## RESEARCH

# Stage- and sex-specific transcriptome analyses reveal distinctive sensory gene expression patterns in a butterfly

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## Abstract

**Background:** Animal behavior is largely driven by the information that animals are able to extract and process from their environment. However, the function and organization of sensory systems often change throughout ontogeny, particularly in animals that undergo indirect development. As an initial step toward investigating these ontogenetic changes at the molecular level, we characterized the sensory gene repertoire and examined the expression profiles of genes linked to vision and chemosensation in two life stages of an insect that goes through metamorphosis, the butterfly *Bicyclus anynana*.

**Results:** Using RNA-seq, we compared gene expression in the heads of late fifth instar larvae and newly eclosed adults that were reared under identical conditions. Over 50 % of all expressed genes were differentially expressed between the two developmental stages, with 4,036 genes upregulated in larval heads and 4,348 genes upregulated in adult heads. In larvae, upregulated vision-related genes were biased toward those involved with eye development, while phototransduction genes dominated the vision genes that were upregulated in adults. Moreover, the majority of the chemosensory genes we identified in the *B. anynana* genome were differentially expressed between larvae and adults, several of which share homology with genes linked to pheromone detection, host plant recognition, and foraging in other species of Lepidoptera.

**Conclusions:** These results revealed promising candidates for furthering our understanding of sensory processing and behavior in the disparate developmental stages of butterflies and other animals that undergo metamorphosis.

Keywords: Vision, Phototransduction, Chemoreception, Lepidoptera, Caterpillar, Wing patterning

## Background

The environment is teeming with information, and the ability to perceive and process this information is critical in shaping the behavior of all animals. Of the various sensory modalities, vision and chemoreception play integral roles in survival and reproduction, including the detection of food sources [1], predator avoidance [2], and locating potential mates [3]. Moreover, both senses are known to drive

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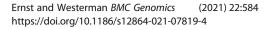
assortative mating and speciation processes. Visual cues, such as ornaments [4], coloration [5], and courtship displays [6], influence mate choice behaviors and sexual selection in a diverse range of species. Similarly, chemical signals, such as pheromones and cuticular hydrocarbons, have been found to be involved with prezygotic isolation in a wide variety of taxa, ranging from insects [7–9] and annelids [10] to mammals [11–13].

Despite the significant roles that visual and chemical cues play in animal behavior and sexual selection, considerable morphological differences often exist for the sensory structures that detect these cues throughout

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ontogeny. This is particularly apparent in animals that undergo metamorphosis from larva to adult life stages, such as holometabolous insects [14], crustaceans [15], and many fishes [16]. For instance, in butterflies, the visual organs of the larval stage typically consist of up to six stemmata per eye, each with a lens and seven photoreceptors that form a tiered rhabdom [17], compared to the much more complex adult compound eyes, which consist of hundreds of tightly packed ommatidia, each containing a facet lens and rhabdom composed of nine photoreceptors [18]. These differences are likely in part due to the different ecological niches that each stage fills; larvae typically reside and forage on host plants until pupation, while adults adopt an aerial lifestyle and are mainly focused on finding a mate and reproducing [14].

Although differences in sensory organ morphology and the behavior of animals that undergo metamorphosis are often readily apparent throughout ontogeny, we still have much to learn about the functional and organizational differences in the sensory systems of preand post-metamorphosis life stages, especially at the molecular level. Perhaps one of the most promising taxa in which to dissect these differences is the exceptionally diverse Insecta, which is estimated to consist of 5.5 million species [19]. Indeed, much of what we know about the molecular mechanisms underlying vision and chemosensation has been derived from work on insects, including the common fruit fly, *Drosophila melanogaster* (see [20] and [21] for review).

Phototransduction in insects is accomplished in the eye through absorption of light by a visual pigment (rhodopsin), which triggers an enzymatic cascade that ultimately leads to depolarization of photoreceptor cells [20]. The perception of different wavelengths of light is dependent upon opsin structure, with peak sensitivities spanning the visible light spectrum and beyond [22]. By contrast, chemosensation in insects occurs at the olfactory sensilla (the sensory structures involved with smell) typically found on head structures, such as the maxillary palps and antennae, and the gustatory sensilla (the sensory structures involved with taste), which are found throughout the insect body, including on the mouthparts, wings, and legs [23, 24]. Odorants are bound by odorant binding proteins (OBPs) or chemosensory proteins (CSPs) and transported through the sensillar lymph to membrane-bound receptors located on the dendrites of olfactory sensory neurons (OSNs) or gustatory sensory neurons (GSNs) [25, 26].

There are three main types of chemoreceptors on chemosensory neurons that are involved with the detection of chemical stimuli from the external environment in insects: odorant receptors (ORs), gustatory receptors (GRs), and ionotropic receptors (IRs). ORs are the foundation of olfaction and are known to selectively detect a diversity of volatile compounds [27-29]. In combination with a co-receptor (*Orco*) and sensory neuron membrane proteins (SNMPs), some ORs have also been found to be involved with the detection of sex pheromones [30, 31]. Insect GRs belong to the same superfamily as ORs [32] but are primarily involved with tasting bitter compounds [33–35], sugars [36–38], and CO<sub>2</sub> [39, 40]. Finally, IRs, which are primitive chemoreceptor proteins that evolved from ionotropic glutamate receptors (iGluRs), are known to be involved with both olfaction and gustation, primarily sensing amines, acids, salt, and pheromones [24, 41–43].

Recent work in adult Lepidoptera has focused on elucidating the underpinnings of phototransduction [44] and chemoreception [24, 31, 45, 46], providing a foundation for investigating how sensory systems vary throughout development in an insect order known for its metamorphosis. The squinting bush brown butterfly, Bicyclus anynana, is an ideal model to address this issue, as it has rapidly become a fruitful model system for studying development, evolution, and phenotypic plasticity [47-50]. Of particular interest, these butterflies rely heavily on visual and chemical cues for mate choice; mates are selected based on the quality of ultravioletreflective eyespot pupils and male-specific pheromones [4, 51, 52]. In addition, previous work has identified differences in the visual systems of male and female adults of different seasonal phenotypes, including differences in eye size, facet lens area, facet number per eye, and opsin and eye development gene expression [53, 54]. Importantly, numerous molecular resources are available for this species, including expressed sequence tags [55], transcriptomes [54], and a reference genome assembly [56], making *B. anynana* amenable to genetic and genomic studies.

Here, we characterized the sensory gene repertoire in B. anynana, comprising genes known to be linked to vision and chemosensation. Specifically, we first identified vision genes in the B. anynana genome involved with phototransduction, eye pigmentation, and eye development, as well as six distinct families of chemosensory genes, consisting of OBPs, CSPs, ORs, IRs, GRs, and SNMPs. We also identified developmental genes that have possibly been co-opted to function as sensory or neural processing genes, such as those known to be involved with wing patterning in B. anynana and other butterflies, which are hypothesized to potentially drive speciation and assortative mating by linking wing pattern traits to preference for those traits [57-59]. We then compared the expression patterns of these sensory and developmental genes in the heads of two life stages: late fifth instar larvae and newly eclosed adult butterflies (Fig. 1).



We predicted that genes directly involved with visual processes (e.g., phototransduction) would be upregulated in the adult phenotype, given the much greater level of complexity of adult compound eyes compared to the relative simplicity of larval stemmata. In addition, we hypothesized that larvae might not express the ultravioletsensitive opsin that is critical to evespot quality evaluation during mate choice in adults. For chemosensory genes, we predicted that genes involved with pheromone and fruit detection would be upregulated in adults, as this stage participates in numerous reproductive behaviors and must locate a food source (i.e., ripe or rotting fruit) separate from the host plant. By contrast, we hypothesized that chemosensory genes linked to host plant recognition and foraging behavior would be upregulated in larvae, given that feeding is the dominant behavior during this stage of development. Furthermore, if genes associated with wing patterning in butterflies are also important for behavioral aspects of assortative mating, we predicted that they would be upregulated in the brains of adults. Finally, we aimed to identify candidate visual and chemosensory genes in the adult and larval phenotypes for future investigation into the sensory ecology of these disparate life stages.

