1	Shared neural transcriptomic patterns underlie the repeated evolution of mutualistic							
2	cleaning behavior in Labridae wrasses							
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37 convergence, parallelism, phylogenetic comparative analysis

## 38 Abstract

Despite the remarkable diversity of life forms on earth, evolutionary biologists have discovered 39 40 numerous instances where even distantly related species share astonishing similarities in how they behave, look, and function. Given the importance of happenstance in evolution (e.g., random 41 mutations, genetic drift, environmental stochasticity), it is often assumed that the mechanisms 42 43 underlying such convergent phenotypes are distinct. Nevertheless, recent discoveries that the same pathways can underlie convergently evolved phenotypes have reinvigorated questions about the 44 predictability of evolution and whether broadly conserved genomic mechanisms facilitate 45 phenotypic convergence. Here, we generated transcriptomes of the putative teleost homologs of 46 the mammalian hippocampus and basolateral amygdala, broadly associated with spatial and social 47 48 cognition, in six sympatric species of Labridae wrasses that vary in mutualistic cleaning behavior (including three non-cleaning, two facultative cleaning, and one obligate cleaning species) and 49 combined differential gene expression, gene co-expression, and phylogenetic comparative 50 51 analyses to test two hypotheses about convergent evolution and specialization of mutualistic cleaning behavior. We first identify genes and gene modules exhibiting parallel 52 53 neurotranscriptomic patterns in the repeated evolution of facultative cleaning. We then examined 54 whether expression and co-expression patterns associated with facultative cleaning are also shared 55 in the obligate cleaner species in our dataset and found evidence for transcriptomic concordance, 56 though no evidence for additional specialization. Taken together, our results provide insights into 57 the convergent evolution and the neuromolecular basis of cooperative behavior and, more 58 generally, illustrate the potential of phylogenetic comparative transcriptomics to unravel the mechanistic underpinnings of the repeated evolution of complex organismal phenotypes. 59

## 61 Introduction

For all the spectacular diversity generated in evolution, there are often remarkable 62 63 similarities among species in how they behave, look, and function. Such similarity in phenotypes can reflect both shared evolutionary history - resulting from the multitude of molecular and 64 developmental pathways shared by any given lineage of organisms – and/or convergent responses 65 66 to similar ecological challenges (Gould, 1989; Brakefield, 2006; Losos, 2011; Stern, 2013; Blount et al., 2018). While there is now ample empirical evidence suggesting that convergence is much 67 more common in nature than Gould (1991) predicted (Orgogozo, 2015; Blount et al., 2018), it is 68 still unclear to which extent the prevalence of convergence is due to shared evolutionary history 69 (Stern, 2013; Bolnick et al., 2018). First, studies of convergence often investigate replicate 70 populations of the same or closely related species (Kocher et al., 1993; Foster and Baker, 2004; 71 Mahler et al., 2013; Langerhans, 2017; Renn et al., 2018). In this case, the selection pressures of 72 similar environments might eclipse the effects of historical contingency. At longer timescales, 73 74 divergence, contingency, and stochasticity among species are expected to limit the potential for homoplasy (i.e., independently evolved similarity of a trait) (Gould, 1989; Wake et al., 2011; 75 Orgogozo, 2015). Further, because many distinct genotypes, developmental pathways, and cellular 76 77 origins can give rise to functionally equivalent and even homologous phenotypes (True and Haag, 2001; Young and Wagner, 2011), it has been suggested that the molecular and physiological 78 79 processes underlying convergently evolved organismic traits (e.g., phenotypes or functions with 80 independent evolutionary origins) are more likely to be nonparallel (i.e., associated with distinct 81 underlying mechanisms) (Storz, 2016; Roda et al., 2017; Bolnick et al., 2018; Cheng et al., 2021). 82 Nevertheless, there are now numerous examples where the same pathways or even genes appear 83 to have been deployed repeatedly in the service of a convergently evolved phenotype (Castoe et

al., 2009; Zhen et al., 2012; Witt and Huerta-Sánchez, 2019), even at the level of the transcriptome
(Chan et al., 2009; Gallant et al., 2014; Pankey et al., 2014; Pfenning et al., 2014; Gao et al., 2019;
Young et al., 2019). In fact, recent progress resolving evolutionary relationships among animals
indicates that such homoplasies are much more common than previously appreciated, even among
distantly related taxa (Rokas and Carroll, 2008; Dunn et al., 2014; Lamichhaney et al., 2019).

89 A fascinating example of behavioral convergence is mutualistic cleaning. In this cooperative behavior, so called 'cleaner' species remove ectoparasites and dead tissue from their 90 91 'clients,' which are often larger species (Poulin and Grutter, 1996; Côté, 2000). Cleaning 92 mutualisms have independently evolved in several marine vertebrates and invertebrates including shrimp, crabs, gobies, and wrasses as well as in fresh water and terrestrial systems (reviewed in: 93 Poulin and Grutter, 1996; Côté, 2000; Vaughan et al., 2017). In fishes, repeated evolution of 94 mutualistic cleaning consists not only of behavioral changes but is also associated with anatomical 95 convergence in body elongation and musculoskeletal morphology and function of the feeding 96 97 apparatus (Baliga and Mehta, 2014, 2019; Huie et al., 2020). The highest proportion and diversity of cleaner fishes are present in the Labridae wrasses with at least 58 species exhibiting mutualistic 98 cleaning behavior during at least one life history stage (Côté, 2000; Baliga and Law, 2016; 99 100 Vaughan et al., 2017). Resulting from an estimated 26 to 30 independent evolutionary transitions, mutualistic cleaning has emerged in wrasses over relatively recent evolutionary history (i.e., within 101 102 the last 20 million years; Baliga and Law, 2016). Because behavior, like mutualistic cleaning, is 103 closely tied to the neural transcriptome, repeated transitions to the complex mutualistic cleaning phenotype across wrasse species allows us to test the hypothesis that rapid and frequent evolution 104 105 of complex behavioral phenotypes are facilitated by repeated deployment of parallel 106 neurotranscriptomic mechanisms.

Within the Labridae wrasses, cleaning behavior varies in ontogenetic timing and 107 behavioral and cognitive specialization, with some species relying on cleaning as a primary food 108 source – obligate cleaners – and others cleaning only as juveniles or facultatively throughout 109 ontogeny - facultative cleaners (Fig. 1; Côté, 2000; Barbu et al., 2011; Baliga and Law, 2016). 110 Increased reliance on cleaning behavior (i.e., in obligate cleaners) is linked to increased behavioral 111 112 and cognitive specialization, such as a greater diversity of client species, increased duration of cleaning bouts, opportunistic cheating, and cognitive performance during client interactions 113 114 (Barbu et al., 2011; Gingins and Bshary, 2016). Further, behavioral specialization correlates with morphological specialization such that the highly specialized obligate cleaner species exhibit more 115 limited morphological variation and increased body elongation (Baliga and Mehta, 2019). 116 Interestingly, evolutionary transitions between juvenile and adult cleaners (obligate or facultative) 117 are phylogenetically correlated suggesting that adult cleaning may have evolved from a juvenile 118 cleaning state (Baliga and Law, 2016), perhaps by maintaining an early life history state via 119 120 neoteny (or heterochronic changes in timing of developmental or ontogenetic events that maintain juvenile or early life states in the adult organism, "paedomorphosis" sensu Garstang, 1928). 121 Though morphological and phylogenetic correlations suggest similarities in the underlying 122 123 mechanistic bases and evolutionary trajectories of obligate and facultative cleaner types, whether the neurotranscriptomic underpinnings of cleaning behavior are shared by both cleaner types is 124 125 unknown.

