dimorphic expression of chemosensory genes supports the role of pheromones
774 in female but not male imprinting-like learning, while the learning-related expression of
775 numerous wing patterning genes highlight the potential for these genes to influence both
776 wing pattern and mate preference. Future research should explore the gene and neural
777 networks bridging sexually dimorphic sensory receptors to sexually dimorphic behavior,
778 and determine the functional role of wing patterning genes in mate preference in other
779 lepidopterans.

780

781 **Acknowledgements**

782 We thank Matthew Murphy, Grace Hirzel, Deonna Robertson, and Sushant Potdar
783 for assistance with animal husbandry. This research was supported by NSF IOS grant
784 #1937201 to ELW, an Arkansas Biosciences Institute (the major research component of
785 the Arkansas Tobacco Settlement Proceeds Act of 2000) grant to ELW, a University of
786 Arkansas Honors College grant to GAA & ELW, the Arkansas High Performance
787 Computing Center, which is funded through multiple NSF grants and the Arkansas
788 Economic Development Commission, and the University of Arkansas.

789

790 **Competing Interests:** The authors declare no competing interests.

791

792 **Literature Cited**

793

794 Alward BA, Balthazart J, Ball GF, 2013. Differential effects of global versus local
795 testosterone on singing behavior and its underlying neural substrate. *Proceedings*
796 of the National Academy of Sciences 110:19573-19578. doi:
797 10.1073/pnas.1311371110.

798 Alward BA, Cornil CA, Balthazart J, Ball GF, 2018. The regulation of birdsong by
799 testosterone: Multiple time-scales and multiple sites of action. *Hormones and*
800 *Behavior* 104:32-40. doi: 10.1016/j.yhbeh.2018.04.010.

801 Anders S, Pyl PT, Huber W, 2015. HTSeq—a Python framework to work with high-
802 throughput sequencing data. *Bioinformatics* 31:166-169. doi:
803 10.1093/bioinformatics/btu.

804 Arikawa K, Stavenga DG, 2014. Insect photopigments: Photoreceptor spectral
805 sensitivities and visual adaptations. In: Hunt DMea, editor. *Evolution of Visual*
806 and Non-visual Pigments

807 New York: Springer Science + Business p. 137-162.

808 Bacquet PMB, Brattstrom O, Wang H-L, Allen C, Lofstedt C, Brakefield PM, Nieberding
809 CM, 2015. Selection on male sex pheromone composition contributes to butterfly
810 reproductive isolation. *Proceedings of the Royal Society of London B*
811 282:20142734. doi: 10.1098/rspb.2014.2734.

812 Beldade P, Peralta CM, 2017. Developmental and evolutionary mechanisms shaping
813 butterfly eyespots. *Current Opinion in Insect Science* 19:22-29. doi:
814 10.1016/j.cois.2016.10.006.

815 Beldade P, Rudd S, Gruber JD, Long AD, 2006. A wing expressed sequence tag
816 resourcne for *Bicyclus anynana* butterflies, an evo-devo model. *BMC Genomics*
817 7. doi: 10.1186/1471-2164-7-130.

818 Benjamini Y, Hochberg Y, 1995. Controlling the false discovery rate: a practical and
819 powerful approach to multiple testing. *Journal of the Royal Statistical Society*
820 Series B (Methodological) 57:289-300.

821 Bhardwaj S, Prudic KL, Bear A, Dasgupta M, Wasik BR, Tong X, Cheong WF, Wenk
822 MR, Monteiro A, 2018. Sex Differences in 20-Hydroxyecdysone hormone levels
823 control sexual dimorphism in *Bicyclus anynana* wing patterns. *Molecular Biology*
824 and Evolution 35:465-472. doi: 10.1093/molbev/msx301.

825 Bloch NI, Corral-López A, Buechel SD, Kotrschal A, Kolm N, Mank JE, 2018. Early
826 neurogenomic response associated with variation in guppy female mate
827 preference. *Nature Ecology and Evolution* 2:1772-1781. doi: 10.1038/s41559-
828 018-0682-4.

829 Bolger AM, Lohse M, Usadel B, 2014. Trimmomatic:a flexible trimmer for Illumina
830 sequence data. *Bioinformatics* 30:2114-2120. doi: 10.1093/bioinformatics/btu170.

831 Brakefield PM, Reistma N, 1991. Phenotypic plasticity, seasonal climate and the
832 population biology of *Bicyclus* butterflies (Satyridae) in Malawi. *Ecological*
833 *Entomology* 16:291-303.

834 Broad KD, Keverne EB, 2012. The post-natal chemosensory environment induces
835 epigenetic changes in vomeronasal receptor gene expression and a bias in
836 olfactory preference. *Behavior Genetics* 42:461-471. doi: 10.1007/s10519-011-
837 9523-9.

838 Brunetti CR, Selegue JE, Monteiro A, French V, Brakefield PM, Carroll SB, 2001. The
839 generation and diversification of butterfly eyespot color patterns. *Current Biology*
11:1578-1585. doi: 10.1016/S0960-9822(01)00502-4.

840 Buerkle N, Westerman EL, Kronforst MR, Palmer SE, 2022. Sex-limited diversification
841 of the eye in *Heliconius* butterflies. bioRxiv. doi: 10.1101/2022.04.25.489414.

842 Byers KJRP, Barragh K, Musgrove J, Almeida DA, Garza SF, Warren IA, Rastas PM,
843 Kucka M, Chan YF, Merrill RM, Schultz S, McMillan WO, Jiggins CD, 2020. A
844 major locus controls a biologically active pheromone component in *Heliconius*
845 *melpomene*. Evolution 74:349-364. doi: 10.1111/evo.13922.

846 Byrne PG, Rice WR, 2006. Evidence for adaptive male mate choice in the fruit fly
847 *Drosophila melanogaster* Proceedings of the Royal Society of London B
848 273:917-922. doi: 10.1098/rspb.2005.3372.

849 Conesa A, Götz S, García-Gómez JM, Terol J, Talón M, Robles M, 2005. Blast2GO: a
850 universal tool for annotation, visualization and analysis in functional genomics
851 research. Bioinformatics 21:3674-3676. doi: 10.1093/bioinformatics/bti610.

852 Connahs H, Tlili S, van Creij J, Loo TYJ, Banerjee TD, Saunders TE, Monteiro A, 2019.
853 Activation of butterfly eyespots by Distal-less is consistent with a reaction-
854 diffusion process. Development 146:146. doi: 10.1242/dev.169367.

855 Costanzo K, Monteiro A, 2007. The use of chemical and visual cues in female choice in
856 the butterfly *Bicyclus anynana*. Proceedings of the Royal Society of London B
857 274:845-851.

858 Cui R, Delclos PJ, Schumer M, Rosenthal GG, 2017. Early social learning triggers
859 neurogenomic expression changes in a swordtail fish. Proceedings of the Royal
860 Society of London B 284. doi: 10.1098/rspb.2017.0701.

861 Cummings ME, Larkins-Ford J, Reilly CRL, Wong RY, Ramsey ME, Hofmann HA,
862 2008. Sexual and social stimuli elicit rapid and contrasting genomic responses.
863 Proceedings of the Royal Society of London B 275:393-402. doi:
864 10.1098/rspb.2007.1454.

865 Datta SR, Vasconcelos ML, Ruta V, Luo S, Wong A, Demir E, Flores J, Balonze K,
866 Dickson BJ, Axel R, 2008. The *Drosophila* pheromone cVA activates a sexually
867 dimorphic neural circuit. Nature 452. doi: 10.1038/nature06808.

868 Dauwalder B, Tsujimoto S, Moss J, Mattox W, 2002. The *Drosophila* takeout gene is
869 regulated by the somatic sex-determination pathway and affects male courtship.
870 Genes & Development 16:2879-2892. doi: 10.1101/gad.1010302.

871 de Jong MA, Collins SL, Beldade P, Brakefield PM, Zwaan BJ, 2013. Footprints of
872 selection in wild populations of *Bicyclus anynana* along a latitudinal cline.
873 Molecular Ecology 22:341-353. doi: 10.1111/mec.12114.

874 Dobin A, Davis CA, Schlesinger F, Drenkow J, Zaleski C, Jha S, Batut P, Chaisson M,
875 Gingeras TR, 2013. STAR: ultrafast universal RNA-seq aligner. Bioinformatics
876 29:15-21. doi: 10.1093/bioinformatics/bts635.

877 Edwards AC, Zwarts L, Yamamoto A, Callaerts P, Mackay TFC, 2009. Mutations in
878 many genes affect aggressive behavior in *Drosophila melanogaster*. BMC
879 Biology 7:29. doi: 10.1186/1741-7007-7-29.

880 Ehl S, Hostert K, Korsch J, Gros P, Schmitt T, 2018. Sexual dimorphism in the alpine
881 butterflies *Boloria pales* and *Boloria napaea*: differences in movement and
882 foraging behavior (Lepidoptera: Nymphalidae). Insect Science 25:1089-1101. doi:
883 10.1111/1744-7917.12494.

884 Ellers J, Boggs CL, 2003. The evolution of wing color: male mate choice opposes
885 adaptive wing color divergence in *Colias* butterflies. Evolution 57:1100-1106.

886 Ernst DA, Westerman EL, 2021. Stage- and sex-specific transcriptome analyses reveal
887 distinctive sensory gene expression patterns in a butterfly. *BMC Genomics*. doi:
888 10.1186/s12864-021-07819-4.