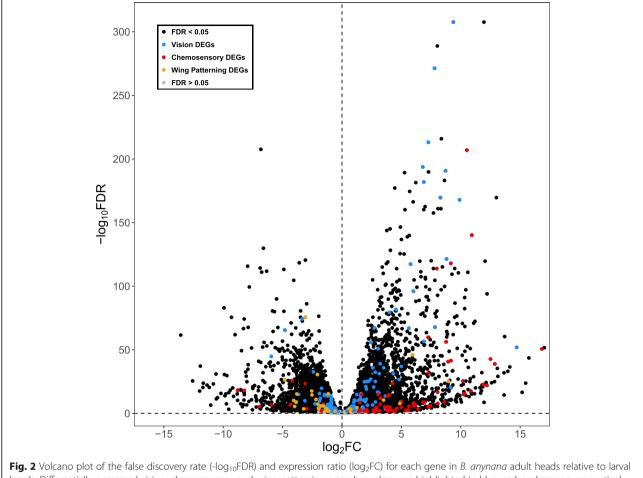
## Results

Sequencing generated over 387 million high quality single-end (SE) reads (Additional file 1: Table S1). Adapter trimming removed 87,301 reads (0.02% of the raw sequenced reads) prior to downstream analysis. Approximately 340 million (88%) of the remaining trimmed reads mapped to the *B. anynana* genome (v1.2; [56]; http://ensembl.lepbase.org/index. html). Of the 22,642 predicted protein-coding genes in the reference genome, 15,735 (70%) were overlapped by at least 10 reads across all libraries and used as the expression set for downstream analyses.

This gene set corresponded to approximately  $12.2 \pm 2.3$  SD million reads per sample that were used for differential expression analysis (Table S1). Principal components analysis revealed that developmental stage explained 75% of the variation observed (Additional file 1: Fig. S1). Blast2GO analysis resulted in the functional annotation of 13,498 (60%) genes in the *B. anynana* genome, with a total of 40,857 gene ontology (GO) terms assigned to genes in the assembly.

#### Adult vs. larval heads

A total of 8,384 (53% of genes in the expression set) genes were differentially expressed between larva and adult stage heads, with 4,348 upregulated in adult heads and 4,036 upregulated in larva heads (FDR < 0.05; Fig. 2; Additional file 2: Table S2). GO enrichment analyses of these upregulated genes found that 255 GO terms were enriched in the heads of adults (Additional file 2: Table S3). When reduced to the most specific terms (i.e., parent functions with a significant child GO term were removed to reduce redundancy), 63 enriched GO terms remained, with the top three terms being oxidationreduction process (FDR =  $1.53 \times 10^{-18}$ ), proton transmembrane transporter activity (FDR =  $4.12 \times 10^{-10}$ ), and potassium ion transmembrane transport (FDR =  $1.26 \times$ 10<sup>-9</sup>) (Table 1; see Additional file 2: Table S4 and Additional file 1: Figs. S2-S4 for full results). By contrast, 212 GO terms were enriched in the heads of larvae (Additional file 2: Table S5). A total of 49 GO terms remained after reduction, with the top three terms being nucleolus (FDR =  $4.15 \times 10^{-11}$ ), mRNA splicing, via spliceosome (FDR =  $4.26 \times 10^{-11}$ ), and protein folding  $(FDR = 1.17 \times 10^{-10})$  (Table 2; see Additional file 2: Table S6 and Additional file 1: Figs. S5-S7 for full results).



heads. Differentially expressed vision, chemosensory, and wing patterning gene homologs are highlighted in blue, red, and orange, respectively. Positive  $log_2FC$  values indicate higher expression in adults, while negative  $log_2FC$  values indicate higher expression in larvae. DEGs = Differentially Expressed Genes. This plot was created with ggplot2 v3.3.2 [60] in R v3.6.2 [61]

Table 1 Top 10 most specific GO terms enriched in adult heads. GO = Gene Ontology, BP = Biological Process, MF = Molecular
Function, FDR = False Discovery Rate

GO ID	GO Name	GO Category	FDR
GO:0055114	oxidation-reduction process	BP	1.53 × 10 <sup>-18</sup>
GO:0015078	proton transmembrane transporter activity	MF	$4.12 \times 10^{-10}$
GO:0071805	potassium ion transmembrane transport	BP	$1.26 \times 10^{-9}$
GO:0005506	iron ion binding	MF	$1.26 \times 10^{-9}$
GO:0020037	heme binding	MF	$4.01 \times 10^{-9}$
GO:0005549	odorant binding	MF	$5.83 \times 10^{-8}$
GO:0016705	oxidoreductase activity, acting on paired donors, with incorporation or reduction of molecular oxygen	MF	$1.54 \times 10^{-7}$
GO:0042302	structural constituent of cuticle	MF	$5.50 \times 10^{-7}$
GO:0004930	G protein-coupled receptor activity	MF	$5.65 \times 10^{-7}$
GO:0005249	voltage-gated potassium channel activity	MF	$5.05 \times 10^{-6}$

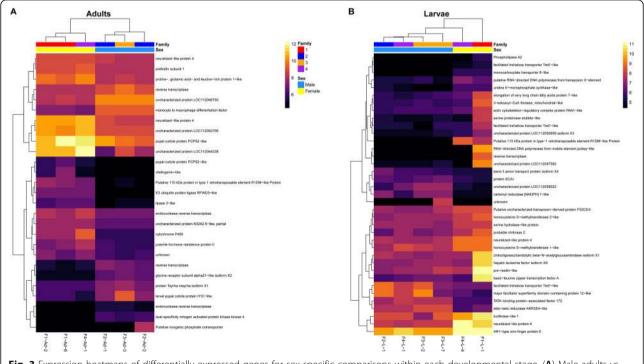
GO ID	GO Name	GO Category	FDR
GO:0005730	nucleolus	CC	$4.15 \times 10^{-11}$
GO:0000398	mRNA splicing, via spliceosome	BP	$4.26 \times 10^{-11}$
GO:0006457	protein folding	BP	$1.17 \times 10^{-10}$
GO:0003735	structural constituent of ribosome	MF	$1.17 \times 10^{-10}$
GO:0005840	ribosome	CC	$2.23 \times 10^{-9}$
GO:0006364	rRNA processing	BP	$6.27 \times 10^{-9}$
GO:0007275	multicellular organism development	BP	$3.24 \times 10^{-8}$
GO:0003743	translation initiation factor activity	MF	$5.98 \times 10^{-8}$
GO:0005681	spliceosomal complex	CC	$1.57 \times 10^{-7}$
GO:0051082	unfolded protein binding	MF	$4.09 \times 10^{-7}$

**Table 2** Top 10 most specific GO terms enriched in larval heads. GO = Gene Ontology, BP = Biological Process, MF = Molecular Function, CC = Cellular Component, FDR = False Discovery Rate

## Sex-specific differences within each stage

A comparison between male and female adult heads revealed 27 differentially expressed genes, 10 of which were upregulated in male adults, while 17 were upregulated in female adults (FDR < 0.05; Fig. 3A; Additional file 2: Table S7). By contrast, 37 genes were differentially expressed between male and female larval heads, with nine upregulated in male larvae and 28 upregulated in female larvae (FDR < 0.05; Fig. 3B; Additional file 2: Table S8). GO enrichment analyses found no

significantly enriched GO terms for the adult or larva differentially expressed gene sets. Furthermore, none of the vision, chemosensory, or wing patterning/development genes identified in the reference genome (see below) were differentially expressed between the sexes of larvae or adults. There were three genes in common between the two stage-specific differentially expressed gene sets, including Putative 115 kDa protein in type-1 retrotransposable element R1DM-like protein (*BANY.1.2.g05985*) and two copies of neuralized-like