In general, the neural and molecular underpinnings of cooperative behavior like mutualistic cleaning (for review see: Soares et al., 2010; Soares, 2017) remain poorly understood (Weitekamp and Hofmann, 2014, 2017). However, studies by Soares and colleagues have begun to illuminate the neuroendocrine mechanisms of cleaning behavior, with a particular focus on the Indo-Pacific

bluestreak cleaner wrasse Labroides dimidiatus. For example, these authors showed that the 130 nonapeptide arginine vasotocin (AVT, the non-mammalian homolog of arginine vasopressin) 131 132 appears to inhibit cleaning behavior in L. dimidiatus (Cardoso et al., 2015), possibly via the V1a receptor subtype (Soares et al., 2012) and through modulation of their learning competence 133 (Mendonca et al., 2013). While these studies have provided important insights into the regulation 134 135 of mutualistic cleaning behavior, they have been limited to candidate neuroendocrine and neuromodulatory pathways and to one species that is most amenable to experimental manipulation. 136 137 In fact, a systems-level understanding of cleaning behavior and its evolution based on genomewide analyses of the gene co-expression networks is lacking. However, because RNA sequencing 138 can be performed in principle on any tissue and species, neural transcriptomic comparisons across 139 species can test hypotheses of convergent evolution and identify candidate brain regions and novel 140 candidate genes associated with specific behavior phenotypes. 141

Even though the labrid brain has received little attention from neuroanatomists (but see 142 143 Nugent et al., 2021; Lamm et al., 2022), there is an evolutionarily conserved Social Decision-Making Network (SDMN) that is critical for evaluating stimulus salience and regulating sexual, 144 aggressive, and parental behavior across vertebrates (O'Connell and Hofmann, 2011b, 2012). Two 145 146 SDMN nodes that have been well studied for their role in spatial and social cognition, respectively, deserve particular attention in the context of a phenotype as complex as cleaning behavior. First, 147 148 the medial pallium (which forms the hippocampus in mammals) plays a critical role in spatial 149 memory in mammals (O'Keefe and Nadel, 1978; Andersen et al., 2007; Humphries and Prescott, 150 2010) and has a functionally equivalent role in both avian and non-avian reptiles (Striedter, 2016; 151 Butler, 2017) and teleost fish (Elliott et al., 2017; Trinh et al., 2019; Vinepinsky et al., 2020). And 152 second, the lateral pallium (which mainly comprises the basolateral amygdala in mammals)

integrates multimodal sensory inputs and regulates affective and goal-directed behavior in mammals (Maeda and Mogenson, 1981; LeDoux, 2000; Moreno and González, 2007), similar to the situation in birds and reptiles (Martínez-García et al., 2002) as well as teleosts (Portavella et al., 2002). Together, the medial (area DI in teleosts: lateral part of the dorsal telencephalon) and the lateral pallium (area Dm in teleosts: medial part of the dorsal telencephalon) are ideally suited for comparative analyses as they are complementary in function and reciprocally connected.



**Figure 1.** Evolutionary relationships and cleaner type of 343 wrasses (Labridae) (redrawn Baliga and Law, 2016). Branches are colored by species cleaning activity with obligate cleaners, facultative cleaners, and non-cleaners highlighted in purple, gold, and grey, respectively. Names and phylogenetic position of species of wrasses selected for this study are highlighted. The selected species represent differences in cleaning activity (obligate cleaners, facultative cleaners, and non-cleaners). The distribution of the selected species across the tree suggests three independent transitions to cleaning. The number of individuals sequenced for each species is shown in parentheses.

- 159 It is clear that differences in the neural transcriptome underlie behavioral variation (Zayed
- and Robinson, 2012). In fact, coordinated expression of neural genes associated with convergently
- 161 evolved behavioral phenotypes can be conserved across even distantly related species (Pfenning

et al., 2014; Rittschof et al., 2014; Morandin et al., 2016; Renn et al., 2016, 2018; Young et al., 162 2019). However, linking transcriptomic and phenotypic variation across species requires an 163 164 understanding of how gene expression evolves. First, transcriptomes are inherently noisy due to the stochastic nature of the biochemical reactions of transcription (Raser and O'Shea, 2005), and 165 can be highly plastic in response to environmental and physiological fluctuations (reviewed in: de 166 167 Jong et al., 2019), which can mask relevant evolutionary patterns depending on when and how samples are obtained and analyzed (Liang et al., 2018; Rittschof and Hughes, 2018; Fischer et al., 168 169 2021). Second, phenotypes can be altered by the changes in expression of individual genes or 170 entire gene co-expression networks (Hartwell et al., 1999; Stuart et al., 2003; Barabasi et al., 2004; Carroll, 2008; Harrison et al., 2012; Mehta et al., 2021). Thus, evolutionary changes in temporal 171 and spatial gene expression patterns (e.g., tissue or cell expression domains) over the course of 172 ontogeny can result in the loss (addition) of genes from (into) existing gene co-expression 173 174 networks, potentially influencing the phenotype (Hu et al., 2016; reviewed in: Halfon, 2017). 175 Finally, because like other complex traits, the transcriptome is shaped by stabilizing selection (Gilad et al., 2006; Bedford and Hartl, 2009; Romero et al., 2012) and evolves via neutral or nearly 176 neutral processes (e.g., drift; Khaitovich et al., 2004), testing hypotheses of convergent evolution 177 178 of phenotypes using transcriptomics data requires examination of differential expression and gene co-expression combined with rigorous phylogenetic comparative analyses and tests of appropriate 179 180 null hypotheses (Dunn et al., 2013; Young and Hofmann, 2019).

Here, we combine differential gene expression, gene co-expression, and phylogenetic comparative analyses of the neural transcriptome to test two main hypotheses about the evolution and specialization of mutualistic cleaning behavior in *Labridae* wrasses. Targeting brain regions associated with spatial and social cognition, we sequenced RNA extracted from a brain section

containing both putative teleost homologs of the mammalian hippocampus and basolateral 185 amygdala (areas Dl and Dm, respectively; O'Connell and Hofmann, 2011b) from six sympatric 186 wrasse species that vary in mutualistic cleaning behavior including three non-cleaning species, 187 two facultative cleaning species, and one obligate cleaning species (Fig. 1). We then tested two 188 hypotheses: first, we hypothesized that the repeated evolution of facultative cleaning is 189 190 accompanied by parallel neurotranscriptomic patterns beyond what is expected by chance and after correcting for phylogenetic non-independence among species. Second, we hypothesized that gene 191 192 expression and co-expression patterns associated with facultative cleaning are shared and 193 specialized in obligate cleaners. An alternative hypothesis is that obligate cleaning evolves by maintaining an early life history state via neoteny. Testing this hypothesis would require 194 comparisons between adult and juvenile sample across species and is beyond the scope of this 195 study. 196

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#### 198 **Results**

### 199 *Gene expression quantification across species*

After pre-processing for quality control, 3'tagseq reads were mapped to the Nile tilapia (*Oreochromis niloticus*) coding sequences (Orenil1.0 Ensembl cDNA). Despite the evolutionary distance between the focal species and genomic reference (114 MYA) we obtained expression information for a large number of genes for each species (Supplementary Table S1). In interspecific analyses, especially when multiple species are aligned to non-species-specific reference genomes, interpretation of zero read counts is confounded by the possibility of an inability to align reads due to sequence divergence. As a result, we filtered the gene set such that that each gene was expressed in at least one individual of each species. The resulting set of 10,411genes was used for all downstream analyses.

209 Expression variation across species reveals neural transcriptomic signature of cleaning

We first asked how the neural transcriptome varies across species. We use Discriminant Analysis of Principal Components (DAPC) with the goal of summarizing and discriminating transcriptomic variation across the six species (as in Kenkel and Matz, 2016; Fig. 2A). We find a clear separation among species on the first two discriminant functions. Despite the fact that DAPC is blind to cleaner type, the species align by cleaner type on the first discriminant function. Second,



Figure 2. Variation in the neural transcriptome across species (A) and cleaner and non-cleaner species (B). (A) DAPC summarizes the main axis of expression variation across all 10,411 genes using PCA. Next, it minimizes variation within each species and maximizes variation across species using discriminate analysis. Though blind to cleaner affiliation, the species align by cleaner type affiliation (separated by colors) on the first discriminant function. The ellipsoid indicates inertia ellipses or a graphical summary of the point distribution. Vertical and horizontal lines are zero-scaled means of the discriminant functions. (B) 264 genes are differentially expressed between cleaners (both obligate and facultative) and non-cleaner species. Genes differentially expressed were more likely to contribute highly to the separation of species on discriminant function 1 (top 1% and top 5%, A).

we tested the hypothesis that species that engage in mutualistic cleaning at any life history stage

216 (i.e., both obligate and facultative cleaners) exhibit distinct neural transcriptomic patterns from

- those species that do not clean (non-cleaner species). We identified 264 (2.5%) differentially
- 218 expressed genes (DEGs) after eliminating species-specific variation and correcting for false
- discovery rate (adjusted *p*-value < 0.05), with 146 genes showing increased expression and 118

220 genes showing decreased expression in cleaners (both obligate and facultative) as compared to 221 non-cleaners (Fig. 2B; Table 1). Genes differentially expressed between cleaner and non-cleaner 222 species (Fig. 2B) were more likely to contribute to separation across species (Fig. 2). Genes with 223 high loadings (top 5% 167/264 or 63.2% of DEGs, ecdf p = 1.3e-159; top 1%: 53/264 or 20% of 224 DEGs, ecdf p = 1.2e-59) on the first discriminant function (Fig. 2A, x-axis) were more likely to 225 differentially expressed between cleaners and non-cleaners (Fig. 2B, grayscale).