889 Everett A, Tong X, Briscoe AD, Monteiro A, 2012. Phenotypic plasticity in opsin
890 expression in a butterfly compound eye complements sex role reversal. *BMC*
891 *Evolutionary Biology* 12:232.

892 Ficarrotta V, Hanly JJ, Loh LS, Francescutti CM, Ren A, Tunström K, Wheat CW, Porter
893 AH, Counterman BA, Martin A, 2022. A genetic switch for male UV-iridescence
894 in an incipient species pair of sulphur butterflies. *Proceedings of the National*
895 *Academy of Sciences* 119:e2109255118. doi: 10.1073/pnas.2109255118.

896 Ghalambor CK, Hoke KL, Ruell EW, Fischer EK, Reznick DN, Hughes KA, 2015. Non-
897 adaptive plasticity potentiates rapid adaptive evolution of gene expression in
898 nature. *Nature* 372:372-375. doi: 10.1038/nature15256.

899 Gobes SMH, ter Haar SM, Vignal C, Vergne AL, Mathevon N, Bolhuis JJ, 2009.
900 Differential responsiveness in brain and behavior to sexually dimorphic long calls
901 in male and female zebra finches. *The Journal of Comparative Neurology*
902 516:312-320. doi: 10.1002/cne.22113.

903 Goebrecht GKE, Kowtoniuk RA, Kelly BG, Kittelberger JM, 2014. Sexually-dimorphic
904 expression of tyrosine hydroxylase immunoreactivity in the brain of a vocal
905 teleost fish (*Porichthys notatus*). *Journal of Chemical Neuroanatomy* 56:13-34.
906 doi: 10.1016/j.jchemneu.2014.01.001.

907 Greenwood PJ, 1980. Mating systems, philopatry and dispersal in birds and mammals.
908 *Animal Behaviour* 28:1140-1162.

909 Gurney ME, Konishi M, 1980. Hormone-induced sexual differentiation of brain and
910 behavior in zebra finches. *Science* 208:1380-1383.

911 Hashikawa K, Hashikawa Y, Lischinsky J, Lin D, 2018. The neural mechanisms of
912 sexually dimorphic aggressive behaviors. *Trends in Genetics* 34:755-776. doi:
913 10.1016/j.tig.2018.07.001.

914 Immelmann K, 1975. Ecological significance of imprinting and early learning. *Annual*
915 *Review of Ecology and Systematics* 6:15-37.

916 Jiggins CD, Naisbit RE, Coe RL, Mallet J, 2001. Reproductive isolation caused by colour
917 pattern mimicry. *Nature* 411:302-305.

918 Kendrick KM, Haupt MA, Hinton MR, Broad KD, Skinner JD, 2001. Sex differences in
919 the influence of mothers on the sociosexual preferences of their offspring.
920 *Hormones and Behavior* 40:322-338. doi: 10.1006/hbeh.2001.1672.

921 Kokko H, Johnstone RA, 2002. Why is mutual mate choice not the norm? Operational
922 sex ratios, sex roles and the evolution of sexually dimorphic and monomorphic
923 signalling. *Philosophical transactions of the Royal Society B* 357:319-330. doi:
924 10.1098/rstb.2001.0926.

925 Kronforst MR, Papa R, 2015. The functional basis of wing patterning in *Heliconius*
926 butterflies: The molecules behind mimicry. *Genetics* 200:1-19. doi:
927 10.1534/genetics.114.172387.

928 Kronforst MR, Young LG, Kapan DD, McNeely C, O'Neill RJ, Gilbert LE, 2006.
929 Linkage of butterfly mate preference and wing color preference cue at the
930 genomic location of wingless. *Proceedings of the National Academy of Sciences*
931 of the United States of America 103:6575-6580.

932 Kunte K, Zhang W, Tenger-Trolander A, Palmer DH, Martin A, Reed RD, Mullen SP,
933 Kronforst MR, 2014. *doublesex* is a mimicry supergene. *Nature* 507:229-234. doi:
934 10.1038/nature13112.

935 Lande R, 1980. Sexual dimorphism, sexual selection, and adaptation in polygenic
936 characters. *Evolution* 34:292-305.

937 Langfelder P, Horvath S, 2008. WGCNA: an R package for weighted correlation network
938 analysis. *BMC Bioinformatics* 9:559. doi: 10.1186/1471-2105-9-559.

939 Lee J, Yoo E, Lee H, Park K, Hur J, Lim C, 2017. LSM12 and ME31B/DDX6 define
940 distinct modes of posttranscriptional regulation by ATAXIN-2 protein complex in
941 *Drosophila* circadian pacemaker neurons. *Molecular Cell* 66:129-140. doi:
942 10.1016/j.molcel.2017.03.004.

943 Li P, Chaurasia SS, Gao Y, Carr AL, Iuvone PM, Li L, 2008. CLOCK is required for
944 maintaining the circadian rhythms of opsin mRNA expression in photoreceptor
945 cells. *The Journal of Biological Chemistry* 283:31673-31678. doi:
946 10.1074/jbc.M803875200.

947 Li P, Temple S, Gao Y, Haimberger TJ, Hawryshyn CW, Li L, 2005. Circadian rhythms
948 of behavioral cone sensitivity and long wavelength opsin mRNA expression: a
949 correlation study in zebrafish. *Journal of Experimental Biology* 208:497-504. doi:
950 10.1242/jeb.01424.

951 London A, Benhar I, Schwartz M, 2013. The retina as a window to the brain — from eye
952 research to CNS disorders. *Nature Reviews Neurology* 9:44-53. doi:
953 10.1038/nrneurol.2012.227.

954 Love MI, Huber W, Anders S, 2014. Moderated estimation of fold change and dispersion
955 for RNA-seq data with DESeq2. *Genome Biology* 15:550. doi: 10.1186/s13059-
956 014-0550-8.

957 Macias-Muñoz A, Smith G, Monteiro A, Briscoe AD, 2015. Transcriptome-wide
958 differential expression in *Bicyclus anynana* butterflies: Female vision-related
959 genes are more plastic. *Molecular Biology and Evolution*. doi:
960 10.1093/molbev/msv197.

961 Martin A, Reed RD, 2010. *wingless* and *artistaleless2* define a developmental ground plan
962 for moth and butterfly wing pattern evolution. *Molecular Biology and Evolution*
963 27:2864-2878. doi: 10.1093/molbev/msq173.

964 Matsuoka Y, Monteiro A, 2018. Melanin pathway genes regulate color and morphology
965 of butterfly wing scales. *Cell Reports* 24:56-65. doi:
966 10.1016/j.celrep.2018.05.092.

967 Merrill RM, Dasmahapatra KK, Davey JW, Dell'Aglio DD, Hanly JJ, Huber B, Jiggins
968 CD, Joron M, Kozak KM, Llaurens V, Marin SH, Montgomery SH, Morris J,
969 Nadeau NJ, Pinharanda AL, Rosser N, Thompson MJ, Vanjari S, Wallbank RWR,
970 Yu Q, 2015. The diversification of *Heliconius* butterflies: what have we learned in
971 150 years? *Journal of Evolutionary Biology* 28:1417-1438. doi:
972 10.1111/jeb.12672.

973 Merrill RM, Rastas P, Martin SH, Melo MC, Barker S, Davey JW, McMillan WO,
974 Jiggins CD, 2019. Genetic dissection of assortative mating behavior. *PLoS*
975 *Biology* 17:e2005902. doi: 10.1371/journal.pbio.2005902.

976 Monteiro A, Chen B, Ramos DM, Oliver JC, Tong X, Guo M, Wang W, Fazzino L,
977 Kamal F, 2013. Distal-Less regulates eyespot patterns and melanization in
978 *Bicyclus* butterflies. *Journal of Experimental Zoology Part B* 320B:321-331.

979 Monteiro A, Glaser G, Stockslager S, Glansdorp N, Ramos D, 2006. Comparative
980 insights into questions of lepidopteran wing pattern homology. *BMC
981 Developmental Biology* 6:52. doi: 10.1186/1471-213X-6-52.

982 Monteiro A, Prudic KL, 2010. Multiple approaches to study color pattern evolution in
983 butterflies. *Trends in Evolutionary Biology* 2. doi: 10.4081/eb.2010.e2.

984 Morandin C, Hietala A, Helanterä H, 2019. Vitellogenin and vitellogenin-like gene
985 expression patterns in relation to caste and task in the ant *Formica fusca*. *Insectes
986 Sociaux* 66:519-531. doi: 10.1007/s00040-019-00725-9.

987 Nadeau NJ, Pardo-Diaz C, Whibley A, Supple MA, Saenko SV, Wallbank RWR, Wu
988 GC, Maroja L, Ferguson L, Hanly JJ, Hines H, Salazar C, Merrill RM, Dowling
989 AJ, ffrench-Constant RH, Llaurens V, Joron M, McMillan WO, Jiggins CD, 2016.
990 The gene *cortex* controls mimicry and crypsis in butterflies and moths. *Nature*
991 534:106-110. doi: 10.1038/nature17961.

992 Naisbit RE, Jiggins CD, Mallet J, 2001. Disruptive sexual selection against hybrids
993 contributes to speciation between *Heliconius cydno* and *Heliconius melpomene*.
994 *Proceedings of the Royal Society of London B* 268:1849-1854. doi:
995 10.1098/rspb.2001.1753.

996 Nelson CM, Ihle KE, Fondrk MK, Page RE, Amdam GV, 2007. The gene *vitellogenin*
997 has multiple coordinating effects on social organization. *PLoS Biology* 5:e62. doi:
998 10.1371/journal.pbio.0050062.