**Fig. 3** Expression heatmaps of differentially expressed genes for sex-specific comparisons within each developmental stage. (**A**) Male adults vs. female adults. (**B**) Male larvae vs. female larvae. Counts were normalized by variance stabilizing transformation, with warmer colors indicating higher expression. Rows denote individual genes, and columns denote samples, both of which are clustered by gene expression. Family indicates the family from which the sample was derived, and Sex indicates the sex of the sample. Heatmaps were created with pheatmap v1.0.12 [62] in R v3.6.2 [61]

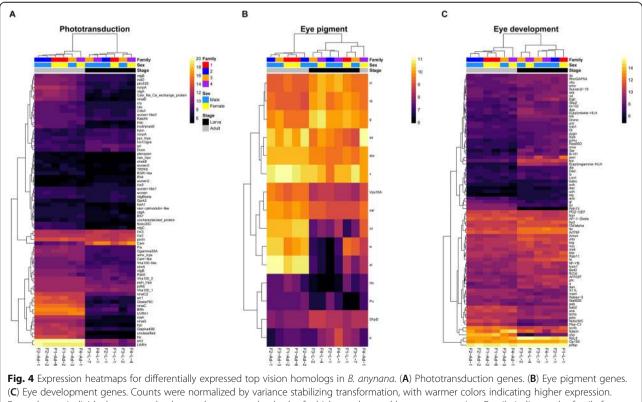
protein 4 (*BANY.1.2.g11289* and *BANY.1.2.g11290*), all of which were upregulated in female larvae and adults.

#### Vision genes

Blast hits for 252 of the 274 queried vision genes (92%) resulted in the identification of 1,555 putative homologs in the B. anynana genome (Additional file 2: Table S9). Of these homologs, 429 were associated with phototransduction, 76 with eye pigment, and 1,050 with eye development. To identify the top homolog candidates for each of the queried vision genes, we collected the best blast hit, resulting in a set of 252 B. anynana vision genes, 250 of which were within the head expression set (Additional file 2: Table S10). Of these top homologs, 165 (65%) were differentially expressed between larval and adult heads (FDR < 0.05), with 88 (57 phototransduction genes, 10 eye pigment genes, and 21 eye development genes) upregulated in adults and 77 (13 phototransduction genes, 5 eye pigment genes, and 59 eye development genes) upregulated in larvae (Figs. 2 and 4). Only genes associated with phototransduction were significantly enriched in the full differentially expressed gene set (phototransduction,  $FDR = 1.12 \times$  $10^{-5}$ ; eye pigment, FDR = 0.13; eye development, FDR = 0.26). Out of the 252 identified vision gene homologs, only five phototransduction genes showed evidence of sex-/stage-specific expression, with the expression of *nan\_trpv* being absent in male larvae and *Cib2*, *pteropsin*, *santa\_maria*, and *unclassified* not showing expression in female larvae (Fig. 5; Additional file 2: Table S11).

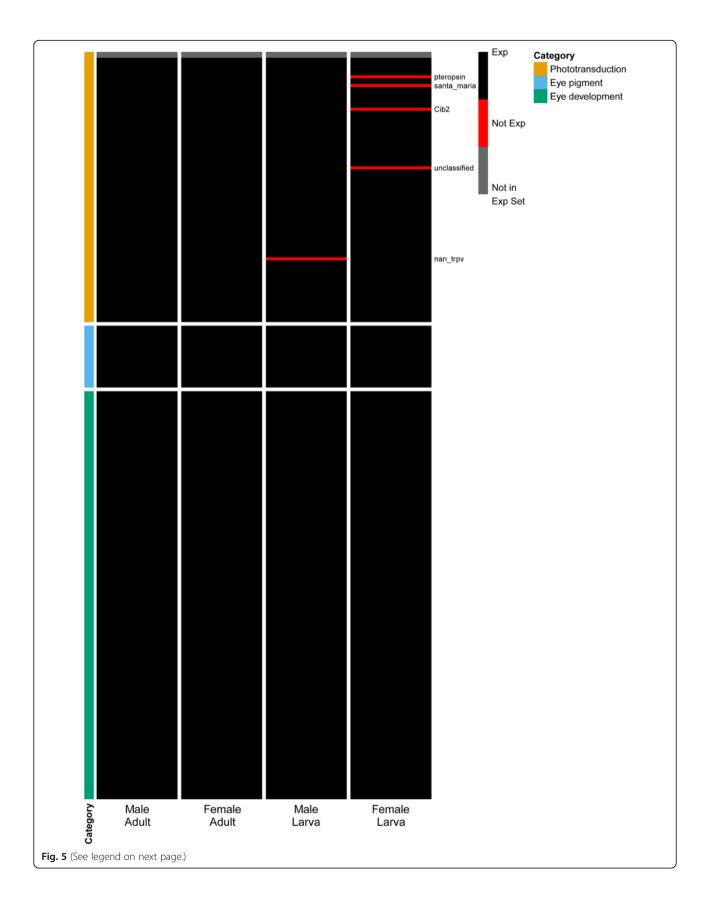
A total of seven opsins (including three visual opsins: *UVRh, BRh*, and *LWRh*) were identified in the expression set. While all seven opsins were expressed in both developmental stages, each was significantly upregulated in adults relative to larvae (*UVRh*, log<sub>2</sub>FC = 8.72, FDR =  $1.99 \times 10^{-191}$ ; *BRh*, log<sub>2</sub>FC = 7.84, FDR =  $1.58 \times 10^{-68}$ ; *LWRh*, log<sub>2</sub>FC = 9.37, FDR <  $2.22 \times 10^{-308}$ ; *Rh7*, log<sub>2</sub>FC = 1.15, FDR =  $5.84 \times 10^{-4}$ ; *pteropsin*, log<sub>2</sub>FC = 3.65, FDR =  $2.84 \times 10^{-4}$ ; *unclassified*, log<sub>2</sub>FC = 14.71, FDR =  $1.19 \times 10^{-52}$ ; *RGR-like*, log<sub>2</sub>FC = 4.96, FDR =  $6.07 \times 10^{-10}$ ; Fig. 6; Additional file 2: Table S10).

In addition to the *Heliconius melpomene* and *D. melanogaster* vision homologs we identified, manual searches of the Blast2GO functional annotation identified an additional 23 vision-related genes, including numerous genes putatively associated with phototransduction and eye development (Additional file 2: Table S12). Of these genes, 14 were differentially expressed between larval and adult heads, with seven



(C) Eye development genes. Counts were normalized by variance stabilizing transformation, with warmer colors indicating higher expression. Rows denote individual genes, and columns denote samples, both of which are clustered by gene expression. Family indicates the family from which the sample was derived, Sex indicates the sex of the sample, and Stage indicates the developmental stage of the sample. Heatmaps were created with pheatmap v1.0.12 [62] in R v3.6.2 [61]





(See figure on previous page.)

**Fig. 5** Presence/absence of expression maps for the top vision homologs in *B. anynana*. Rows denote individual genes, and columns denote sample group. Genes that were expressed are indicated in black, while red indicates genes that were not expressed. Genes colored in grey were identified in the *B. anynana* genome but were not present in the head expression set (i.e., not expressed in any group). Category indicates the gene family to which each gene belongs. Expression maps were created with pheatmap v1.0.12 [62] in R v3.6.2 [61]

upregulated in adults and seven upregulated in larvae (Additional file 1: Fig. S8).