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Table 1. Number of differentially expressed genes (DEGs, adjusted p-value < 0.05; out of 10,411 total genes in the analysis) in the cleaner type comparisons.

comparison	# of DEGs	# of non-DEGs	
cleaners vs non-cleaners	264 (2.5%)	10,147 (97.5%)	
facultative vs non-cleaner	342 (3.3%)	10,109 (96.7%)	
obligate vs. non-cleaner	284 (2.7%)	10,127 (97.5%)	

227

228 Facultative cleaner species exhibit parallel gene expression profiles

229 We tested the hypothesis that the repeated evolution of facultative cleaning is accompanied by parallel patterns of neural gene expression. First, we performed a differential expression 230 analysis between the two facultative cleaner species (H. melanurus and T. lunare) and the three 231 non-cleaner species (C. batuensis, H. melapterus, and L. unilineatus) with the aim of identifying 232 genes consistently associated with facultative cleaning. We identified 342 (3.3%) differentially 233 expressed genes (DEGs) after correcting for false discovery rate (adjusted p-value < 0.05), with 234 218 genes showing increased expression and 124 genes showing decreased expression in 235 facultative cleaners as compared to non-cleaners (Fig. 3A). Second, to test explicitly whether the 236 237 two facultative species (H. melanurus and T. lunare) are more similar to each other in gene expression profiles than to any other pair of species (including those that are more closely related), 238 we performed a differential gene expression analysis of all pairwise species. We found that the 239

two facultative species had significantly fewer DEGs (624; 0/14 comparisons, ecdf p = 0) compared to all other species pairs (median = 1132.5; Fig 3B).



Figure 3. 342 genes are differentially expressed between facultative cleaner and non-cleaner species (A). Pairwise species comparisons between all species pairs found fewer DEGs between the facultative cleaner species as compared to all other species pairs (B: gold diamond). Estimated divergence times (millions of years ago) at each node were obtained from TimeTree (Hedges et al., 2006; Kumar et al., 2017). Combining gene co-expression analysis and phylogenetic comparative analyses finds one co-expression module (magenta) significantly associated with facultative cleaning (C). The number of genes contained in each module is indicated by module size (C). Dashed lines indicated statistical support for the phylogenetic ANOVA at p < 0.1 (black) and p < 0.05 (red) (C). Species-level co-expression comparisons reveal that the magenta module eigengene co-expression is similar within cleaner type (e.g., between the two facultative cleaner species, gold) and significantly different across cleaner type comparisons (e.g., between non-cleaner and facultative species, grey and gold, respectively) (D). Significance between pairwise comparisons is indicated by the associated letters (D).

- 242 Gene co-expression analysis identifies a gene module robustly associated with independent
- 243 *transitions to facultative cleaning*

244	To further test the hypothesis that the repeated evolution of facultative cleaning is
245	accompanied by parallel patterns of neural gene expression we used Weighted Gene Co-expression
246	Network Analysis (WGCNA) of facultative and non-cleaner species. WGCNA of all 10451 genes

yielded nine modules varying in size from 81 to 3016 genes (Fig. 3C). Welch's t-test and ANOVA 247 revealed a number of modules whose co-expression eigengene differs across facultative and non-248 cleaner types (Supplementary Table S2). We found seven modules that differ significantly across 249 species (Supplementary Figure S1; Supplementary Table S3). Only one module (magenta) differed 250 between facultative cleaners and non-cleaners after accounting for phylogenetic non-independence 251  $(F_{(1,44)} = 274.6, p = 2.8e^{-20};$  phylogenetic ANOVA F = 326.7, p = 0.001; Fig. 3C and D; 252 Supplementary Table S2). To assess the probability of identifying a module associated with 253 cleaner type by chance, we used a permutation approach. We resampled genes within each species 254 255 and performed WGCNA followed by our downstream module-trait association tests. 1000 iterations yielded a total of 7455 pseudo-modules. None of the pseudo-modules were considered 256 significant in the phylogenetic ANOVA of cleaner type. Thus, the probability of discovering, by 257 258 chance, a module associated with the facultative cleaner phenotype, such as the magenta module, is very low (p < 7.5e-3). 259

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261 Integrative analysis uncovers candidate genes robustly associated with facultative cleaning

Finally, to identify gene expression signatures robustly associated with evolutionary 262 transitions to facultative cleaning, we integrated analyses of evolutionary divergence (Expression 263 Variance and Evolution model (EVE): Rohlfs and Nielsen, 2015), differential gene expression, 264 and gene co-expression. First, we screened for genes with high intramodular connectivity in 265 modules of interest. Identifying these so called hub genes provides a biologically motivated data 266 267 reduction approach that has been shown to yield meaningful insight through identification of candidate genes and pathways (e.g. see: Gargalovic et al., 2006; Horvath et al., 2006; Liu et al., 268 2019). Second, we used EVE analysis (Rohlfs and Nielsen, 2015) to calculate evolutionary 269



Figure 4. Gene connectivity in the facultative cleaner-associated magenta module is positively correlated with expression divergence across species ( $F_{(1,79)} = 67.08$ , p = 3.7e-12) and fold difference in expression between facultative and non-cleaners ( $F_{(1,79)} = 216.6$ , p = 2.2e-16) (A). 25 magenta module genes were significantly differentially expressed between facultative and non-cleaner species and had higher than average expression divergence (A: red triangles). Overall, the expression of these 25 candidate genes of facultative cleaning had higher expression in facultative cleaners as compared to non-cleaners (B). Cleaner type and species affiliation of each sample are shown using the color bar and letter annotation, respectively Candidate genes broadly associated with neural development and function, identified from the literature, are shown in green (B; Supplementary Table S6). Bootstrap support for sample clustering (B) is provided in Supplementary Figure S3. The relationship between differential expression (facultative cleaners compared to non-cleaners, *limma*:  $-log_{10}$  adjusted p-value) and evolutionary divergence (EVE:  $-log_{10}B$ ) is shown in Supplementary Figure S4.

divergence scores  $(-\log_{10}\beta_i)$  to identify genes that exhibited higher than average interspecific 270 variability indicative of evolutionary divergence. Specifically, genes with  $-\log_{10}\beta_i$  greater than the 271 272  $-\log_{10}\beta$  shared across all 10451 genes ( $-\log_{10}\beta_{\text{shared}} = -0.675$ ) were considered to have high interspecific variability. We found that the more highly connected hub genes of the facultative 273 cleaning-associated magenta module were also differentially expressed ( $F_{(1,79)} = 238.8, p = 2.2e$ -274 275 16) and exhibited high evolutionary divergence scores ( $F_{(1,79)} = 67.08$ , p = 3.7e-12; Fig. 4A). Specifically, we identified 25 differentially expressed magenta module genes with high 276 277 interspecific variability as previously undescribed candidate genes associated with facultative 278 cleaning (Fig. 4B; Supplementary Table S4). We were able to annotate 24 of these 25 genes with a molecular or cellular function. Of note, 17 (68%) of these genes have been broadly implicated 279 in neural development and function (highlighted in green font Fig 4B; Supplementary Table S4). 280 281 The relationship between evolutionary divergence  $(-\log_{10}\beta)$  and differential expression between facultative cleaners and non-cleaners (-log<sub>10</sub> adjusted p-value) for all genes is shown in 282 283 Supplementary Fig. S4).

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285 Facultative and obligate cleaner species show concordant expression and co-expression patterns 286 Next, we asked whether the one obligate cleaner species (L. dimidiatus) in our analysis displayed gene (co-)expression patterns that were concordant with those of the facultative cleaners 287 288 described above. To do this, we first compared the obligate cleaner (L. dimidiatus) and the non-289 cleaner species (C. batuensis, H. melapterus, and L. unilineatus) and found 284 (2.7%) DEGs with 205 genes showing increased expression and 79 genes showing decreased expression in the 290 291 obligate cleaner species as compared to non-cleaners. We then compared differential gene 292 expression between facultative cleaners and non-cleaners with differential expression in the