999 Nieberding CM, de Vos H, Schneider MV, Lassance J, Estramil N, Andersson J, Bang J,
1000 Hedenstrom E, Lofstedt C, Brakefield PM, 2008. The male sex pheromone of the
1001 butterfly *Bicyclus anynana*: Towards an evolutionary analysis. *PLoS ONE*
1002 3:e2751-.

1003 Nieberding CM, Fischer K, Saastamoinen M, Allen CE, Wallin EA, Hedenstrom E,
1004 Brakefield PM, 2012. Cracking the olfactory code of a butterfly: the scent of
1005 ageing. *Ecology Letters* 15:415-424. doi: 10.1111/j.1461-0248.2012.01748.x.

1006 Nowell RW, Elsworth B, V. O, Zwaan BJ, Wheat CW, Saastamoinen M, Saccheri IJ,
1007 van't Hof AE, Wasik BR, Connahs H, Aslam ML, Kumar S, challis RJ, Monteiro
1008 A, Brakefield PM, Blaxter ML, 2017. A high-coverage draft genome of the
1009 mycalesine butterfly *Bicyclus anynana*. *Giga Science* 6:1-7. doi:
1010 10.1093/gigascience/gix035.

1011 Obara Y, Koshitaka H, Arikawa K, 2008. Better mate in the shade: enhancement of male
1012 mating behavior in the cabbage butterfly, *Pieris rapae crucivora*, in a UV-rich
1013 environment. *Journal of Experimental Biology* 211:3698-3702.

1014 Ogawa Y, Kinoshita M, Stavenga DG, Arikawa K, 2013. Sex-specific retinal
1015 pigmentation results in sexually dimorphic long-wavelength-sensitive
1016 photoreceptors in the eastern pale clouded yellow butterfly, *Colias erate*. *The
1017 Journal of Experimenbtal Biology* 216:1916-1923. doi: 10.1242/jeb.083485.

1018 Olson CR, Hedges LK, Mello CV, 2015. Dynamic gene expression in the song system of
1019 zebra finches during the song learing period. *Developmental Neurobiology*
1020 75:1315-1338. doi: 10.1002/dneu.2286.

1021 Ozsu N, Chan QY, Chen B, Das Gupta M, Monteiro A, 2017. *Wingless* is a positive
1022 regulator of eyespot color patterns in *Bicyclus anynana* butterflies. *Developmental*
1023 *Biology* 429:177-185. doi: 10.1016/j.ydbio.2017.06.030.

1024 Ozsu N, Monteiro A, 2017. Wound healing, calcium signaling, and other novel pathways
1025 are associated with the formation of butterfly eyespots. *BMC Genomics* 18:788.
1026 doi: 10.1186/s12864-017-4175-7.

1027 Perry CJ, Barron AB, Chittka L, 2017. The frontiers of insect cognition. *Current Opinion*
1028 in *Behavioral Sciences* 16:111-118. doi: 10.1016/j.cobeha.2017.05.011.

1029 Pradhan A, Olsson P, 2015. Zebrafish sexual behavior: role of sex steroid hormones and
1030 prostaglandins. *Behavioral and Brain Functions* 11:23. doi: 10.1186/s12993-015-
1031 0068-6.

1032 Prakash A, Monteiro A, 2018. *apterous A* specifies dorsal wing patterns and sexual traits
1033 in butterflies. *Proceedings of the Royal Society of London B* 285:20172685. doi:
1034 10.1098/rspb.2017.2685.

1035 Prakash A, Monteiro A, 2020. *Doublesex* mediates the development of sex-specific
1036 pheromone organs in *Bicyclus* butterflies via multiple mechanisms. *Molecular*
1037 *Biology and Evolution* 37:1694-1707. doi: 10.1093/molbev/msaa039.

1038 Prudic KL, Jeon C, Cao H, Monteiro A, 2011. Developmental plasticity in sexual roles of
1039 butterfly species drives mutual sexual ornamentation. *Science* 331:73-75. doi:
1040 10.1126/science.1197114.

1041 Quillfeldt P, Schroff S, van Noordwijk HJ, Michalik A, Ludynia K, Masello JF, 2011.
1042 Flexible foraging behaviour of a sexually dimorphic seabird: large males do not
1043 always dive deep. *Marine Ecology Progress Series* 428:271-287. doi:
1044 10.3354/meps09058.

1045 Reed RD, Papa R, Martin A, Hines HM, Counterman BA, Pardo-Diaz C, Jiggins CD,
1046 Chamberlain NL, Kronforst MR, Chen R, Halder G, Nijhout HF, McMillan WO,
1047 2011. *optix* drives the repeated convergent evolution of butterfly wing pattern
1048 mimicry. *Science* 333:1137-1141. doi: 10.1126/science.1208227.

1049 Reedy AM, Pope BD, Kiriazis NM, Giordano CL, Sams CL, Warner DA, Cox RM, 2017.
1050 Female anoles display less but attack more quickly than males in response to
1051 territorial intrusions. *Behavioral Ecology* 28:1323-1328. doi:
1052 10.1093/beheco/arx095.

1053 Rideout EJ, Billeter J, Goodwin SF, 2007. The sex-determination genes *fruitless* and
1054 *doublesex* specify a neural substrate required for courtship song. *Current Biology*
1055 17:1473-1478. doi: 10.1016/j.cub.2007.07.047.

1056 Robertson KA, Monteiro A, 2005. Female *Bicyclus anynana* butterflies choose males on
1057 the basis of their dorsal UV-reflective eyespot pupils. *Proceedings of the Royal*
1058 *Society of London B* 272:1541-1546.

1059 Robinson MD, McCarthy DJ, Smyth GK, 2010. *edgeR*: a Bioconductor package for
1060 differential expression analysis of digital gene expression data. *Bioinformatics*
1061 26:139-140. doi: 10.1093/bioinformatics/btp616.

1062 Rodriguez-Caro F, Fenner J, Bhardway S, Cole JA, Benson C, Colombara AM, Papa R,
1063 Brown MW, Martin A, Range RC, Counterman BA, 2021. Novel *doublesex*
1064 duplication associated with sexually dimorphic development of dogface butterfly
1065 wings. *Molecular Biology and Evolution* 38:5021-5033. doi:
1066 10.1093/molbev/msab228.

1067 Rosell F, Thomsen LR, 2006. Sexual dimorphism in territorial scent marking by adult
1068 Eurasian beavers (*Castor fiber*). *Journal of Chemical Ecology* 32:1301-1315. doi:
1069 10.1007/s10886-006-9087-y.

1070 Roy-Zokan EM, Cunningham CB, Hebb LE, McKinney EC, Moore AJ, 2015.
1071 Vitellogenin and vitellogenin receptor gene expression is associated with male
1072 and female parenting in a subsocial insect. *Proceedings of the Royal Society of*
1073 *London B* 282:20150787. doi: 10.1098/rspb.2015.0787.

1074 Rue-Albrecht K, McGettigan PA, Hernández B, Nalpas NC, Magee DA, A.C. P, Gordon
1075 SV, MacHugh DE, 2016. GOexpress: an R/Bioconductor package for the
1076 identification and visualisation of robust gene ontology signatures through
1077 supervised learning of gene expression data. *BMC Bioinformatics* 17:126. doi:
1078 10.1186/s12859-016-0971-3.

1079 Ruta V, Datta SR, Vasconcelos ML, Freeland J, Looger LL, Axel R, 2010. A dimorphic
1080 pheromone circuit in *Drosophila* from sensory input to descending output. *Nature*
1081 468:686-692. doi: 10.1038/nature09554.

1082 Saenko SV, Marialva MSP, Beldade P, 2011. Involvement of the conserved Hox gene
1083 *Antennapedia* in the development and evolution of a novel trait. *EvoDevo* 2:9.
1084 doi: 10.1186/2041-9139-2-9.

1085 Sakai Y, Kawamura S, Kawata M, 2018. Genetic and plastic variation in opsin gene
1086 expression, light sensitivity, and female response to visual signals in the guppy.
1087 *Proceedings of the National Academy of Sciences* 115:12247-12252. doi:
1088 10.1073/pnas.1706730115.

1089 Schwaerzel M, Monastirioti M, Scholz H, Friggi-Grelin F, Birman S, Heisenberg M,
1090 2003. Dopamine and octopamine differentiate between aversive and appetitive
1091 olfactory memories in *Drosophila*. *Journal of Neuroscience* 23:10495-10502.

1092 Servedio MR, 2009. The role of linkage disequilibrium in the evolution of premating
1093 isolation. *Heredity* 102:51-56. doi: 10.1038/hdy.2008.98.

1094 Servedio MR, Van Doorn GS, Kopp M, Frame AM, Nosil P, 2011. Magic traits in
1095 speciation: ‘magic’ but not rare? *Trends in Ecology & Evolution* 26:389-397. doi:
1096 10.1016/j.tree.2011.04.005.

1097 Shannon G, Page BR, Duffy KJ, Slotow R, 2006. The role of foraging behaviour in the
1098 sexual segregation of the African elephant. *Oecologia* 150:344-354. doi:
1099 10.1007/s00442-006-0521-1.

1100 Shannon P, Markiel A, Ozier O, Baliga NS, Wang JT, Ramage D, Amin N, Schwikowski
1101 B, Ideker T, 2003. Cytoscape: a software environment for integrated models of
1102 biomolecular interaction networks. *Genome Research* 13:2498-2504.

1103 Slonim DK, 2002. From patterns to pathways: gene expression data analysis comes of
1104 age. *Nature Genetics* 32:502-508. doi: 10.1038/ng1033.