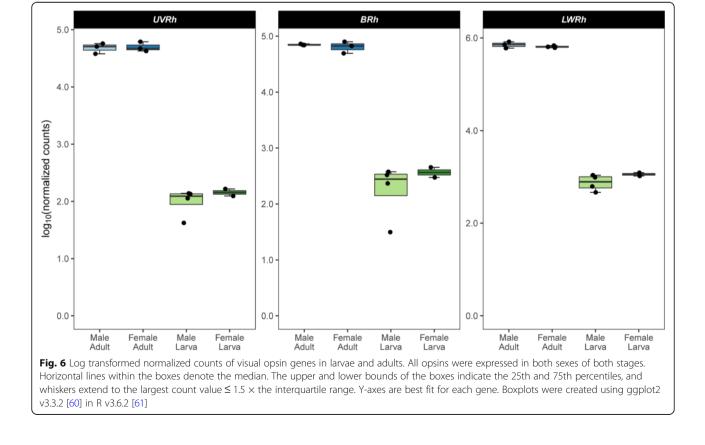
## Chemosensory genes

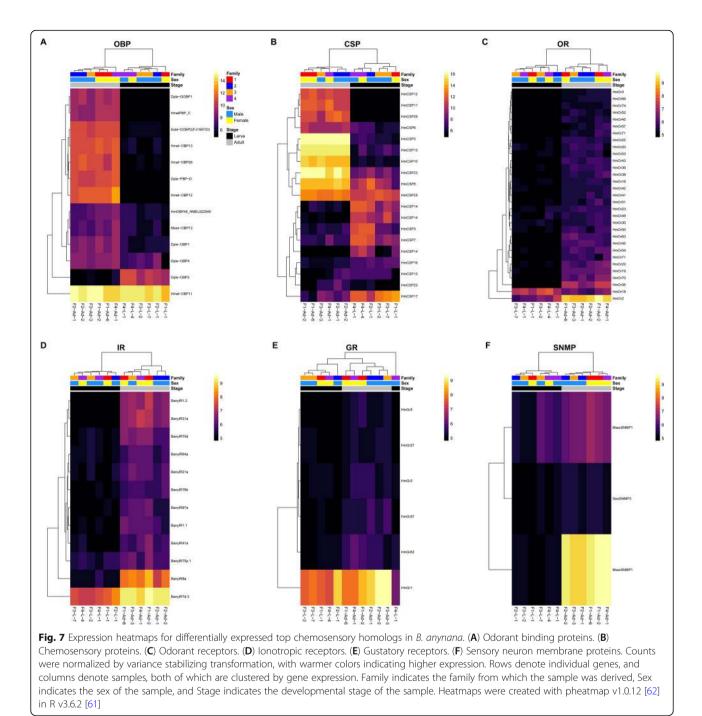
## Odorant binding proteins

Blast hits for 28 of the 273 queried OBP genes resulted in the identification of 48 putative homologs in the B. anynana genome (Additional file 2: Table S13). We containing pfam01395 retained only those or smart00708 domains, which resulted in a set of 19 B. anynana OBP genes, 17 being in the head expression set (Additional file 2: Table S14). Of these homologs, 13 (76%) were differentially expressed (FDR < 0.05), 12 of which were upregulated in adults and one of which was upregulated in larvae (Fig. 7A). OBPs were not significantly enriched in the full differentially expressed gene set (FDR = 0.10). Five OBPs showed stage-/sex-specific expression, including a homolog of Hmel-OBP12 (BANY.1.2.g14367) that was only expressed in the adult stage, and Dple-OBP19 (BANY.1.2.g20356), which was expressed in female but not male adults (Fig. 8; Additional file 2: Table S11). Three other OBPs exhibited sex-specific expression in larvae, with *HmelPBP\_C* (*BANY.1.2.g06880*) and *Dple-PBP-D* (*BANY.1.2.g06881*) showing male-specific expression and *Hmel-OBP22* (*BANY.1.2.g19953*) showing female-specific expression.

## Chemosensory proteins

Blast hits for 18 of the 34 queried CSP genes and one gene identified in our manual search resulted in the identification of 27 putative homologs in the *B. anynana* genome (Additional file 2: Table S15). Twenty-four of these candidate CSP genes contained the pfam03392 domain, 22 of which were in the head expression set (Additional file 2: Table S16). Of these homologs, 19 (86%) were differentially expressed (FDR < 0.05), with 11 upregulated in adults and eight upregulated in larvae (Fig. 7B). CSPs were significantly enriched in the full differentially expressed gene set (FDR =  $3.56 \times 10^{-3}$ ). While there was evidence that all CSPs in the expression set were expressed in both life stages, *HmCSP11* 





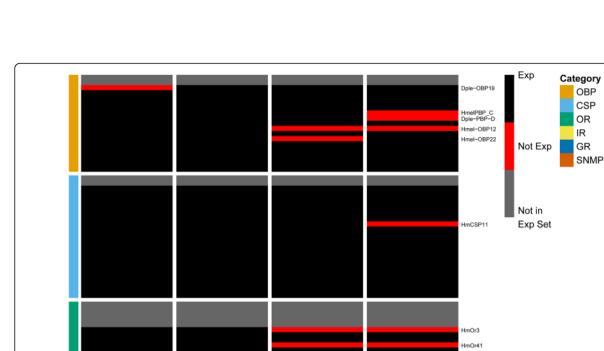
(BANY.1.2.g12993) was not expressed in female larvae

(Fig. 8; Additional file 2: Table S11).

## **Odorant receptors**

Blast hits for 38 of the 70 OR genes and four genes found via a manual search resulted in the identification of 50 putative homologs in the *B. anynana* genome (Additional file 2: Table S17). In total, 43 of these were retained as *B. anynana* OR genes by confirmation of the presence of either the pfam02949 or pfam08395 protein

domain (Additional file 2: Table S18). Of these homologs, 38 were in the head expression set, 31 (82%) of which were differentially expressed between larvae and adults (FDR < 0.05). These differentially expressed genes consisted of 30 that were upregulated in adults and one that was upregulated in larvae (Fig. 7C). Additionally, ORs were significantly enriched in the full differentially expressed gene set (FDR =  $1.19 \times 10^{-3}$ ). Thirteen ORs were found to exhibit stage-specific expression, all of which were expressed only in adults (Fig. 8; Additional



Male

Larva

HmOr63 HmOr52 HmOr70 HmOr42 HmOr43 HmOr45 HmOr36 HmOr38 HmOr36 HmOr37 HmOr27

HmOr54 HmOr57 HmOr19 HmOr45 HmOr71 HmOr71 HmOr74 HmOr71 HmOr71

BanylR87a BanylR40a

BanyIR21a

BanyIR76b BanyIR1.2 BanyIR31a BanyIR7d.2

HmGr5 HmGr52 HmGr68 HmGr2 HmGr12 HmGr73 HmGr44 HmGr19 HmGr27

HarmSNMP3 SexiSNMP3

Female

Larva

Fig. 8 (See legend on next page.)

Category

Male

Adult

Female

Adult

#### (See figure on previous page.)

**Fig. 8** Presence/absence of expression maps for the top chemosensory homologs in *B. anynana*. Rows denote individual genes, and columns denote sample group. Genes that were expressed are indicated in black, while red indicates genes that were not expressed. Genes colored in grey were identified in the *B. anynana* genome but were not present in the head expression set (i.e., not expressed in any group). Category indicates the gene family to which each gene belongs. OBP = odorant binding protein, CSP = chemosensory protein, OR = odorant receptor, IR = ionotropic receptor, GR = gustatory receptor, SNMP = sensory neuron membrane protein. Expression maps were created with pheatmap v1.0.12 [62] in R v3.6.2 [61]

file 2: Table S11). Moreover, 10 ORs showed sex-specific expression in larvae, with six only expressed in male heads (*HmOr13, HmOr19, HmOr36, HmOr42, HmOr54,* and *HmOr61*) and 4 only expressed in female heads (*HmOr27, HmOr51, HmOr57,* and *HmOr70*).