obligate cleaner and non-cleaners (Supplementary Figure S2A). Specifically, we examined the 293 intersection of four gene sets (Tables 1 and 2): (1) genes that were differentially expressed and 294 directionally concordant in both differential expression analyses (342 DEGs in facultative versus 295 non-cleaners and 284 DEGs in obligate versus non-cleaners); (2) genes differentially expressed 296 between facultative and non-cleaners (342 DEGs) and directionally concordant (but not 297 298 significant) between obligate and non-cleaners (10,127 non-DEGs); (3) genes differentially 299 expressed between facultative and non-cleaners (342 DEGs) and directionally discordant (but not 300 significant) between obligate and non-cleaners (10,127 non-DEGs, as above in 3); and (4) 301 differentially expressed in both analyses (342 DEGs in facultative versus non-cleaners and 284 DEGs in obligate versus non-cleaners, as above in 1), but directionally discordant. Comparing 302 differential expression analyses, we found that 44 of the 342 DEGs (12.9%) between facultative 303 cleaner and non-cleaner species were also DEGs in the concordant direction between the obligate 304 and non-cleaners, which is significantly more than expected by chance (Fig. 5A and B; Tables 1 305 306 and 2: 44/284 DEGs in the obligate versus non-cleaner comparison; ecdf p = 5.1e-19). The expression of an additional 188 of these 342 DEGs (54.9%), while not significant, were concordant 307 in the obligate versus non-cleaner species (Fig. 5A and B; Tables 1 and 2: 188/10,127 non-DEGs 308 309 in the obligate versus non-cleaner comparison; ecdf p = 1). Finally, only 5 of these 342 DEGs (1.5%) were significantly differentially expressed, but directionally discordant in the obligate 310 311 versus non-cleaner comparison (Fig. 5A and B; Tables 1 and 2: 5/284 DEGs in the obligate versus 312 non-cleaner comparison; ecdf p = 1) and 105 of these 342 DEGs (30.7%) were discordant between 313 obligate versus non-cleaner species (Fig. 5A and B; Tables 1 and 2: 105/10,127 non-DEGs in the 314 obligate versus non-cleaner comparison; ecdf p = .91). In other words, cleaner-level differential 315 expression comparisons supported concordance of gene expression patterns in facultative and

obligate cleaners (Fig. 5A and B, dark blue). However, we did not find evidence for increased
similarity in overall gene expression at the species level between facultative cleaners and the
obligate cleaner species (Fig. 3B, upward triangles).

To further characterize gene co-expression changes associated with facultative cleaning 319 or cleaning in general (i.e., obligate and facultative cleaners) we assessed differences in gene 320 321 connectivity of genes from our nine focal co-expression modules in the obligate cleaner, the facultative cleaners, and the non-cleaner. Because the magenta module was uniquely associated 322 323 with facultative cleaners (Fig. 3C and D), we focused on the connectivity of magenta module genes 324 with all other genes in the transcriptome (kTotal) in the three cleaner types (all other modules are shown in Supplementary Figure S5 and Supplementary Table S7). We found that connectivity of 325 magenta module genes was highest in the obligate cleaner and lowest in the non-cleaner species 326 (Fig. 5D;  $F_{(2,240)} = 68.1$ ; p = 3.8E-24) and differed significantly between all pairwise cleaner types 327 (non-cleaners versus facultative cleaners: t ratio = -2.34, adjusted p-value = 1.92E-2; non-cleaners 328 329 versus the obligate cleaner: t ratio = -8.48, adjusted p-value = 7.31E-17; facultative cleaners versus the obligate cleaner: t ratio = -6.13, adjusted p-value = 1.31E-9). Further, we found that gene 330 connectivity in facultative cleaners was significantly correlated with connectivity in both obligate 331 332 and non-cleaner species (Fig. 5E; non-cleaners versus facultative cleaners: Spearman's  $\rho = 0.37$ ; adjusted p = 0.001; facultative cleaners versus the obligate cleaner: Spearman's  $\rho = 0.44$ ; adjusted 333 334 p = 7.8E-5). One other module, the brown module (Fig. 3C), exhibited a similar pattern of 335 connectivity between cleaner types; however, effect sizes of connectivity differences and gene connectivity correlations between cleaner types were generally weaker, further statistical 336 337 significance may reflect, in part, increased power associated with larger module size (i.e., 1826

genes in the brown module versus 81 genes in the magenta module; Supplementary Fig. S4;Supplementary Table S7).



Figure 5. Concordance of expression (A and B) and co-expression patterns (C-D) in facultative and obligate cleaner species as compared to non-cleaner species. 67.8% of the 264 facultative versus non-cleaner DEGs, were expressed in the concordant direction in obligate versus noncleaners (A and B, blues). We found more genes than expected by chance (12.9%) were differentially expressed between facultative cleaner and non-cleaner species were also differentially expressed and directionally concordant in expression between obligate and noncleaner species (A, dark blue; 44 genes, p = 5.1e-19). Gene connectivity of the facultative cleaning associated magenta module (Fig. 3C and D) genes was highest in the obligate cleaner and lowest in non-cleaners (C;  $F_{(2,240)} = 68.1$ ; p = 3.8E-24) and differed across all pairwise combinations of cleaner types (Supplementary Table S7). Further, gene connectivity in facultative cleaners was significantly correlated with connectivity in both the obligate cleaner and non-cleaners (D; non-cleaners versus facultative cleaners: Spearman's  $\rho = 0.37$ ; adjusted p =0.001; facultative cleaners versus the obligate cleaner: Spearman's  $\rho = 0.44$ ; adjusted p = 7.8E-5). Connectivity comparisons and associated statistics for all additional modules and non-cleaners versus the obligate cleaner are provided in Supplementary Figure S5 and Supplementary Table S7. The dashed line indicates adjusted p-value < 0.05 (A Significance between pairwise comparisons is indicated by the associated letters (C). Shading on the regression indicates the standard error (D).

Table 2. Directional concordance of gene expression in facultative and obligate cleaners as compared to non-cleaners. Of the 342 differentially expressed genes (DEGs) identified in facultative cleaners (compared to non-cleaners), those with a concordant differential expression patterns in obligate cleaners were significantly over-represented (highlighted by an asterisks).

	DEGs (both analyses)		Non-DEGs obligate vs. non-cleaner	
	Concordant	Discordant	Concordant	Discordant
Overlapping DEGs in obligate vs. non-cleaner comparison	44*	5	188	105
Percentage of facultative vs. non-cleaner DEGs (n=342)	12.9%	1.5%	54.9%	30.7%
Fraction of obligate vs. non- cleaner DEGs (284)	15.5%	1.8%	-	-
Fraction of obligate vs. non- cleaner non-DEGs (10,127)	-	-	1.9%	1.0%

340

341 The obligate cleaner species L. dimidiatus shows no evidence of expression specialization
342 compared to the facultative cleaner species

To test the hypothesis that obligate cleaning is a specialization of facultative cleaning, we 343 compared differential gene expression between facultative cleaners and non-cleaners with 344 differential expression in the obligate cleaner and non-cleaners and obligate cleaner and facultative 345 cleaners. Expression differences (Supplementary Figure S6A and B) between obligate (L. 346 dimidiatus) and facultative cleaners (H. melanurus and T. lunare) did not support the hypotheses 347 that obligate cleaning is a specialization of facultative cleaning. Specifically, DEGs between 348 facultative and non-cleaners are not specialized (i.e., more differentially expressed) in the obligate 349 cleaner (Supplementary Figure S6B). 350

# 351 Discussion

In the present study, we took advantage of the repeated, independent evolution of mutualistic cleaning behavior in wrasses to test our main hypothesis that convergent evolution of complex behavioral phenotypes is facilitated – in part – by the similar modifications to conserved

neurotranscriptomic mechanisms. Using 3'tag-based RNA sequencing, we quantified and 355 compared gene expression and co-expression in a brain section containing both the putative teleost 356 357 homologs of the mammalian hippocampus and basolateral amygdala, broadly associated with spatial and social cognition (O'Connell and Hofmann, 2011a, 2012; Yang and Wang, 2017), in six 358 species of Labridae wrasses that vary in mutualistic cleaning behavior (Fig. 1). By combining gene 359 360 expression and co-expression analyses with phylogenetic comparative analyses and tests against appropriate null hypotheses, we first ask whether species with distinct cleaner phenotypes vary in 361 362 transcriptome. Second, we ask whether neural repeated evolution of facultative cleaning is 363 accompanied by parallel neurotranscriptomic patterns beyond what is expected by chance and after correcting for phylogenetic non-independence among species. Third, we investigate whether gene 364 expression and co-expression patterns associated with facultative cleaning are shared and 365 specialized in obligate cleaners. Comparisons of gene expression and co-expression across species 366 and cleaner types indicate that neural gene expression varies between cleaner and non-cleaner 367 368 species, provide strong support for shared neuromolecular basis of facultative cleaning, and show limited support for maintenance, but not specialization, of these neural transcriptomic patterns in 369 the obligate cleaner species. Below we discuss these results and their implications for our 370 371 understanding of mutualistic cleaning and cooperative behavior more generally as well as the mechanistic bases of convergent evolution of complex behavioral phenotypes. 372