1105 Smadja CM, Butlin RK, 2011. A framework for comparing processes of speciation in the
1106 presence of gene flow. *Molecular Ecology* 20:5123-5140. doi: 10.1111/j.1365-
1107 294X.2011.05350.x.

1108 Stavenga DG, 2002. Reflections on colourful ommatidia of butterfly eyes. *Journal of*
1109 *Experimental Biology* 205:1077-1085.

1110 Stephens M, 2017. False discovery rates: a new deal. *Biostatistics* 18:275-294. doi:
1111 10.1093/biostatistics/kxw041.

1112 Talyn BC, Dowse HB, 2004. The role of courtship song in sexual selection and species
1113 recognition by female *Drosophila melanogaster*. *Animal Behaviour* 68:1165-
1114 1180. doi: 10.1016/j.anbehav.2003.11.023.

1115 ten Cate C, 1985. On sex differences in sexual imprinting. *Animal Behaviour* 33:1310-
1116 1317.

1117 ten Cate C, Vos DR, 1999. Sexual imprinting and evolutionary processes in birds: a
1118 reassessment. *Advances in the Study of Behavior* 28:1-31.

1119 Trivers RL, 1972. Parental investment and sexual selection. In: Campbell B, editor.
1120 *Sexual Selection and the Descent of Man, 1871-1971* Chicago: Aldine-Atherton.
1121 p. 136-179.

1122 Trochet A, Courtois EA, Stevens VM, Baguette M, Chaine A, Schmeller DS, Clobert J,
1123 2016. Evolution of sex-biased dispersal. *The Quarterly Review of Biology*
1124 91:297-320.

1125 van Schooten B, Meléndez-Rosa J, Van Belleghem SM, Jiggins CD, Tan JD, McMillan
1126 WO, Papa R, 2020. Divergence of chemosensing during the early stages of
1127 speciation. *Proceedings of the National Academy of Sciences* 117:16438-16447.
1128 doi: 10.1073/pnas.1921318117.

1129 Verzijden MN, Korthof REM, ten Cate C, 2008. Females learn from mothers and males
1130 learn from others. The effect of mother and siblings on the development of female
1131 mate preferences and male aggression biases in Lake Victoria cichlids, genus
1132 Mbipia. *Behavioral Ecology and Sociobiology* 62:1359-1368. doi:
1133 10.1007/s00265-008-0564-x.

1134 Verzijden MN, ten Cate C, Servedio MR, Kozak GM, Boughman JW, Svensson EI,
1135 2012. The impact of learning on sexual selection. *Trends in Ecology and
1136 Evolution* 27:511-519. doi: 10.1016/j.tree.2012.05.007.

1137 Wang Y, Rensink A, Fricke U, Riddle MC, Trent C, van de Zande L, Verhulst EC, 2022.
1138 *Doublesex* regulates male-specific differentiation during distinct developmental
1139 time windows in a parasitoid wasp. *Insect Biochemistry and Molecular Biology*
1140 142:103724. doi: 10.1016/j.ibmb.2022.103724.

1141 Westerman E, 2019. Searching for the genes driving assortative mating. *PLoS Biology*
1142 17:e3000108. doi: 10.1371/journal.pbio.3000108.

1143 Westerman E, Hodgins-Davis A, Dinwiddie A, Monteiro A, 2012. Biased learning affects
1144 mate choice in a butterfly. *Proceedings of the National Academy of Sciences of
1145 the United States of America* 109:10948-10953. doi: 10.1073/pnas.1118378109.

1146 Westerman E, Monteiro A, 2013. Odour influences whether females learn to prefer or to
1147 avoid wing patterns of male butterflies. *Animal Behaviour* 86:1139-1145. doi:
1148 10.1016/j.anbehav.2013.09.002.

1149 Westerman EL, Antonson N, Kreutzmann S, Peterson A, Pineda S, Kronforst MR, Olson-
1150 Manning CF, 2019. Behaviour before beauty: Signal weighting during mate
1151 selection in the butterfly *Papilio polytes*. *Ethology* 125:565-574. doi:
1152 10.1111/eth.12884.

1153 Westerman EL, Chirathivat N, Schyling E, Monteiro A, 2014. Mate preference for a
1154 phenotypically plastic trait is learned, and may facilitate preference-phenotype
1155 matching. *Evolution* 68:1661-1670.

1156 Westerman EL, VanKuren N, Massardo D, Buerkle N, Tenger-Trolander A, Zhang W,
1157 Hill R, Perry M, Bayala E, Chamberlain N, Douglas T, Palmer S, Kronforst MR,

1158 2018. *Aristaless* controls butterfly wing color variation used in mimicry and mate
1159 choice. *Current Biology* 28:3469-3474.e3464. doi: 10.1016/j.cub.2018.051.
1160 Witte K, Sawka N, 2003. Sexual imprinting on a novel trait in the dimorphic zebra finch:
1161 sexes differ. *Animal Behaviour* 65:165-203. doi: 10.1006/anbe.2002.2009.
1162 Wong BBM, Fisher HS, Rosenthal GG, 2005. Species recognition by male swordtails via
1163 chemical cues. *Behavioral Ecology* 16:818-822. doi: 10.1093/beheco/ari058.
1164 Woodgate JL, Buchanan KL, Bennett ATD, Catchpole CK, Brighton R, Leitner S, 2014.
1165 Environmental and genetic control of brain and song structure in the zebra finch.
1166 *Evolution* 68:230-240. doi: 10.1111/evol.12261.
1167 Woronik A, Tunström K, Perry MW, Neethiraj R, Stefanescu C, Celorio-Mancera M,
1168 Brattstrom O, Hill J, Lehmann P, Käkelä R, Wheat CW, 2019. A transposable
1169 element insertion is associated with an alternative life history strategy. *Nature
1170 Communications* 10:5757. doi: 10.1038/s41467-019-13596-2.
1171 Wright DS, van Eijk R, Schuert L, Seehausen O, Groothuis TGG, Maan ME, 2020.
1172 Testing sensory drive speciation in cichlid fish: linking light conditions to opsin
1173 expression, opsin genotype and female mate preference. *Journal of Evolutionary
1174 Biology* 33:422-434. doi: 10.1111/jeb.13577.
1175 Zhou X, Pardue MT, Iuvone PM, Qu J, 2017. Dopamine signaling and myopia
1176 development: What are the key challenges. *Progress in Retinal and Eye Research*
1177 61:60-71. doi: 10.1016/j.preteyeres.2017.06.003.
1178 Zilkha N, Scott N, Kimchi T, 2017. Sexual dimorphism of parental care: from genes to
1179 behavior. *Annual Review of Neuroscience* 40:273-305. doi: 10.1146/annurev-
1180 neuro-072116-031447.
1181

1182 **Data Availability Statement:** All raw sequence data associated with this study are
1183 accessible through the NCBI Sequence Read Archive (SRA) database under BioProject
1184 ID PRJNA935913. Behavioral data are available at Dryad Database DOI:
1185 10.5061/dryad.612jm647d. All other data presented in this study and associated metadata
1186 are available within this manuscript and its Supplemental Information.

1187

1188 **Benefits Generated:** Benefits from this research accrue from the sharing of our data and
1189 results on public databases as described above.

1190

1191 **Author Contributions:** DAE- conceptualization, investigation, methodology, data
1192 curation, formal analysis, visualization, writing- original draft, review & editing; GAA-

1193 conceptualization, investigation, formal analysis, writing-original draft, review & editing;

1194 ANM- formal analysis, visualization, writing-original draft, review & editing; ELW-

1195 conceptualization, investigation, methodology, resources, visualization, writing-original