## Ionotropic receptors

We mapped 24 of the 31 *B. anynana* IR sequences from [63] to genes in the reference genome, 19 of which were within the head expression set (Additional file 2: Table S19). Of these homologs, 12 (63 %) were differentially expressed (FDR < 0.05), all of which were upregulated in adults (Fig. 7D). However, IRs were not significantly enriched in the full differentially expressed gene set (FDR = 0.34). Three IRs were found to only be expressed in adult heads: *BanyIR31a*, *BanyIR1.2*, and *BanyIR40a* (Fig. 8; Additional file 2: Table S11). In addition, four IRs were expressed in a sex-specific fashion in larvae, with three only expressed in male larvae (*BanyIR76b*, and *BanyIR7d.2*) and one only expressed in female larvae (*BanyIR87a*).

#### **Gustatory** receptors

Blast hits for 24 of the 73 GR genes resulted in the identification of 39 putative homologs in the B. anynana genome (Additional file 2: Table S20). We retained only those that contained the pfam08395 domain, resulting in a set of 27 B. anynana GR genes, 16 of which were in the head expression set (Additional file 2: Table S21). Of these homologs, six (38%) were differentially expressed (FDR < 0.05), all of which were upregulated in adults (Fig. 7E). GRs were not significantly enriched in the full differentially expressed gene set (FDR = 0.94). Four GRs, consisting of homologs of HmGr2, HmGr5, and HmGr19, showed adult-specific expression (Fig. 8; Additional file 2: Table S11). Furthermore, one HmGr12 homolog (BANY.1.2.g06465) showed male-specific expression in adults, and six GRs showed sex-specific expression in larvae, with four exhibiting male-specific expression (HmGr27, HmGr44, HmGr52, and HmGr68) and two exhibiting female-specific expression (HmGr57 and HmGr73).

## Sensory neuron membrane proteins

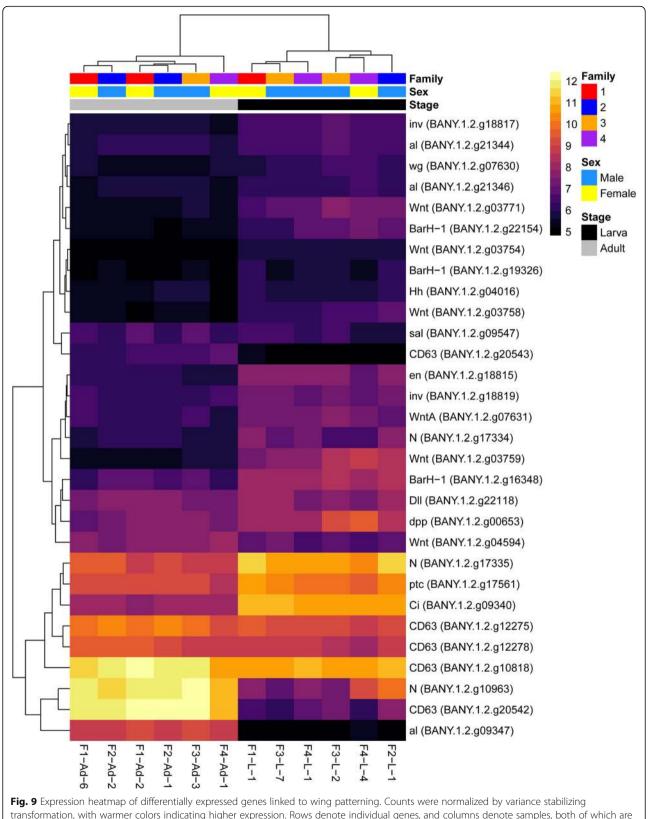
We identified 16 putative SNMP homologs, consisting of blast hits for nine of the 33 SNMP query genes (Additional file 2: Table S22). Filtering these putative homologs for genes that contained the pfam01130 domain and were annotated as SNMP genes in the functional annotation resulted in a set of six *B. anynana* SNMP genes (Additional file 2: Table S23). All of these were within the head expression set, with three (50%) being differentially expressed between larvae and adults, each of which were upregulated in adults (Fig. 7F). SNMPs, however, were not significantly enriched in the full differentially expressed gene set (FDR = 0.81). Two SNMP homologs showed sex-specific expression in larvae, with *SexiSNMP3* (*BANY.1.2.g07849*) exhibiting male-specific expression and *HarmSNMP3* (*BANY.1.2.g07846*) exhibiting female-specific expression (Fig. 8; Additional file 2: Table S11).

## Developmental and wing patterning genes

A total of 52 genes associated with wing patterning in butterflies were found in the head expression set of larval and adult B. anynana (Additional file 2: Table S24; see [64] and [65] for butterfly wing patterning genes). These genes include homologs for al, antp, ap, BarH-1, CD63, Ci, Dll, dpp, dsx, EcR, en, Hh, inv, N, optix, ptc, sal, wg, and several Wnt genes. Of these, 30 (58%) were differentially expressed between larvae and adults (FDR < 0.05), including homologs for al, BarH-1, CD63, Ci, Dll, dpp, en, Hh, inv, N, ptc, sal, wg, Wnt, and WntA (Figs. 2 and 9). Copies of two genes known to be involved with development in В. anynana, eyespot CD63 (BANY.1.2.g25497) and Ci (BANY.1.2.g11922), were found to exhibit expression specific to adult and larval heads, respectively (Additional file 2: Table S11). Additionally, a copy of BarH-1 (BANY.1.2.g16347) exhibited larva-specific expression, while a Wnt-5 homolog (BANY.1.2.g04762) was expressed in all groups except female larvae.

## Discussion

Our analysis of the gene expression profiles of larval and adult *B. anynana* heads revealed considerable differences between the two developmental stages, with > 50 % of all expressed genes showing differential expression. Furthermore, we identified numerous genes involved with vision and chemosensation and elucidated how the expression of these genes, as well as the expression of known wing patterning genes, differs in the head



transformation, with warmer colors indicating higher expression. Rows denote individual genes, and columns denote samples, both of which are clustered by gene expression. Family indicates the family from which the sample was derived, Sex indicates the sex of the sample, and Stage indicates the developmental stage of the sample. This heatmap was created with pheatmap v1.0.12 [62] in R v3.6.2 [61]

throughout ontogeny and between the sexes. More than 250 B. anynana genes putatively linked to vision-related processes were discovered to be expressed in the head, including genes associated with phototransduction as well as eye pigmentation and development. A total of 143 homologs associated with chemosensation were identified, comprising odorant binding proteins, chemosensory proteins, odorant receptors, ionotropic receptors, gustatory receptors, and sensory neuron membrane proteins. In addition, we found 52 genes previously described as butterfly wing patterning genes that were expressed in larval and/or adult heads, including a WntA homolog, a gene known to play a significant role in wing pattern development across a diversity of nymphalid species [66, 67]. To our knowledge, this study is the first attempt to characterize the sensory gene repertoire of Bicyclus butterflies and provides a promising resource for investigating differences in the sensory biology of larvae and adult butterflies.

## Overall expression differences between larval and adult heads

In larval heads, upregulated genes were linked to developmental processes, including multicellular organism development and the Wnt signaling pathway (Table 2 and Additional file 2: Table S6). Wnt signaling is known to be involved with cell differentiation and proliferation in animals [68, 69]. In butterflies, Wnt genes have been found to be involved with wing patterning [67, 70] and are expressed in various *B. anynana* tissues during embryogenesis, with *Wnt7* and *Wnt11* both expressed in head tissues [71]. In the current study, we found that numerous Wnt genes are expressed in the heads of fifth instar larvae and adults, including *Wnt-1*, *Wnt-5*, *Wnt-6*, *Wnt-10*, *Wnt-11*, and *WntA* homologs, most of which were upregulated in larval heads.