373

## 374 *Neural transcriptomes differ among cleaning and non-cleaning species*

Characterizing the overall patterns of transcriptome variation across species revealed a strong
 signature of cleaner type. Using discriminant analysis of principal components (DAPC) we aimed
 to characterized transcriptomic variation that best highlighted species-level variation. While this

analysis was successful in distinguishing expression patterns among species, cleaner types also 378 emerged. Blind to cleaner affiliation, we found species separated by cleaner type rather than 379 380 evolutionary relatedness on the first discriminant function (Fig. 2A). Notably, the three cleaning species (i.e., one obligate cleaner and two facultative cleaners) each represent an independent 381 evolutionary transition to cleaning. In addition, we identified 264 genes differentially expressed in 382 383 cleaners (both obligate and facultative) compared to non-cleaners (Fig. 2B). Genes differentially expressed between cleaners and non-cleaners were more likely to contribute to species-level 384 385 variation (Fig. 2B). Combined these analyses support the hypothesis that gene expression in the 386 brain regions associated with spatial and social cognition differ between species that engage in mutualistic cleaning as compared with species that do not clean regardless of evolutionary history. 387 388

Parallel gene expression and co-expression patterns underlie independent the evolution of
facultative cleaning

391 Our analysis of neural gene expression and co-expression patterns between species pairs and facultative cleaners and non-cleaners (Figs. 3 and 4) provides robust support for the hypothesis 392 that shared neurotranscriptomic mechanisms underlie repeated evolution of facultative cleaning. 393 394 First, we found that the facultative cleaning species exhibited significantly more similar neural transcriptomic patterns than any other pair of species regardless of evolutionary distance (Fig. 3B). 395 396 Second, comparing combined facultative versus non-cleaners species, we found many genes 397 differentially expressed, indicating high concordance of directional changes in expression in the facultative cleaner (342; Fig. 3A). Interestingly, the differential expression analysis revealed a 398 399 strong directional bias between cleaner and non-cleaner comparisons. Two-thirds of the 400 differentially expressed genes have increased expression in the facultative cleaner species (Fig.

3A). Similarly, 72% of the genes differentially expressed between obligate cleaners and non-401 cleaners exhibit increased expression in the obligate cleaner (Supplementary Fig. S2A). However, 402 403 we did not find similar bias in gene activation when comparing facultative and obligate cleaner species (Supplementary Fig. S2B). Thus, our results suggest that the evolution, but not 404 specialization, of complex mutualistic cleaning behavior is associated with increased gene 405 406 activation in the putative teleost hippocampus and basolateral amygdala homologs targeted in our study. Given the role of stabilizing selection in transcriptome evolution (Khaitovich et al., 2004; 407 408 Gilad et al., 2006; Bedford and Hartl, 2009; Romero et al., 2012) and the strong species-specific 409 expression patterns (Supplementary Figure S1B and S7A), our finding of consistent directional bias in expression variation is notable. While any functional interpretation of this bias is 410 necessarily speculative at this point, it is suggestive that many of the novel cleaner candidate genes 411 we discovered are associated with synaptic function and plasticity, neuronal growth, and neurite 412 413 elongation (Supplementary Table S5). Increased activity of these genes in mutualistic cleaning 414 species could reflect enhanced spatial and social cognition in cleaners reflected compared to noncleaners (Mehta, 2015). Alternatively, it may reflect the molecular processes associated with a 415 decrease in central inhibitory control (sensu Roeder, 1935), which could enable cleaners to 416 417 approach much larger and, often, predatory client fish.

Beyond similarity in expression of individual genes in the facultative cleaner species, using gene co-expression analysis (WGCNA), we found a gene co-expression module significantly associated with facultative cleaning after taking phylogenetic non-independence among species (Fig. 3C and D). While this 81 gene module is relatively small, compared to the other modules defined by WGCNA (Fig. 3C), our permutation analyses revealed that discovering a module of any size (greater than the minimum modules size of 50 genes) associated with facultative cleaning after accounting for phylogenetic non-independence is highly unlikely. Moreover, expression of
most co-expression modules (7 of the 9) diverge across species, underscoring the strong species
signal present in the gene expression and co-expression patterns (Fig. 3C; Supplementary Figures
1 and 8) and further highlighting the unique transcriptomic pattern captured by the magenta
module.

429

### 430 Integrative analysis uncovers candidate genes robustly associated with facultative cleaning

In general, the neural and molecular underpinnings of mutualistic cleaning behavior are poorly 431 understood. However, some candidate neuroendocrine pathways have been implicated, with most 432 studies focusing on females of the obligate cleaner species L. dimidiatus and finding evidence for 433 a role of nonapeptides (arginine vasopressin, oxytocin), biogenic amines (serotonin, dopamine), 434 and sex steroid hormones (estradiol, testosterone) in regulating different aspects of this behavior 435 436 (for reviews see: Soares et al., 2010; Soares, 2017). It is important to note here that only the 437 obligate cleaner, L. dimidiatus, engages in regular and frequent cleaning bouts throughout life, while the facultative cleaning species included in our analysis (T. lunare and H. melanurus) 438 display cleaning behavior only as juveniles (Baliga and Law, 2016). Even though the candidate 439 440 genes and pathways suggested by previous studies may well be critical in regulating frequency of cleaning or specific behavior during acute cleaning bouts at least in some cleaner species, we did 441 442 not expect them to emerge in our analysis of the repeated evolution and specialization of 443 mutualistic cleaning behavior, which indeed was the case. In fact, by sampling free swimming fish engaged in a variety of activities our study was designed to minimize any effects of ongoing 444 behavior on our analysis, such that we could identify patterns of variation in *constitutive* expression 445 446 of genes associated with the repeated evolution of facultative cleaning. Towards this goal, we

integrated independent analyses including differential gene expression and co-expression with 447 gene connectivity and expression diversification. We found that the highly-connected hub genes 448 449 from the facultative cleaner associated magenta module were significantly more likely to be differentially expressed between facultative cleaners and non-cleaners and exhibited high 450 evolutionary divergence (Fig. 4A). Specifically, twenty-five facultative cleaning associated 451 452 magenta module genes were both differentially expressed between facultative cleaners and non-453 cleaners and exhibited high evolutionary divergence relative to all other genes in the genome (Fig. 454 4A). All 25 genes exhibit increased expression in the facultative cleaner species, again indicating 455 a bias towards increased gene expression in the evolution of mutualistic cleaning behavior. Twothirds of these genes are broadly associated with neural development and function (Fig. 4B). 456 While, to our knowledge, none of these genes have been previously associated the facultative 457 cleaning, 80% (20/25) of these facultative cleaning associated genes were implicated in cleaning 458 459 behavior in the obligate cleaner (L. dimidiatus; Kang et al., 2023). Importantly, detailed 460 descriptions of ecology, life history, and morphology of Labridae species clearly indicate that there is not a single such attribute – other than cleaning behavior – that is more similar between the two 461 facultative cleaner species, T. lunare and H. melanurus, than any other species in our analysis 462 463 (Randall et al., 1988; Krattinger, 2016) (Supplementary Table S5). This observation suggests that the transcriptomic similarities we have discovered are indeed due to the shared behavioral strategy. 464

465

*Evidence of shared, but not specialization, of expression and co-expression among cleaner types* Because species sampling was limited to one obligate cleaner species, *L. dimidiatus*, we
 were unable to integrate the obligate cleaner into our phylogenetic comparative analysis of
 cleaning-associated gene expression and co-expression patterns. However, we can ask whether

facultative and obligate species share similar gene expression and co-expression pattern. In fact, 470 we found gene expression patterns in the facultative and obligate cleaners to be quite concordant 471 472 as compared to the non-cleaner species. 68% of the genes differentially expressed in facultative cleaners were expressed in the concordant direction in the obligate cleaner (Fig. 5A and B). 473 Further, we found significantly more genes than expected by chance to be differentially expressed 474 475 in the concordant direction in both facultative and obligate species as compared to non-cleaners (Fig. 5B). These results suggest that the molecular underpinnings of cleaning behavior are shared, 476 477 at least in part, between obligate and facultative cleaners.

478 To ask whether co-expression patterns were similarly shared, we examined co-expression of the genes contained in the magenta "cleaning" module (which we had previously found to be 479 associated with facultative cleaning) and discovered that, compared to both facultative and non-480 cleaners, these genes were most highly connected with rest of the transcriptome in obligate 481 cleaners (Fig. 5C and D). Given that only obligate cleaners regularly and frequently display 482 483 cleaning as adults (the life stage at which we collected our samples off the reef), and given that any cleaning activity by facultative cleaners had ceased by the time they became adults (Baliga 484 485 and Law, 2016), we speculate that the molecular and physiological processes supported by these 486 genes might be more fully integrated with overall neural and behavioral activity in obligate cleaners. 487

Because increased dependency on cleaning behavior is linked to increased behavioral, cognitive, and morphological specialization in wrasses (Barbu et al., 2011; Gingins and Bshary, 2016; Baliga and Mehta, 2019), we asked whether a similar specialization will be evident in the neural transcriptome of the obligate cleaner species. We found no evidence for an increased specialization of cleaning-related gene expression. Though directionality of gene expression

differences (relative to non-cleaners) was generally concordant between facultative and obligate 493 cleaners (Fig. 5A and B), genes differentially expressed in facultative cleaners were not more 494 differentially expressed in the obligate cleaner (Supplementary Figure S6B). Alternatively, 495 because evolutionary transitions between juvenile and adult cleaners (obligate or facultative) are 496 phylogenetically correlated it has been hypothesized that adult cleaning evolved from a juvenile 497 498 cleaning state (Baliga and Law, 2016), perhaps by maintaining an early life history state via neoteny. However, testing the hypothesis that obligate cleaning reflects a heterochronic shift (i.e., 499 500 maintenance of an early life history stage in the obligate cleaner) requires gene expression 501 comparisons across developmental time points, which is beyond the scope of the present study.