1196 draft, review & editing

1197

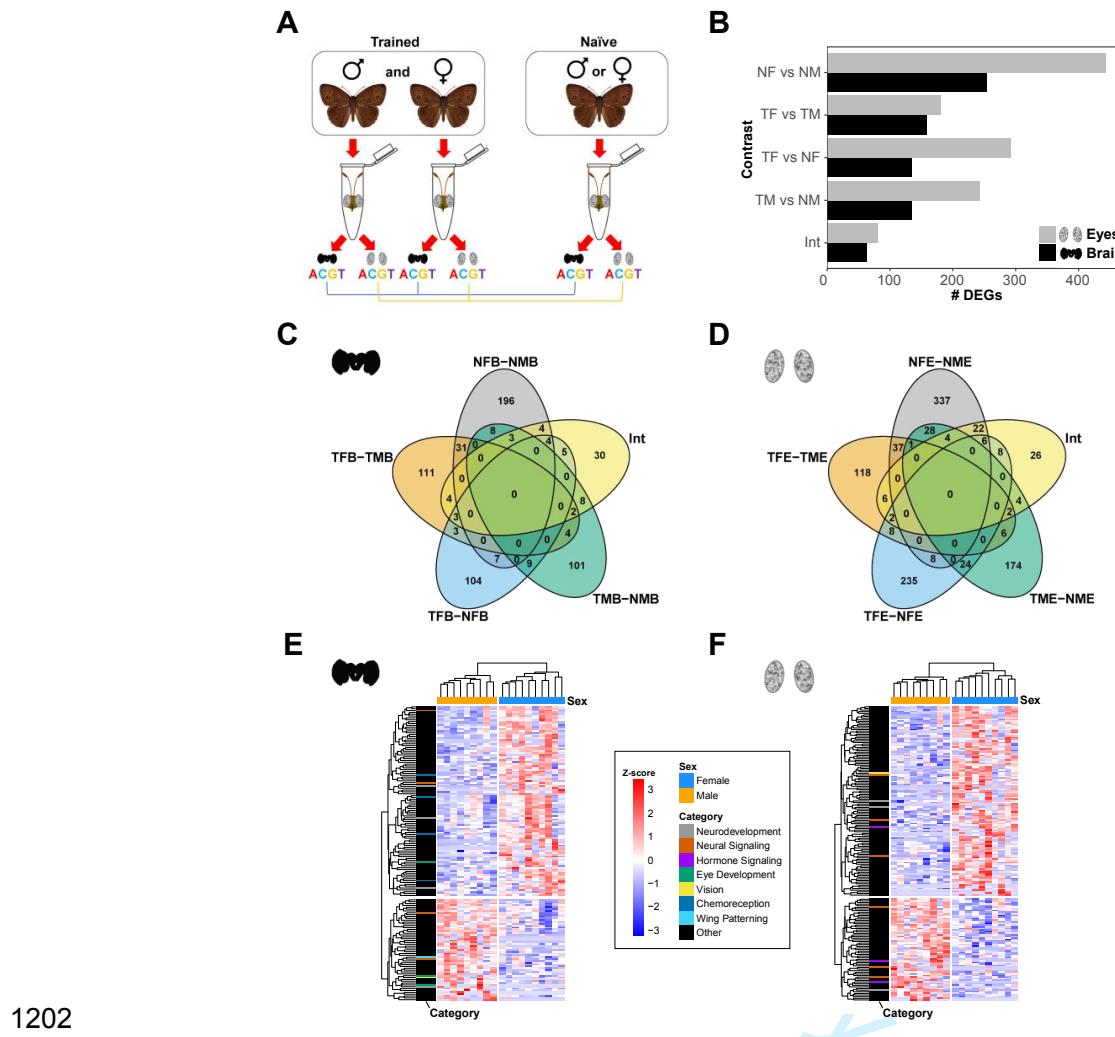
1198

1199

1200

1201 **Figures**

For Review Only



1202

1203

1204

1205 **Figure 1: Experimental design and broadscale sexually dimorphic gene expression. A)**
1206 Protocol for butterfly training and sampling. Newly emerged males/females were either solo or
1207 paired with a two-day-old, zero-spot female/four-spot male. Heads of each focal animal were
1208 collected, the brain and eyes dissected, and mRNA sequenced for expression analysis. B)
1209 Numbers of differentially expressed genes for each comparison for each tissue. C) Brain Venn
1210 diagrams showing overlap patterns for differentially expressed genes. D) Eye Venn diagrams
1211 showing overlap patterns for differentially expressed genes. E) Brain gene expression heatmaps
1212 of differentially expressed genes from trained females vs. trained males. Each row indicates a
1213 single gene, and each column indicates an individual sample. Counts were first normalized by
1214 variance stabilizing transformation, and gene-wise Z-scores were calculated for plotting. Genes
1215 and samples are clustered by expression, with warmer colors denoting increased expression
1216 relative to the mean for a given gene, while cooler colors denote decreased expression relative to

1217 the mean. F) Eye gene expression heatmaps of differentially expressed genes from trained
1218 females vs. trained males. NFB=naïve female brain, NMB=naïve male brain, TFB=trained female
1219 brain, TMB=trained male brain, NFE=naïve female eye, NME=naïve male eye, TFE=trained
1220 female eye, TME=trained male eye, Int=interaction.

1221

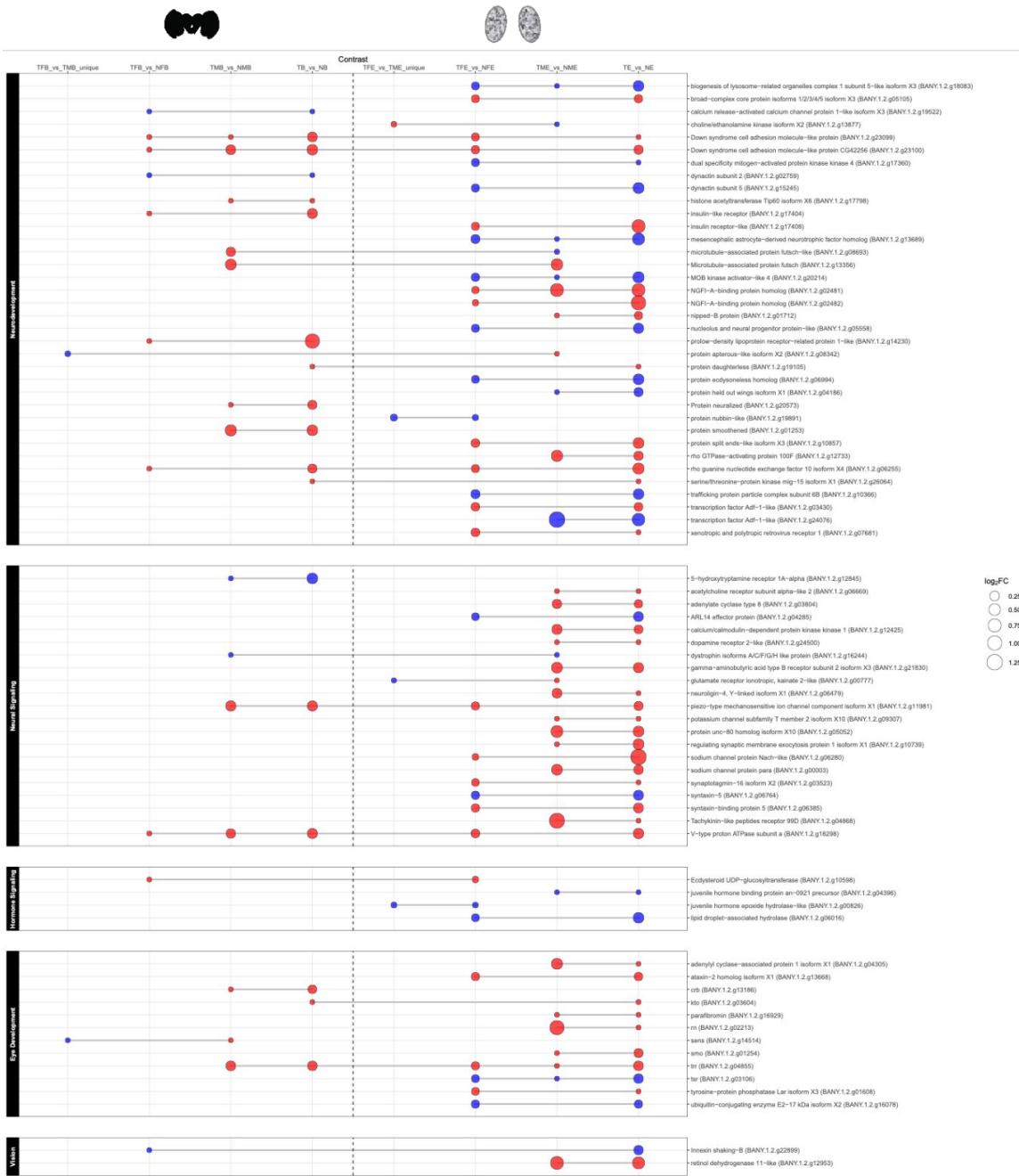
1222

1223

1224

1225

For Review Only



1226
1227
1228
1229
1230
1231
1232
1233
1234
1235

1236 **Figure 2: Neural processing, hormone signaling, and vision genes are differentially**
1237 **expressed in multiple contrasts.** The size of each dot indicates the effect size (\log_2FC), while
1238 the color indicates the gene regulation relative to the first sample type listed for the contrast (e.g.,
1239 for the TB vs. NB contrast, red indicates upregulation in trained brains, and blue indicates
1240 downregulation in trained brains). Gray lines connecting the dots denote that the gene was
1241 differentially expressed across multiple contrasts. NFB=naïve female brain, NMB=naïve male
1242 brain, TFB=trained female brain, TMB=trained male brain, NFE=naïve female eye, NME=naïve
1243 male eye, TFE=trained female eye, TME=trained male eye, TB=trained brain, TE=trained eye,
1244 NB=naïve brain, NE=naïve eye.