In addition to developmental processes, genes upregulated in larval heads were also enriched for processes linked to gene expression and protein metabolism. Upregulation of genes involved with these functional categories is possibly in part due to the physiological changes taking place in larval head tissues in preparation for pupation and metamorphosis. As with other holometabolous insects, the larval tissues and organs of buttervia flies undergo degeneration autophagy and subsequent remodeling during metamorphosis (see [72] for review). Moreover, in Manduca sexta, metamorphic cell death is associated with a marked drop in protein synthesis [73]. Therefore, the enrichment of GO terms involved with gene expression and protein metabolism might be indicative of a similar decrease in protein synthesis in *B. anynana*.

In adult heads, chemoreception processes were enriched, with associated GO terms including detection of chemical stimulus involved in sensory perception of smell, olfactory receptor activity, and odorant binding. These results are consistent with elevated chemosensory gene expression in the adult stage of other Lepidoptera [74] and suggest a greater investment in the chemosensory system of adult B. anynana. Indeed, the adult stage partakes in numerous behaviors that larvae do not, including courtship/copulation, oviposition, and foraging for fruit. Furthermore, B. anynana adult females are known to cue in on pheromones produced by males for mate choice [51, 52, 75], and chemical cues appear to play just as important of a role as visual cues in mate choice for this species. Finally, the ability of flight permits these butterflies to perform these behaviors in a greatly expanded three-dimensional space compared to the larval stage, possibly requiring adults to maintain a more sensitive and sophisticated chemosensory system.

#### Insights into larval and adult phototransduction

A large number of vision-related genes were expressed in *B. anynana* heads, most of which were differentially expressed between adults and larvae. These results have implications for furthering our understanding of the differences in the visual capabilities and phototransduction signaling cascade for different life stages of lepidopterans and other holometabolous insects.

The primary visual organs of larval and adult butterflies have disparate morphologies, with larvae possessing two simple eyes consisting of up to six stemmata and adults having two compound eyes consisting of hundreds of ommatidia [76]. Therefore, it is likely that at least some of the observed patterns in vision-related gene expression in larval and adult heads are due to substantial differences in structure and cell composition. Moreover, during metamorphosis in holometabolous insects, the larval stemmata migrate to the adult optic lobe and continue to function as extraretinal photoreceptors [17, 76, 77]. Consequently, the presence of both adult and larval visual structures in *B. anynana* adults might account for a portion of the upregulation observed in vision genes.

Interestingly, the differentially expressed vision genes upregulated in adult heads were dominated by phototransduction genes (65 %), while differentially expressed genes upregulated in larval heads were largely associated with eye development (77 %). A greater emphasis on phototransduction in adults is perhaps not surprising, as a significant proportion of the adult head consists of eye tissue, and optic lobes have been found to comprise nearly 75 % of the butterfly brain [78–80]. In comparison, the stemmata of larvae occupy a considerably smaller proportion of the larval head. The upregulation of genes involved with eye development in late fifth instar larvae suggests that compound eye developmental processes have initiated just prior to pupation.

Several phototransduction genes were upregulated in larvae relative to adults, including a copy of norpA, wunen2, and the innexins ogre, inx2, and inx3. norpA encodes the protein phospholipase C (PLC), which is involved with diacylglycerol (DAG) production in the Drosophila phototransduction cascade [81, 82]. Moreover, Macias-Muñoz et al. (2019) hypothesized that wunen plays a similar role in Lepidoptera phototransduction as lazaro in Drosophila, which is involved in DAG level regulation [83]. Lepidoptera have three copies of wunen, and while wunen2 was upregulated in larval B. anynana, the other two (wunen and wunen3) were upregulated in adults. The observed stage-biased expression of specific norpA and wunen copies suggests potential differences in DAG regulation throughout development.

Finally, *ogre*, *inx2*, and *inx3* form gap junction channels, all of which are critical to visual transmission. Specifically, *ogre* and *inx3* are necessary for visual synaptic transmission in retinal pigment cells in the compound eyes of *Drosophila*, while *inx2* plays an essential role in laminar glial cells [84]. The fact that these genes are upregulated in larvae suggests the possibility that gap junctions might be either more integral to larval phototransduction or present in greater density in larval eyes. Future functional work should explore this possibility.

Intriguingly, none of the identified vision-related genes, including the visual opsins, were differentially expressed between male and female larvae or male and female adults, a result consistent with previous studies with *B. anynana* [53, 54]. It is also interesting to note that all visual opsins were expressed in larval and adult heads, suggesting that both developmental stages might be capable of perceiving similar wavelengths of light. Future electrophysiological and behavioral studies should explore the spectral sensitivity and behavioral responses of larval and adult *B. anynana* to different light wavelengths.

From the current study, it is not possible to determine which of these genes are expressed in the eyes, brain, and/or other head structures. Numerous studies have localized phototransduction genes in nonvisual tissues, such as the central nervous system [85, 86]. Therefore, future work should investigate tissue-specific expression and determine the expression patterns of these genes in the eyes. While significant efforts have been made to explore butterfly vision in a number of species, usually focusing on opsins, the results of the current study provide a new set of candidate vision genes for *B. anynana* and will help to expand our understanding of lepidopteran adult, as well as larval, vision.

#### Insights into larval and adult chemosensation

In the current study, we identified a total of 143 chemosensory genes, most of which showed differential expression between larval and adult *B. anynana* heads. Notably, we discovered numerous OBPs, CSPs, ORs, IRs, GRs, and SNMPs with stage-/sex-specific expression or that displayed differential expression between the developmental stages. Many of these genes share homology with chemosensory genes associated with pheromone detection, host plant recognition, and foraging in other species of Lepidoptera. Because the functions and specificity of chemosensory genes in *B. anynana* are largely unknown, these genes serve as promising targets for further investigation to expand our understanding of chemically mediated behaviors in this species.

A number of the chemosensory genes identified are candidates for pheromone binding and reception. The gene BANY.1.2.g22938 was upregulated in adult heads and is homologous to Hmel-OBP13 (alternative name = HmOBP20; [87]), which was recently found to possibly be involved with species-specific recognition of pheromones in *Heliconius* butterflies [88]. In addition to the two genes (BANY.1.2.g06880 and BANY.1.2.g06881) sharing sequence homology with H. melpomene and plexippus Danaus pheromone binding proteins  $(HmelPBP_C$ and Dple-PBP-D, respectively), BANY.1.2.g22938 might also be involved with pheromone detection in B. anynana. Moreover, two putative pheromone receptor homologs (HmOr3 and HmOr30; [87, 89, 90]) were upregulated in adult heads, suggesting that they might also be involved with chemical-mediated mate choice behaviors. Finally, a homolog of Dple-OBP19 (BANY.1.2.g20356) was expressed in female but not male adult heads, indicating a putative role in male sex pheromone (MSP) detection [75].

In addition to the OBP and OR repertoire, we identified two homologs of SNMP1 (both MsexSNMP1 homologs) that were upregulated in adult heads. SNMP1 a protein that forms a complex with pheromone-detecting ORs and an odorant receptor co-receptor (Orco; HmOR2; identified in the current study as BANY.1.2.g12855 in B. anynana) in insects [30, 31]. SNMP1 is involved with pheromone detection in both D. melanogaster [30, 91] and numerous lepidopteran species [31, 92-95], and it may also play a role in pheromone detection in B. anynana.

Several genes were identified as putatively involved with host plant recognition and/or foraging behavior. A homolog of *Eobl-GOBP2 (BANY.1.2.g06879)*, a gene involved with the detection of plant volatiles in the moth *Ectropis obliqua* [96], was upregulated in adult heads. In addition, a homolog of *HmOR49 (BANY.1.2.g06204)*, a putative citral receptor [87, 97], was upregulated in adult heads. Citral is a plant volatile that is present in plant

species such as lemongrass and orange [98] and serves as a food attractant for Bombyx mori larvae [99] and an oviposition deterrent in the light brown apple moth, Epiphyas postvittana [100]. Moreover, electroantennography (EAG) recordings indicated that citral evokes a response in B. anynana antennae (Murphy, Joshi, and Westerman, unpublished data). Homologs for two GRs (HmGr9 and HmGr57) that are characterized as putatively being involved with host plant identification via recognition of the plant alkaloid synephrine in H. melpomene [24, 88] were also expressed in B. anynana heads. These genes might also be involved with host plant recognition in *B. anynana*. Alternatively, they might be involved with detection of B. anynana's adult food source, ripe/rotting fruit, as synephrine, like citral, is present in citrus fruits [101].