502

#### 503 *Conclusions*

Overall, our analyses reveal a strong evolutionary signal in neuromolecular gene expression 504 505 across the six species of wrasse, suggest that mutualistic cleaning, broadly, is associated with an 506 increase in neural gene expression, and provides robust support for the hypothesis that independent evolution of facultative cleaning is associated with shared neurotranscriptomic mechanisms. 507 Further, we find that gene expression and co-expression patterns are conserved in an obligate 508 509 cleaner; however, the specialized cleaning behavior and correlated cognitive phenotypes cannot be explained by increased specialization in expression of genes evolutionarily associated with 510 511 cleaning behavior.

512

### 513 Materials and Methods

514 *Study species and their ecological and life history attributes* 

Six species of wrasses (Labridae) were selected for this study: Labroides dimidiatus (obligate 515 cleaner), Halichoeres melanurus (facultative cleaner), Thalassoma lunare (facultative cleaner), 516 517 Hemigymnus melapterus (non-cleaner), Labrichthys unilineatus (non-cleaner) and Coris batuensis (non-cleaner). Species were selected after Gingins and Bshary (2016) because they spread across 518 the Labridae phylogenetic tree and represent differences in cleaning activity (Fig. 1; obligate 519 520 cleaners, facultative cleaners, and non-cleaners), which in turn are not correlated with any other, potentially confounding, ecological, morphological, or life history attributes. In fact, detailed 521 522 comparisons of these and other wrasse species (Randall et al., 1988; Krattinger, 2016) have 523 demonstrated that the facultative and obligate cleaner species do not share any attributes that the other species in our study lack. Estimated divergence times were obtained from TimeTree (Hedges 524 et al., 2006; Kumar et al., 2017). Phylogeny was redrawn from Baliga and Law (2016). Briefly, 525 the newick formatted tree plotted using ggtree (Yu et al., 2017, 2018). Cleaner type assignments 526 527 were based on Baliga and Law (2016) Table A.7. Baliga and Law (2016) distinguish juvenile and 528 facultative cleaners. For our purposes we consider species that clean as juveniles or occasionally or opportunistically as adults both examples of facultative cleaning. We made one modification 529 from Baliga and Law (2016), H. melanurus is not listed as a facultative cleaner; however, 530 531 individuals of these species have been observed cleaning (reported in Gingins and Bshary, 2016). 532

## 533 Sample collection, tissue processing, RNA extraction, and 3'Tag sequencing

Samples were collected in August 2015 at Lizard Island Research Station, Great Barrier Reef, Australia. Employing hand and barrier nets ( $8 \times 2$  m; 1 cm mesh for large fish; and 2 m  $\times$  1 m, 5 mm mesh size for small fish) scuba divers collected fish in plastic zip bag with sufficient water. After each single capture, fish were handed to a researcher on the boat in order to process

the samples. Because these populations of the target species are female-biased and we did not want 538 to decrease statistical power by having sex as a co-factor, no males were included in the analysis. 539 540 The female fish were measured (Supplementary Table S5) and killed immediately on the boat by cervical transection and whole heads were transferred into 30 mL conical tubes with RNAlater 541 (ThermoFischer, Waltham, MA, USA) to preserve the integrity of the RNA as logistical obstacles 542 543 did not allow the use of dry ice or liquid nitrogen for flash-freezing the samples on the boat. The elapsed time between capture and death ranged from 6 to 28 minutes. After 3 hours (on average) 544 545 in RNAlater, the samples were transferred into O.C.T. Compound (Sakura, Torrance, CA, USA) and flash frozen in liquid nitrogen. At completion of sampling and preparations, all samples were 546 shipped on dry ice to The University of Texas at Austin for further processing. 547

We discovered that the short time the samples were stored in RNAlater caused the tissue 548 to become too fragile to reliably micro-dissect specific brain regions. Instead, frozen heads were 549 550 sectioned on a cryostat microtome into 300µm thick slices. The second most rostral slice of the 551 brain, containing pallial areas Dl and Dm (i.e., the putative teleost homologs of the mammalian hippocampus and basolateral amygdala, respectively (O'Connell and Hofmann, 2011), along with 552 partial portions of septal and striatal territories, was collected and stored in 200ul of ice-cold 553 554 homogenization buffer with 1-thioglycerol (Promega Corporation, Madison, WI, USA) and stored at -80C until further processing. Total RNA was extracted from each sample using Maxwell 555 556 16LEV simplyRNA tissue kit (Promega Corporation, Madison, WI, USA) following manufacturer 557 instructions, including DNase treatment. RNA samples were then eluted into 40uL of nuclease-558 free water. RNA integrity was confirmed using an Agilent BioAnalyzer and sequencing libraries 559 constructed using 3'tag sequencing approach (Lohman et al., 2016) for sequencing on an Illumina 560 HiSeq 2000 instrument (Illumina, San Diego, CA, USA). RNA quality control, library

561 construction, and sequencing were performed by the University of Texas at Austin Genome562 Sequencing and Analysis Facility.

563

# 564 *Read preprocessing and alignment and gene expression quantification*

3'tagseq raw reads were preprocessed prior to alignment using the following pipeline. Briefly, 565 566 custom perl scripts (after Meyer et al., 2011) using the FASTX-toolkit (Hannon, 2010) and CUTADAPT v. 2.8 (Martin, 2011) were used to remove reads with a homo-polymer run of "A"≥8 567 568 bases, retain reads with minimum 20 bases, removal PCR duplicates – defined as sequences 569 sharing the same degenerate header and 20 bases of sequence – and filtered for quality (Phred quality score > 20 for 90% of the nucleotides). Although a L. dimidiatus genome was recently 570 published (Kang et al., 2023), it would not be appropriate to use as a reference for read alignment 571 here due to the highly variable evolutionary distances (0 to  $\sim 37$  million years, according to 572 http://timetree.org/) of the remaining five species in our analysis relative to L. dimidiatus, which 573 574 could distort any quantification of gene expression across species. Instead, we first aligned preprocessed reads using the Burrows-Wheeler Aligner (bwa-mem; Li and Durbin, 2009) to a de 575 novo assembled brain transcriptome of the ocellated wrasse, Symphodus ocellatus (Nugent et al., 576 577 2016), which is ~58 million years diverged from the species in our analysis (according to http://timetree.org/). While mapping percentages averaged 19.4%, few reads mapped to contigs 578 579 annotated with known gene ids (average gene mapping percentage, 1.3%), precluding downstream 580 interpretation of any results. We therefore mapped reads to the more distant (~115 million years, according to http://timetree.org/) but much better annotated Oreochromis niloticus genome 581 582 (Orenil1.0 Ensembl cdna). As expected, mapping percentages were relatively low, yet very 583 consistent (4.7% to 5.2%). All downstream analyses were thus carried out using gene counts from

O. niloticus read mapping. Reads mapped to the O. niloticus were converted to counts using 584 samtools (idxstats; Li et al., 2009) and TMM normalized (Robinson and Oshlack, 2010) using R 585 586 package NOISeq (Tarazona et al., 2011). TMM normalized expression values were used for all downstream analyses. We filtered the gene set such that that each gene was expressed in at least 587 one individual of each species, which yielded a set of 10,411 genes. We also applied a more 588 589 stringent filter, such that only genes expressed in at least 4 individuals of each species were kept, which yielded a set of 3,686 genes. Because the variance structure of both gene sets was very 590 591 similar (not shown), we used the more inclusive gene set for all downstream analyses.

592

# 593 *Neural transcriptomic variation across species*

To summarize overall variation in neural gene expression across species, we use 594 Discriminant Analysis of Principal Components (DAPC, using the R package *adegenet*: Jombart, 595 596 2008; Jombart and Ahmed, 2011; after Kenkel and Matz, 2016). DAPC combines unsupervised 597 (PCA) and supervised (DA) machine learning to classify samples. In DAPC, we first perform a principal components analysis to summarize the major axes of variation in the neural transcriptome 598 across all samples. We then perform a discriminant analysis with the goal of discriminating among 599 600 the six species blind to cleaner type. Thus, the DA minimizes variation within each species and maximized variation among species. We determined the number of PCs to retain using *a*-score 601 602 optimization, which measures the trade-off between power of discrimination and over-fitting. The 603 optimal a-score was achieved by retaining 3 PCs. Significance in overlap of DAPC loadings and differentially expressed genes between facultative and non-cleaners was determined by a 604 605 hypergeometric test using the R function (phyper).