1245

1246

1247

1248

1249

1250

1251

1252

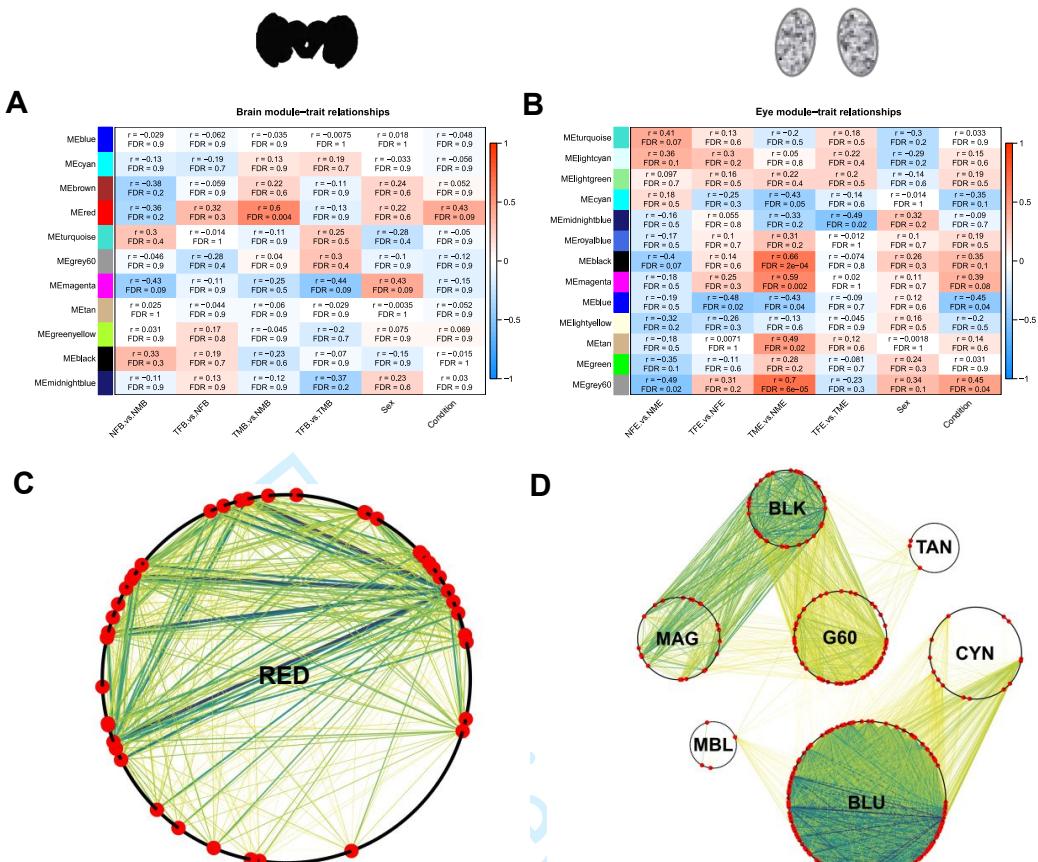
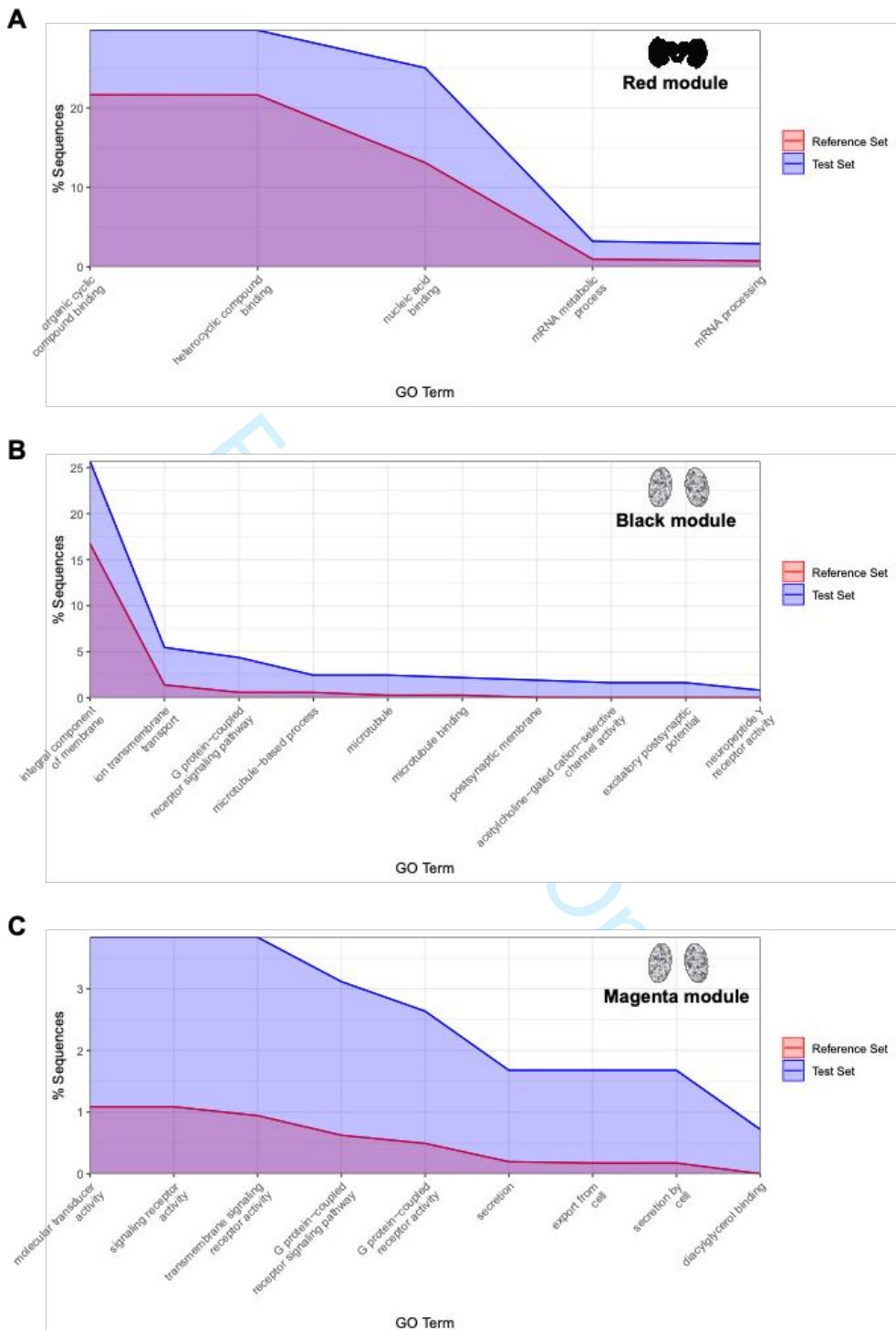


Figure 3: Gene network modules in brain and eyes are significantly associated with training. Significant modules from co-expression analyses. A) Brain module-trait association heatmap. Rows indicate module eigengenes (ME), and columns indicate the pairwise binary indicators representing the various comparisons (“traits”) of interest. The top numbers in each cell denote the correlation value (r), with false discovery rate (FDR) values below. Cells are colored by the strength of the association, with r ranging from -1 to 1. B) Eye module-trait association heatmap. C) WGCNA brain analysis red module Cytoscape plot. Each black dot around the perimeter of the circle indicates a node (gene), with larger red dots indicating differentially expressed genes from the contrast for which the module is significantly associated (i.e., trained vs. naïve male brain). Each line indicates an edge (connection) for differentially expressed genes within the module, with thinner yellow lines indicating weaker connections and thicker blue lines indicating stronger connections. D) WGCNA eye analysis, Cytoscape plot of all significant modules. Only edges for differentially expressed genes within and between modules are shown. BLK=black module, BLU=blue module, CYN=cyan module, G60=grey60 module, MAG=magenta module, MBL=midnightblue module, RED=red module, and TAN=tan module.



1274
1275

1276 **Figure 4: Gene ontology enrichment plots for significant brain and eye modules of interest.**
 1277 A) Significantly enriched GO terms in the brain red module. For each GO term, the percentage of
 1278 sequences annotated with that term within the Test Set (i.e., all red module genes) is plotted along

1279 with the percentage of sequences annotated with that term within the Reference Set (i.e., all genes
 1280 used in the co-expression analysis). B) Significantly enriched GO terms in the eye black module.
 1281 Due to the large number of enriched GO terms in this module, only the most specific terms
 1282 identified by Blast2GO were plotted for clarity. C) Significantly enriched GO terms in the eye
 1283 magenta module.