Two IRs upregulated in adult *B. anynana, BanyIR1.2* and *BanyIR75d*, are putatively involved with host plant searching behavior, as *IR1.2* and *IR75d* are upregulated in antennae of mated females of the moth *Helicoverpa armigera* [63]. In *B. anynana*, the expression of *BanyIR1.2* was specific to adults, consistent with a possible function in oviposition-related behaviors in this species.

Our results also illuminate genes that play potentially important roles in larval chemoreception. One OBP (a homolog for Dple-OBP2), eight CSPs (homologs for HmCSP3, HmCSP7, HmCSP13, HmCSP14, HmCSP16, and HmCSP17), and one OR (a HmOr18 homolog) were upregulated in larval heads relative to adult heads. Previous studies of OBP and CSP gene expression in larvae and adult H. armigera discovered six OBP and four CSP genes that are exclusively expressed in larvae antennae and mouthparts, suggesting that OBP and CSP genes may play a role in larval foraging [102]. Moreover, numerous ORs in the moth Spodoptera littoralis were found to be tuned to plant volatiles and are involved with larval foraging behavior [103, 104]. Thus, it is possible that the chemosensory genes upregulated in *B. any*nana larvae might play important roles in mediating larval foraging behavior.

## Expression of wing patterning genes

Wing patterning genes have been hypothesized to underlie assortative mating behaviors and ultimately speciation in Lepidoptera through associations with preference for the traits they influence [58, 59]. This might occur in two ways: (1) both the trait and preference are controlled by the same gene; or (2) the genes controlling the trait and preference for that trait are separate but maintained in high linkage disequilibrium (i.e., inherited together) [57, 105, 106]. Empirical evidence for either of these hypotheses, or for the genetic basis of assortative mate preference more broadly, is relatively slim. However, numerous wing patterning genes are known to influence sensory organ and neural processes in other insect species, providing a promising set of candidate genes for exploration. For instance, optix, an eye development gene in Drosophila [107], has been co-opted to control red pigmentation in the wings of Heliconius butterflies [108]. Furthermore, engrailed (en), a gene involved with neurogenesis [109], axonal targeting [110], and neuronal cell fate determination [111], is also linked to butterfly eyespot development in *Bicyclus* [112]. Here, we found that numerous genes known to be involved with wing patterning in butterflies were expressed in B. anynana heads, possibly in the brain, eyes, or both tissues. If these genes, particularly those involved with eyespot development in B. anynana, are linked to preferences for eyespot traits, they might play a role in the great amount of diversity we see in this taxon (80 + species, with many species living in sympatry) [113, 114]. We propose that these wing patterning genes should be investigated as potential drivers of assortative mate preference and speciation in Bicyclus butterflies.

## Lack of differential expression of sensory and wing patterning genes between the sexes

It is interesting to note that none of the vision, chemosensory, or wing patterning genes we identified here were differentially expressed between the sexes of either stage. This suggests that developmental stage is likely a larger factor than sex for the expression of these genes in the head. Alternatively, it is also possible that any effects of sex on vision, chemosensory, or wing patterning genes were either too small or too tissue specific to be detected in our data set. For instance, the number of replicates for the sex comparisons was relatively small (Adults: n = 3 males, n = 3 females; Larvae: n = 4 males, n = 2 females); increasing the number of replicates would better capture the biological variability attributed to sex and result in greater power to detect differentially expressed genes. Furthermore, it is possible that increasing tissue specificity (e.g., sequencing the brain neuropils and various sensory tissues separately) might reveal sexspecific gene expression patterns that are obscured when sequencing the whole head.

## Conclusions

In this study, we identified the sensory gene repertoire of the butterfly *B. anynana* and characterized the expression of these genes in larval and adult heads. While visual and chemosensory genes have been explored in many adult Lepidoptera, few studies have investigated the expression of such genes in their larval stages. Our results provide an initial step in elucidating the differences in sensory processing throughout development in butterflies. Moreover, we identified numerous candidate genes for host plant recognition, foraging, and mate choice, including both chemosensory and wing patterning genes expressed in *B. anynana* heads. Future studies should explore the functions of these candidate genes and determine their tissue specificity.

## Methods

## Animals

Bicyclus anynana, a nymphalid butterfly native to subtropical Africa, has been maintained in laboratory colonies since 1988. All animals used in this study are descendants of an original population established in Leiden, Netherlands from 80 gravid females that were collected in Malawi [47]. The population at the University of Arkansas was established via the transfer of  $\sim 1,000$ eggs from a population in Singapore to Fayetteville, AR, USA in spring, 2017. Animals were reared in a climatecontrolled, USDA-APHIS approved (Permit # P526P-17-00343) greenhouse facility, which was maintained at approximately 27°C, 70 % relative humidity to induce the wet season phenotype in this species [47]. All experiments were conducted between January and March 2019 (sunrise range: 7:06-7:19 am, sunset range: 5:40-7:36 pm) under a 13:11 h light:dark photoperiod. In addition to natural light, the greenhouse was illuminated with full spectrum (including ultraviolet wavelengths) fluorescent lights (lights on: 7:00 am, off: 8:00 pm).

## Experimental design and tissue collection

Four unique families were created by pairing one three-day-old virgin male and one three-day-old virgin female together in a small mesh cage (31.8 cm  $\times$  31.8 cm  $\times$  31.8 cm) at 8:00 am for at least three hours to ensure that copulation occurred. After visual confirmation that the pair had copulated, the female was removed from the mating cage and isolated in a new large mesh cage (39.9 cm  $\times$  39.9 cm  $\times$  59.9 cm) containing a corn plant (*Zea mays*) on which to lay eggs and a slice of moistened banana for food. Each female was then given seven days to lay fertilized eggs on the provided corn plant, after which the egg-laden corn plant was transferred to a new small mesh cage (31.8 cm  $\times$  31.8 cm).

Upon hatching, larvae were reared in their familyspecific cages under identical conditions and were fed corn plants *ad libitum*. To ensure that all four families experienced the same environmental conditions within the greenhouse and to control for any potential unforeseen confounding variables associated with cage location, the physical position of each cage was alternated daily. Upon the morning of reaching the late fifth instar stage, which was determined by the stark change in color from tan/brown to green (Fig. 1A), a subset of the larvae from each family was sacrificed by decapitation with RNasefree scissors (n = 6 larvae total). This stage was chosen to ensure that all larvae were as close as possible in development and because it is the final developmental stage prior to pupation. A second subset from each family was allowed to pupate, and newly eclosed adults (Fig. 1B) were sacrificed by decapitation on the morning of emergence (n = 6 adults total). All decapitations were conducted between 9:30 am-12:00 pm, and heads were immediately transferred into RNase-free, low binding 1.5 ml microcentrifuge tubes (Biotix, San Diego, CA, USA),

## RNA extraction, library preparation, and sequencing

itional file 1: Table S25).

flash-frozen in liquid nitrogen, and transported to the

lab for storage at -80°C until they were processed (Add-

Each frozen head was immersed in pre-chilled RNAlater-ICE (Ambion; Austin, TX, USA) and incubated at -20°C for approximately 16 h prior to tissue processing. After this incubation period, heads were transferred to a dissecting dish filled with RNAlater-ICE, and all residual thoracic tissue was carefully removed with forceps under a dissecting microscope (Zeiss Stemi 508; Jena, Germany), leaving only head tissue. Individual isolated heads (which included antennae and mouthparts) were then disrupted in lysis buffer with an RNase-free, disposable pestle, and small (< 200 nucleotides) and large RNA (> 200 nucleotides) were extracted in separate fractions using the NucleoSpin<sup>®</sup> miRNA Kit (Macherey-Nagel; Düren, Germany) following the manufacturer's recommended protocols. RNA purity, concentration, and integrity for each sample were subsequently determined using a NanoDrop 2000 (Thermo Fisher Scientific; Waltham, MA, USA) and TapeStation 2200 (Agilent; Santa Clara, CA, USA).