606

607 *Phylogenetic comparative analysis of expression divergence (EVE model)* 

The Expression Variance and Evolution (EVE) model was used to characterize 608 609 evolutionary divergence in expression of each gene (Rohlfs and Nielsen, 2015). The EVE model, parameterizes the ratio of intra- and interspecific variation of each gene across the phylogeny. 610 Under stabilizing selection, this ratio ( $\beta_i$ ) for any specific gene should be equivalent to the mean 611 612  $\beta_{\text{shared}}$  for all the genes across the transcriptome.  $\beta_i > \beta_{\text{shared}}$  indicates high relative intraspecific variation associated with plasticity or diversifying selection within species.  $\beta_i < \beta_{shared}$  indicates 613 614 high divergence in expression across species associated with lineage-specific directional selection. Gene-specific  $\beta$  values were converted to "expression divergence scores" using a  $-\log_{10}$ 615 transformation. TMM-normalized counts of each gene shared across all six species and the 616 phylogeny of the six wrasse species included in our study were used as input data for the EVE 617 model. Gene-specific  $\beta_i$  and transcriptome  $\beta_{shared}$  were calculated for all six species and for the five 618 619 non-cleaner and facultative cleaner species. To assess the effect of the obligate cleaner L. 620 *dimidiatus* on gene divergence scores, we performed an EVE analysis on both all six species and on the five non-cleaner and facultative cleaner species. Spearman's rank correlation of gene-621 specific  $\beta_i$  values calculated with and without the obligate cleaner demonstrated that the results 622 623 were highly concordant (Supplementary Figure S7; Spearman's  $\rho = 0.87$ , p < 2.2e-16).

To assess the efficacy of the EVE model to target genes exhibiting different patterns of variation and diversification across species, we examined expression co-variance patterns among individuals and species for different subsets of genes including all genes and the genes with the top and bottom 1% expression divergence scores (Supplementary Figure S8A). Not surprisingly, the genes with highest (top 1%)  $-\log_{10}\beta_i$  values (i.e., genes whose expression is both variable and highly divergent between species) resulted in a robust hierarchical clustering of individuals by species (Supplementary Figure S8B). Conversely, when we selected the genes with the lowest (bottom 1%) -log<sub>10</sub> $\beta_i$  values (i.e., genes whose expression is variable but not divergent between species), hierarchical clustering did not reveal any robust patterns either by species or any other attribute (Supplementary Figure S8C). We calculated Pearson's correlations in gene expression between all pairwise individuals. Individuals were clustered using 1-correlation and correlations were plotted in a heatmap using R package pheatmap (Kolde, 2012). Cluster support values were generated by using R package pvclust (1000 permuations; Suzuki and Shimodaira, 2006).

637

### 638 Differential expression analysis of cleaner types and species

Gene exhibiting differences in expression across cleaner types and species were identified 639 using the R package *limma* (linear models for microarray data: Smyth, 2005). We used several 640 different *limma* analyses. The broad cleaner (i.e., both obligate and facultative cleaner species) 641 versus non-cleaner comparisons were modeled as (obligate + facultative)/2 – non-cleaner while 642 643 blocking the random effect of species. For the facultative cleaner versus non-cleaner, obligate cleaner versus non-cleaner, and obligate versus facultative cleaner comparisons, we compared 644 cleaner types while blocking the random effect of species. For species-level comparisons, we 645 646 calculated the number of DEGs for each pairwise combination of species. To test the hypothesis that facultative species are more similar in gene expression than is expected by chance, we 647 648 compared the number of DEGs between the two facultative species to the distribution of 649 differentially expressed gene of all the remaining species pair combinations using *ecdf* in R as above. For all analyses, differential expression was defined by an FDR adjusted p-value < 0.05650 651 unless otherwise indicated. We used TMM-normalized counts of the 10,411 genes as the input 652 data set for all limma contrasts.

653

# 654 Phylogenetic Comparative Analysis of Gene Co-expression

655 To capture genes with correlated expression variation across individuals, species, and cleaner types, we performed a Weighted Gene Co-expression Network Analysis (WGCNA) 656 (Langfelder and Horvath, 2008) including the genes shared across all species. WGCNA clusters 657 658 genes by expression similarity and summarizes gene co-expression as module eigengenes (i.e., the 659 first principal component of all the genes in each co-expression module). Each eigengene is the 660 linear combination of gene expression values that explains the most variation in the expression of 661 the genes contained in the module. For all analyses, WGCNA was performed with a minimum modules size of 50 and soft power thresholds were determined using WGCNA's softPower 662 function. 663

To identify modules associated with facultative cleaning, we performed WGCNA 664 including the two facultative cleaner species and the three non-cleaner species (Fig. 1). We 665 666 assessed changes in gene co-expression across species and cleaner types using a Welch's t-test (due to unequal variances) or ANOVA depending on whether two or more groups were compared. 667 For pairwise comparisons (e.g., among species) we used Tukey's honest signal difference post hoc 668 669 test for ANOVAs with F-statistics with significance at p < 0.05. For cleaner type comparison 670 between facultative and non-cleaner species, we confirmed associations between cleaner type and 671 module eigengene taking phylogenetic non-independence into account using a phylogenetic 672 ANOVA. Phylogenetic ANOVA was performed with the R package phytools (Revell, 2012). A phylogenetic ANOVA could not confirm whether any modules associate with obligate cleaning 673 674 due to the inclusion of only one representative obligate cleaner species (L. dimidiatus). To 675 determine the probability of identifying WGCNA modules associated with any subset of species

676 (e.g., facultative cleaners) by random chance we used a permutation approach. Specifically, to 677 maintain phylogenetic structure but disrupt gene co-expression, TMM normalized gene counts 678 were sampled without replacement within each species. For each sampling iteration (n = 1000) we 679 performed WGCNA. The resultant modules were tested for difference among species and cleaner 680 types using an ANOVA or Welch's t-test and phylogenetic ANOVA (as above). Significance of 681 modules of interest was determined by comparing *p*-values from the observed WCGNA to the 682 distribution of *p*-values generated in the permutation analysis.

To identify candidate (hub) genes of interest we quantified intramodular connectivity (kWithin: the connectivity of each gene with all other genes in a focal module) of all genes from modules of interest – i.e., significantly associated with cleaner type after accounting for phylogenetic non-independence – using WGCNA's *intramodularConnectivity* function.

687

## 688 *Candidate genes and gene functions robustly associated with facultative cleaners*

689 Genes robustly associated with facultative cleaners across analyses were identified as those 690 differentially expressed between facultative and non-cleaner types (adjusted p-value < 0.05) and 691 contained in modules of interest (i.e., significantly associated with cleaner type after accounting 692 for phylogenetic non-independence). Using the primary literature, we highlight known, relevant 693 functional associations of each candidate gene (Supplementary Table S4)

694

695 Concordance of gene expression and co-expression across facultative and obligate cleaner species
 696 To determine whether gene expression patterns in the obligate cleaner species (L.
 697 dimidiatus) are concordant with patterns associated with facultative cleaning, we compared
 698 differential gene expression between facultative cleaners and non-cleaners with differential

expression in the obligate cleaner and non-cleaners. Significance in overlap of all sets wasdetermined using a hypergeometric test using the R function (*phyper*).

701 To ask whether gene connectivity persist across cleaner types, we performed WGCNA analysis including only species from each cleaner type (i.e., the obligate cleaner L. dimidiatus, the 702 facultative cleaners T. lunare and H. melanurus only, or the non-cleaners H. melapterus, L. 703 704 unilineatus, and C. batuensis). We compared gene connectivity (kTotal) of genes from focal 705 modules (Fig. 3C and D) in WGCNA performed on non-cleaners, facultative cleaners, and the 706 obligate cleaner alone. kTotal was calculated using WGCNA's intramodularConnectivity function 707 and measures connectivity of each gene with all other genes in the transcriptome. We asked whether gene connectivity of each module different among cleaner types using ANOVA followed 708 709 by estimated marginal mean and Cohen's D effect size post hoc pairwise comparisons between 710 cleaner types (Fig. 5D; Supplementary Figure S5; Supplementary Table S7) using the R packages emmeans (Lenth, 2022) and rstatix (Kassambara, 2020), respectively. Spearman's rank correlation 711 712 was used to determine similar of gene connectivity between all pairwise cleaner types for genes in each focal module (Fig. 3C and D) independently. Spearman's rank correlations were performed 713 using the rcorr function from R package Hmisc (Harrell, 2020) and p-values were adjusted for 714 715 multiple hypothesis testing using R stats function p.adjust and the Benjamini-Hochberg method.