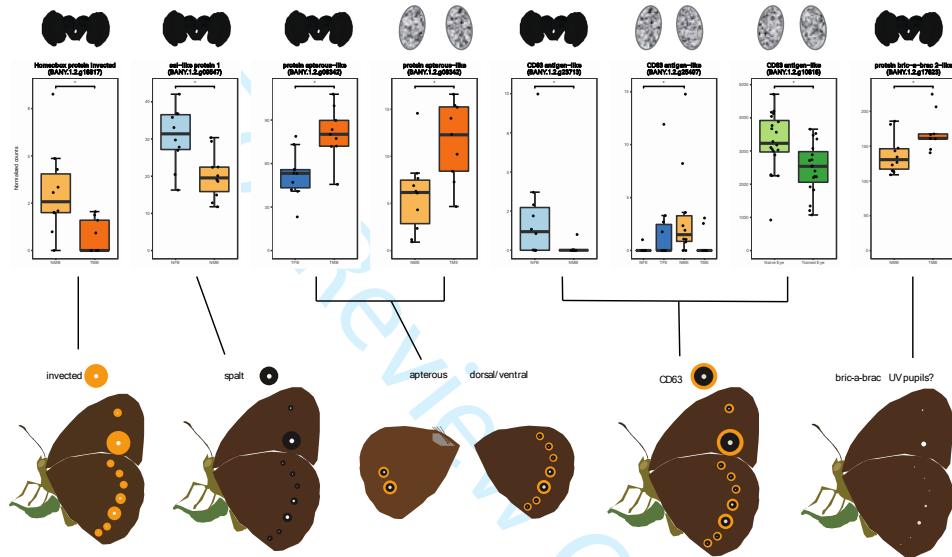
1284

1285

1286

1287

1288

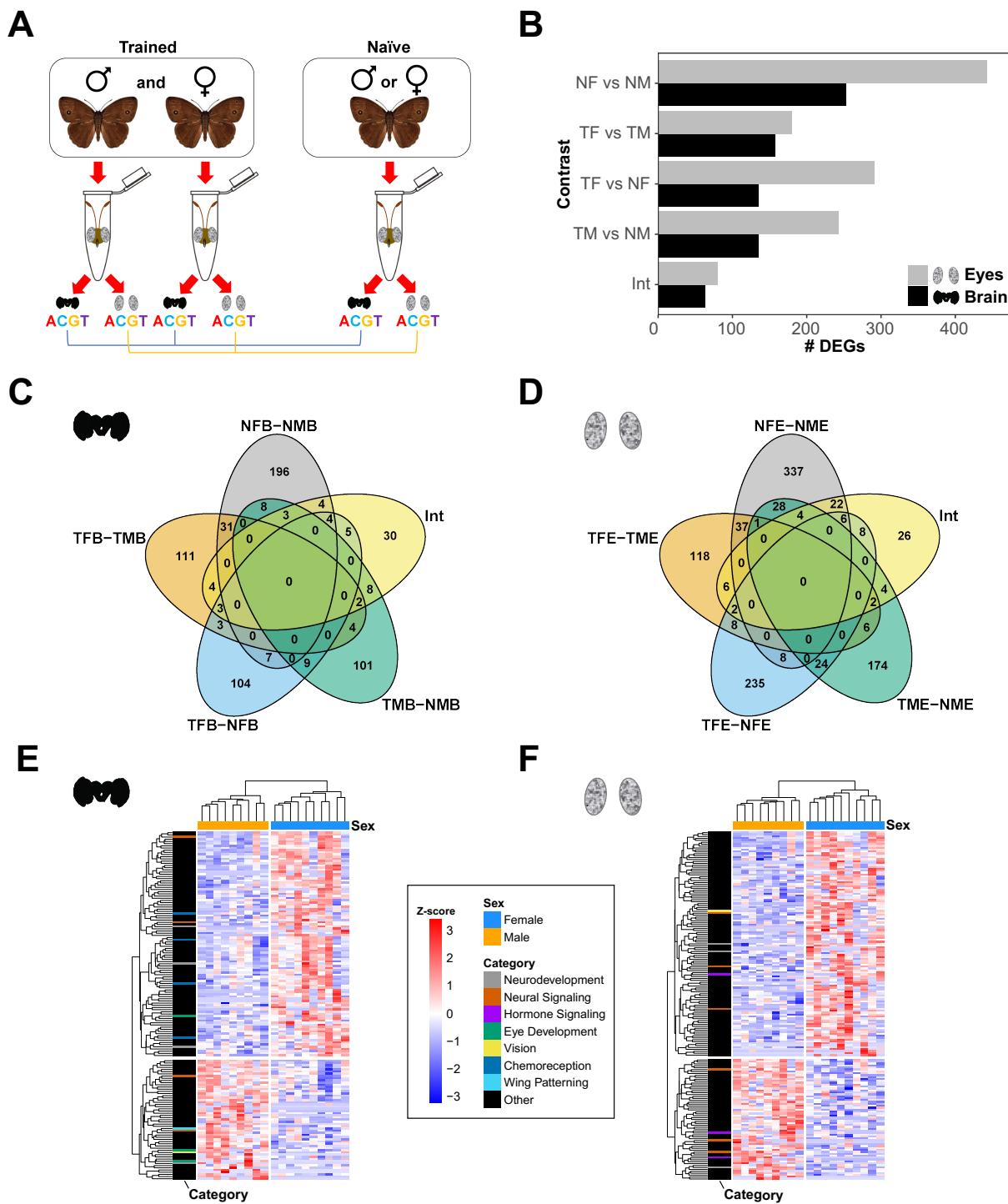


1289

1290

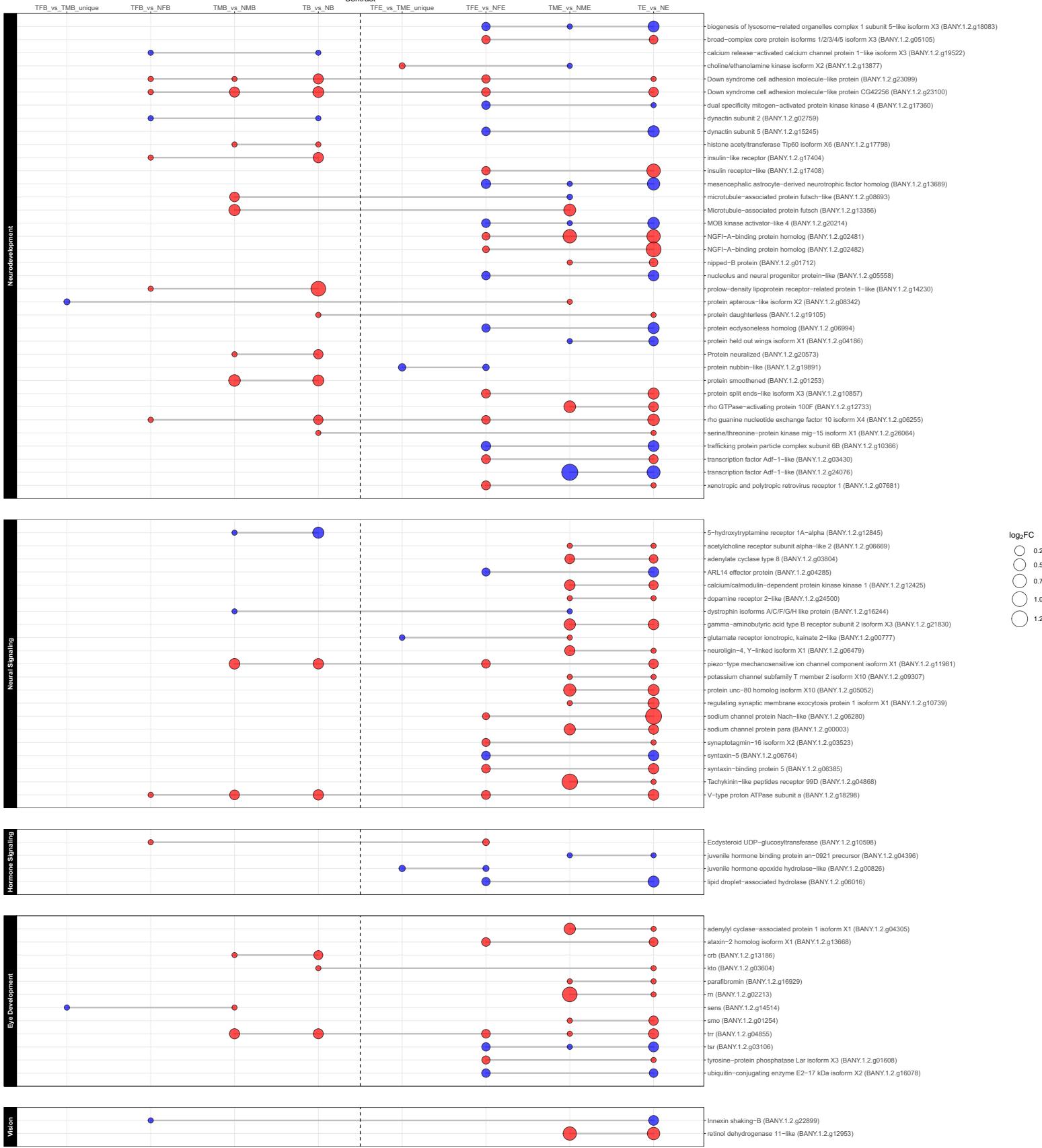
1291 **Figure 5: Genes that influence *B. anynana* wing patterns are also differentially expressed in**
 1292 **the brain and eye during training.** Top panel contains box plots of differentially expressed
 1293 genes in different contrasts. Bottom panel indicates the elements of butterfly wing pattern (gold
 1294 ring, eye spot center, black ring, whole eye spot, or dorsal/ventral identity) influenced by the
 1295 corresponding differentially expressed gene. For top panel, light hue = naïve, dark hue = trained,
 1296 orange = male, blue = female, green = condition (general trained/naïve). Asterisks indicate
 1297 FDR < 0.05. Dark horizontal lines inside boxes indicate median with upper and lower box bounds
 1298 denoting the 25th and 75th percentiles. The box whiskers denote the largest and smallest count
 1299 values $\leq 1.5 \times$ the interquartile range.