716

## 717 *No evidence of expression specialization in the obligate cleaner species*

To test the hypothesis that obligate cleaning is a specialization of facultative cleaning, we compared differential gene expression between facultative cleaners and non-cleaners with differential expression in the obligate cleaner and facultative cleaners. We asked whether the 342 DEGs between facultative cleaner and non-cleaner species, the 44 DEGs shared and directionally 722 concordant in facultative and obligate cleaners versus non-cleaners, and differentially expressed 723 magenta module genes exhibited additional specialization in expression (i.e., were more 724 differentially expressed) in obligate versus facultative cleaners using a Spearman's Rank 725 correlation.

726

### 727 Availability of Data and Materials

All sequence data in this publication will be deposited in the National Center for Biotechnology Information Gene Expression Omnibus. All metadata and scripts used to analyze data and generate figures will be publicly available on the Texas Data Repository at the time of publication and upon request prior to publication by an editor or reviewer.

732

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1018 Supplementary Tables and Figures

1019 All supplementary tables are provided in Youngetal\_SupplementaryTables.xlsx

1020

1021 Supplementary Table S1. Number of genes and read mapping percentages by species and
1022 evolutionary distance and number of comparable genes across species.

1023

1024 **Supplementary Table S2**. Variation in module eigengene expression between facultative cleaners 1025 and non-cleaners. Welch's t-statistics, phylogenetic ANOVA F-statistics, and *p*-values for all 1026 modules a provided. Modules are identified by color and size indicates the number of genes in 1027 each module. Significance at p < 0.05 after accounting for phylogenetic independence is indicated 1028 in bold.

1029

1030 **Supplementary Table S3**. Variation in module eigengene expression across species. ANOVA F-1031 statistics and *p*-values are provided for all modules and Tukey's honest signal difference post hoc 1032 pairwise species q-statistics and *p*-values are provided for significant pairwise comparisons from 1033 modules with an ANOVA *p*-value < 0.05. Modules are identified by color and size indicates the 1034 number of genes in each module. Significance at p < 0.05 is indicated in bold.

1035

Supplementary Table S4. Candidate genes associated with independent transitions to facultative cleaning. ENSEMBL IDs, Gene IDs, functional annotations from GeneCards (Safran et al., 2022) and PubMed, log<sub>2</sub> fold difference and associated adjusted p-value between facultative cleaners and non-cleaner, magenta module intramodular connectivity, and EVE model negative log<sub>10</sub> beta values are provided for each gene.

1041

Supplementary Table S5. Behavioral, ecological, life history, and morphological attributes of the
six focal species included in this analysis. Lengths were measures from individuals sampled as
part of this study. All other attributes were obtained from previous studies (Randall et al., 1988;
Gingins and Bshary, 2016; Krattinger, 2016).

1046

**Supplementary Table S7**. Results of an analysis of variance (ANOVA) comparing focal module gene connectivity across cleaner types, estimated marginal mean and Cohen's D effect size *post hoc* pairwise comparisons of connectivity (kTotal) between cleaner types, and correlation of gene connectivity between cleaner types. Genes from all nine focal modules differed significantly across cleaner types (indicated with an asterisks); however, modules differed in the directionality and effect size of overall connectivity differences (*t* ratio and Cohen's D; Supplementary Fig. S4) as well as correlation of gene connectivity scores (Spearman's rho).



**Supplementary Figure S1**. Seven gene co-expression modules differed across species (A). The number of gene contain in each module is indicated by module size (A). Dashed lines indicated statistical support for the ANOVA at p < 0.1 (black) and p < 0.05 (red) (A). Species-level co-expression comparisons illustrate differences in module eigengene expression across species. Species are colored by cleaner type (non-cleaner and facultative species, grey and gold, respectively). The magenta module is plotted in Figure 3B (B). Significance between pairwise comparisons is provided in Supplementary Table S5.



Supplementary Figure S2. Differential gene expression between obligate and non-cleaner
species (A) and obligate and facultative cleaner species (B).



# Cluster dendrogram with p-values (%)

Distance: correlation Cluster method: average

**Supplementary Figure S3**. Approximately unbiased p-values (red) and bootstrap probabilities (green) for sample clustering by facultative cleaning candidate gene expression Fig. 4B. Height indicates 1-correlation. While facultative cleaners *Halichoeres melanurus* (MEL) and *Thalassoma lunare* (LYR) cluster together, non-cleaners *Hemigymnus melapterus* (BLA), *Coris batuensis* (CHO), and *Labrichthys unilineatus* (TUB) cluster by species affiliation.

1060



**Supplementary Figure S4**. Relationship between evolutionary divergence in expression across all species (EVE;  $-\log_{10}B$ ) and differential expression between facultative cleaners and non-cleaners (*limma*;  $-\log_{10}$  adjusted p-value). Genes with high evolutionary divergence in expression across species were more likely to be differentially expressed between facultative and non-cleaner species (Spearman's  $\rho = 0.48$ , p < 2.2e-16). The novel candidate genes identified in the magenta module (Fig. 4) are shown in red.



Supplementary Figure S5. Differences in gene connectivity across cleaner types. Gene connectivity (kTotal) was obtained from WGCNA on each cleaner type independently.
Connectivity was compared for genes in each of our nine focal modules (Figure 3). We found that gene from two focal modules (magenta and brown) exhibited highest connectivity in the obligate cleaner and lowest connectivity in the non-cleaner species (Figure 5C; Supplementary Table S7).

- 1070 Further, gene connectivity was correlated in all pairwise comparisons of cleaner types (Figure 5D;
- 1071 Supplementary Table S7). Means and standard deviations are shown as dots and whiskers within
- 1072 each violin plot. Modules are arranged in order of size (i.e., number of genes) with magenta being
- the smallest module and turquoise the largest (Figure 3).
- 1074



1076 O facultative vs. non-cleaner DEG • shared, directionally concordant DEG facultative vs. non-cleaner & obligate vs. non-cleaner • magenta module gene

Supplementary Figure S6. Patterns of expression differences and variation between obligate (L. 1077 dimidiatus) and facultative cleaners (H. melanurus and T. lunare) with the non-cleaner species 1078 1079 indicate significant correlations in expression of facultative cleaning related, differentially expressed genes (grey: Spearman's  $\rho = 0.50$ , p < 2.2e-16; blue: Spearman's  $\rho = 0.93$ , p < 2.2e-16), 1080 but not magenta module genes (magenta: Spearman's  $\rho = 0.24$ , p = 0.12) (A). Expression 1081 differences (B) between obligate (L. dimidiatus) and facultative cleaners (H. melanurus and T. 1082 1083 *lunare*) does not support the hypotheses that obligate cleaning is a specialization of facultative 1084 cleaning (B). We found a negative correlation between gene expression differences in facultative and non-cleaner species versus obligate and facultative species for all differentially expressed 1085 genes (B, grey: Spearman's  $\rho = -0.77$ , p <2.2e-16), genes differentially expressed in both 1086 1087 facultative cleaners and the obligate cleaner as compared to the non-cleaner species (B, blue: Spearman's  $\rho = 0.11$ , p = 0.48), and genes differentially expressed and contained in the facultative 1088 cleaner-associated magenta module (B, magenta: Spearman's  $\rho = -0.3$ , p = 0.14). 342 DEGs 1089 1090 between facultative and non-cleaner species are shown in grey, 44 DEGs shared and directionally

1091 concordant in obligate vs. non-cleaners are blue, 81 magenta module genes are magenta, and1092 shading indicates standard error.



Supplementary Figure S7. EVE analysis on all six species and on the five non-cleaner and facultative cleaner species were highly concordant. Spearman's rank correlation of gene-specific  $\beta_i$  values calculated with and without the obligate cleaner are significantly positively correlated (Spearmans  $\rho = 0.87$ , p < 2.2e-16).



1095 Supplementary Figure S8. Sample clustering with all genes (A), the 105 genes with the lowest 1096 interspecific divergence (highest 1% beta values) (B), and the 105 genes with the highest 1097 interspecific divergence (lowest 1% beta values) (C). Clustering individual samples using genes 1098 identified as having low evolutionary divergence relative to other gene in the transcriptome 1099 results in loss of clustering by species affiliation (B). Clustering of samples by genes identified as having high evolutionary divergence relative to other genes in the transcriptome group by 1100 species and additionally group the facultative cleaning species (C). Correlation matrix of all 1101 samples is generated using Spearman's rank correlation. Correlation strength is indicated by 1102 1103 intensity of color. Colored bars indicate species and cleaner type affiliations.