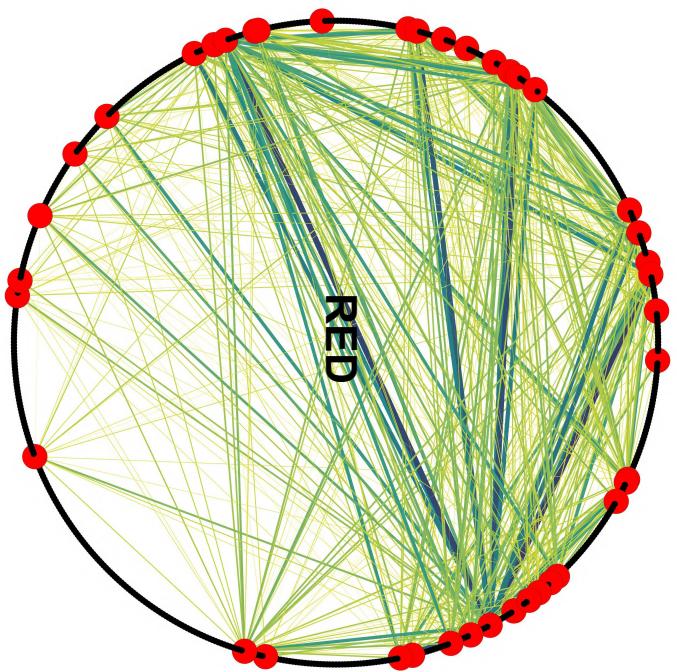
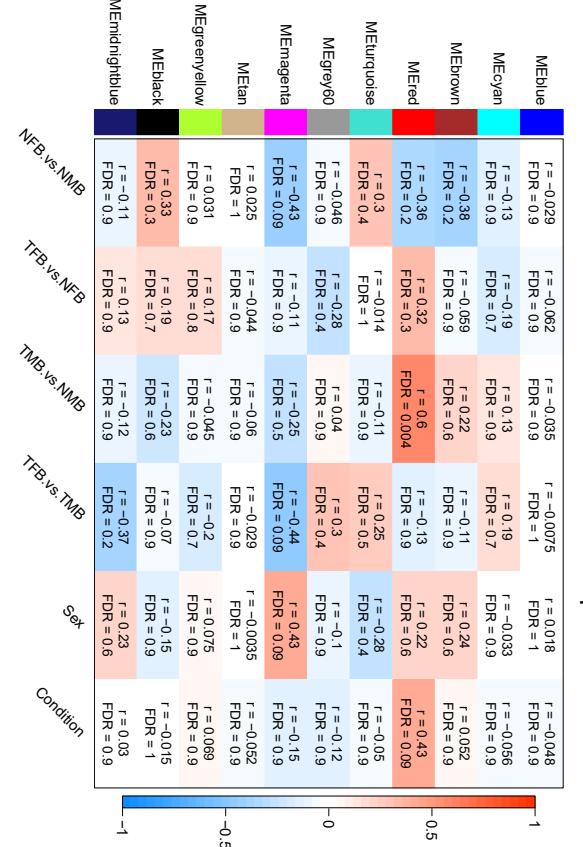
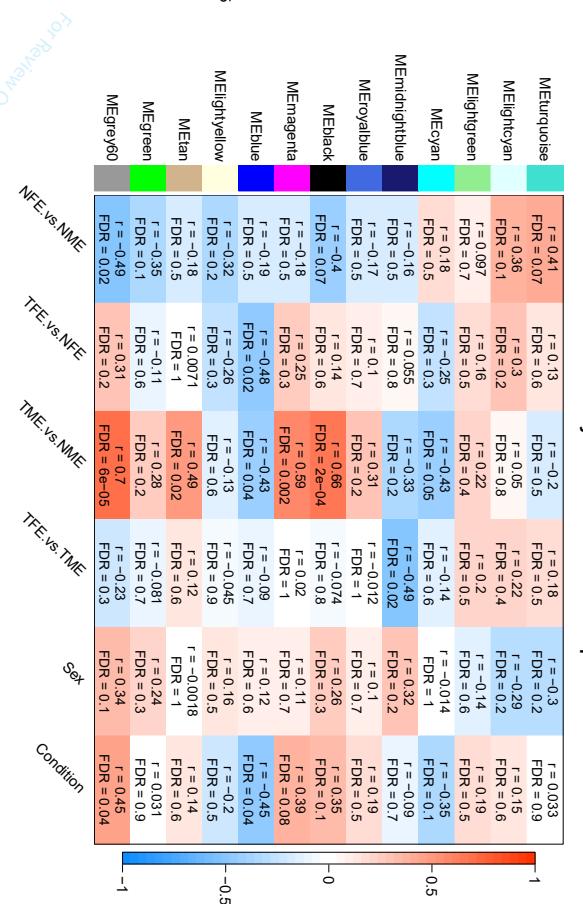
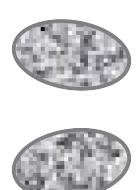
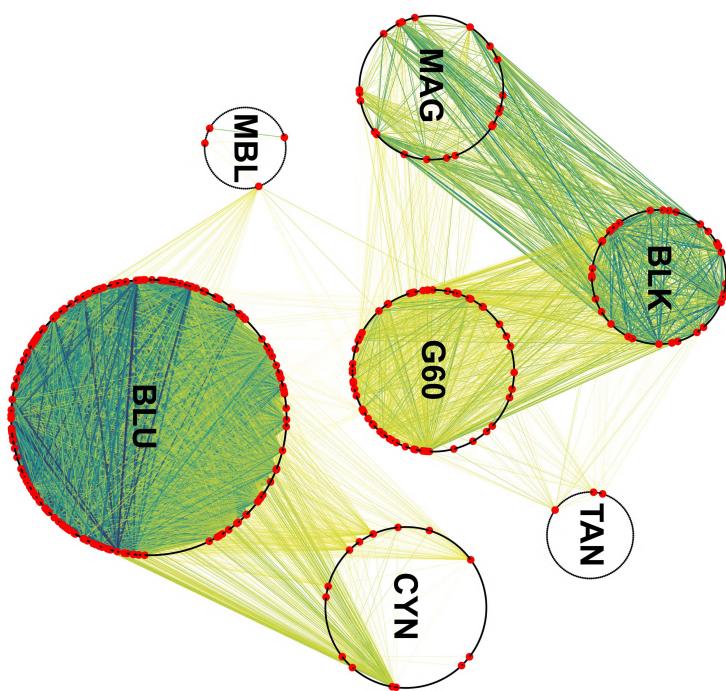
1300

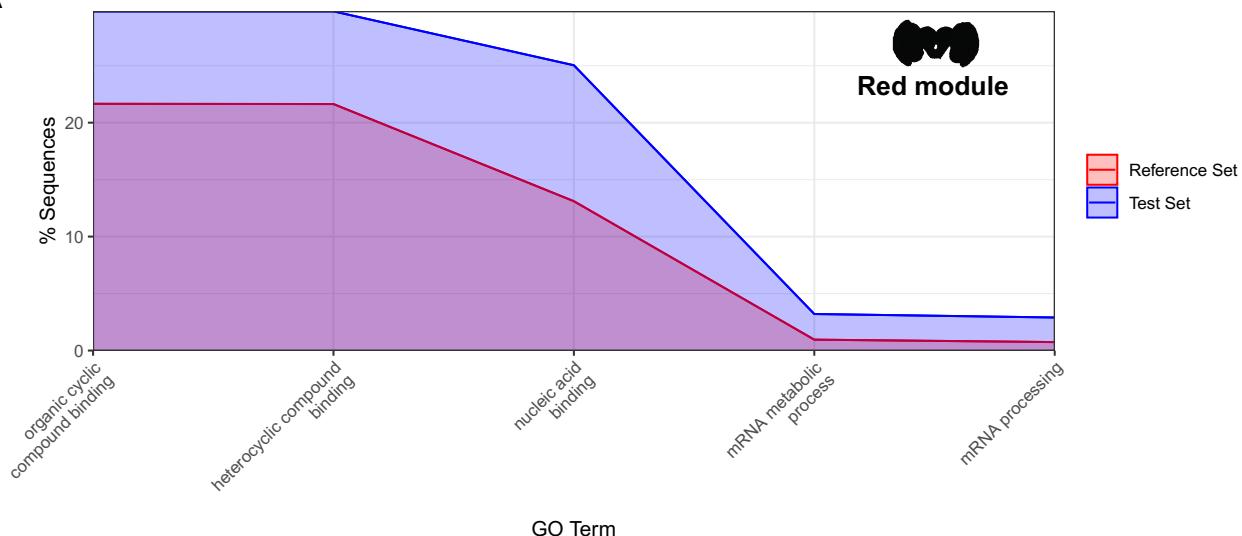
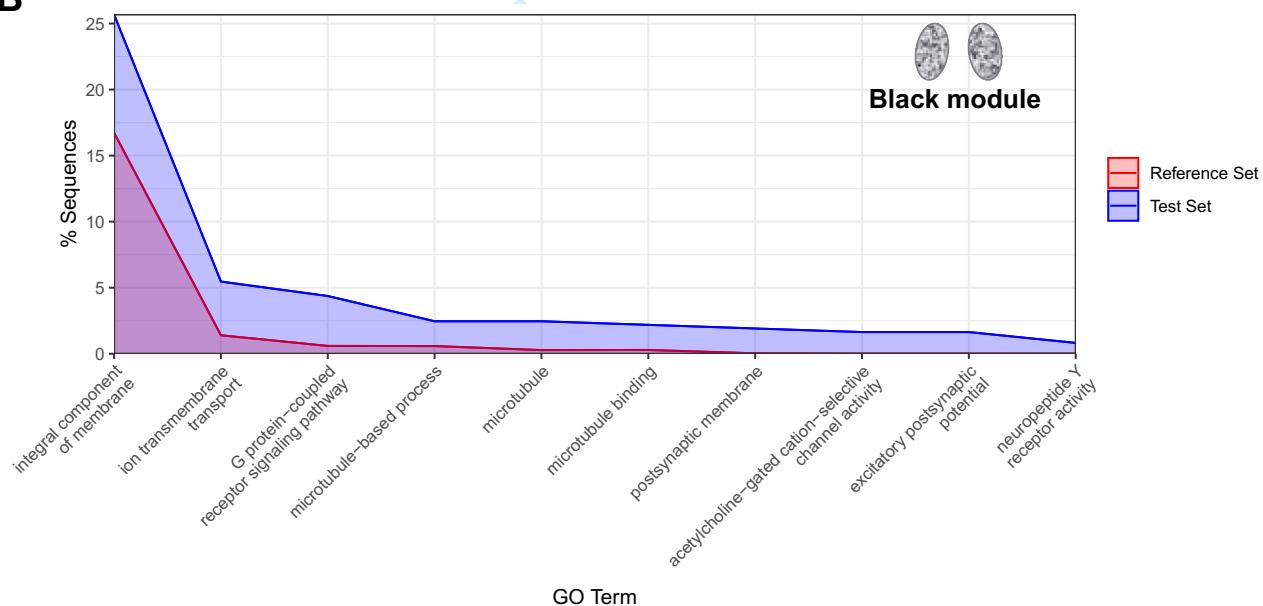




Contrast



A**C****B****D**

A**B****C**