After confirmation of RNA quality and quantity, a cDNA library for each head was prepared using 500 ng of large RNA as input for the KAPA mRNA HyperPrep Kit (KAPA Biosystems; Wilmington, MA, USA) combined with the KAPA Unique Dual-Indexed Adapter Kit (KAPA Biosystems; Wilmington, MA, USA). The quality of each cDNA library was subsequently verified using a TapeStation 2200 (Agilent; Santa Clara, CA, USA). All libraries (n = 12) were then shipped on dry ice to the University of Chicago Genomics Facility for secondary quality assessment on a 5300 Fragment Analyzer (Agilent; Santa Clara, CA, USA), and 50 base pair (bp) single-end (SE) sequencing was performed on a single lane of a HiSeq 4000 (Illumina; San Diego, CA, USA).

## Animal sexing

All adults were sexed based on apparent sexually dimorphic features, specifically the presence/absence of androconia (the male-specific pheromone organ). Because larvae do not display any obvious sexual dimorphism, we extracted DNA from individuals using the KAPA Express Extract Kit (KAPA Biosystems; Wilmington, MA, USA) and amplified a femalespecific W-chromosome microsatellite ([115]; Genbank accession no.: AY785080) using the primers from [116]. PCR products were then visualized by gel electrophoresis, and females were identified by the presence of a band at ~185 bp, while males lacked this band (Additional file 1: Fig. S9).

#### **Functional annotation**

Blast2GO v5.2.5 [117] was used to conduct a *de novo* functional annotation of all genes in the most current *B. anynana* reference genome (v1.2; [56]; http://ensembl. lepbase.org/index.html). First, we used BLASTX v2.6.0+ [118] to search the NCBI 'nr' protein database (www. ncbi.nlm.nih.gov) and collected the top 10 hits with an E-value <  $10^{-3}$ . These results were then uploaded into Blast2GO, and further functional classification was performed using the InterProScan [119] function within Blast2GO. Finally, the "Mapping" and "Annotation" steps in Blast2GO were performed using the default parameters, and the resulting functional annotation table was exported.

#### Differential gene expression analysis

Prior to expression quantification, the quality of the raw reads was assessed using FastQC v0.11.8 (https://www.bioinformatics.babraham.ac.uk/projects/fastqc/), and Illumina adapter sequences were trimmed using Trimmomatic v0.38 [120]. Trimmed reads were then aligned to the *B. anynana* reference genome (v1.2) using STAR v2.7.1a [121] with the default parameters and the "--twopassMode Basic" option. Reads were quantified using the 'htseq-count' script from the HTSeq v0.11.2 Python package [122]. Differential gene expression analysis was conducted using the DESeq2 v1.24.0 package [123] in R v3.6.2 [61].

We conducted two separate differential expression analyses. First, the generalized linear model:

#### $y \sim family + sex + stage$

was fit to each gene using a negative binomial distribution, where *y* denotes the response variable (expression), *family* denotes the family to which each individual belongs (family 1–4), *sex* denotes the sex of each animal (male or female), and *stage* denotes the life stage of each individual (larva or adult). Using this design enabled us to contrast the effect of *stage* while controlling for differences in expression associated with lineage and sex. Second, the generalized linear model:

## $y \sim group$

was used, where *group* denotes a grouping variable that combines sex and stage (i.e., male larva, female larva, male adult, and female adult). This design permitted us to contrast the effect of sex for each stage (i.e., male larva vs. female larva and male adult vs. female adult). We note the suboptimal number of replicates (n = 2) for female larvae in the male vs. female larvae analysis; however, we opted to perform this analysis in an attempt to identify any sensory genes that show substantial differential expression between the sexes of this stage. Additionally, because a transcriptome-wide comparison between the sexes of caterpillars has never been conducted (to our knowledge), this analysis will also provide preliminary insights into sex-biased gene expression in lepidopteran larvae.

For both analyses, genes with a total read alignment count < 10 were filtered and not included in the differential expression analysis. Gene expression was calculated as the binary log of the expression fold change (log<sub>2</sub>FC), and the *apeglm* method was used for log<sub>2</sub>FC shrinkage to obtain the most accurate estimates of effect size [124]. Finally, genes with a false discovery rate (FDR; [125]) < 0.05 were retained for downstream analysis.

#### Gene ontology enrichment analyses

For further characterization, the Fisher's Exact Test function in Blast2GO was used to test for GO term enrichment. The set of differentially expressed genes identified for the first analysis ( $y \sim family + sex + stage \mod l$ ) was split into genes that showed increased expression in adults  $(\log_2 FC > 0)$  and those that showed increased expression in larvae  $(\log_2 FC < 0)$ , and each subset was tested separately. For the second analysis  $(y \sim group)$ model), the differentially expressed gene sets were not split due to the small number of genes in each set. The reference set used for all GO enrichment analyses consisted of all genes in the expression set, and only GO terms with an FDR < 0.05 were considered significantly enriched. The list of enriched GO terms for each analysis was then reduced to the most specific terms for visualization. Additionally, the reduced lists of enriched GO terms were processed using REVIGO (http://revigo. irb.hr/; [126]), which further eliminated redundancy and organized GO terms into treemaps consisting of related superclusters.

## Identification of visual genes

To identify genes involved with vision (i.e., phototransduction, eye pigment, and eye development) in *B. anynana*, we first collected the coding sequences (CDS) of 74 putative *H. melpomene* phototransduction genes from

[44] and the protein sequences of 200 D. melanogaster phototransduction, eye pigment, and eye development genes compiled by [54]. We then used BLASTX and BLASTP (BLAST v2.2.30+; [118]) to query these sequences against the B. anynana reference genome proteins in Lepbase (http://blast.lepbase.org/) and identify homologs. Homologs were determined based on hits with an E-value  $< 1 \times 10^{-10}$ , and the top candidate for each query gene was identified as the hit with the lowest E-value. In cases where numerous hits had identical Evalues, ties were broken by selecting the hit with the highest bit score. Finally, to identify additional putative vision genes, we manually searched the Blast2GO annotation descriptions, best blast hits, and GO annotations for terms linked to vision, including: "eye," "ommatidia," "ommatidium," "opsin," "photoreceptor," "phototransduction," "retina," and "visual". Fisher's exact tests were conducted to test if the identified vision-related genes were enriched in the differentially expressed gene set, with all expressed genes as the reference set.

To explore stage-/sex-specific expression, we investigated the normalized counts for individuals in each group (i.e., male larva, female larva, male adult, and female adult). Non-zero counts for any individual(s) within a group for a given gene were considered evidence for expression, while zero counts for all individuals in a group were considered evidence that a given gene was not expressed (note: it is possible that these genes are actually lowly expressed but at levels below the detection threshold for the sequencing depth of the current study).

## Identification of chemosensory genes

To identify genes involved with chemosensation in B. anynana, we collected 273 lepidopteran and D. melanogaster OBP protein sequences from [45], 34 H. melpomene CSP protein sequences from [87], 70 H. melpomene OR protein sequences from [87], 31 B. anynana IR sequences from [63], 73 H. melpomene GR protein sequences from [24], and 33 lepidopteran SNMP sequences from [31]. These sequences were then queried against the B. anynana reference genome with BLASTX or BLASTP in Lepbase (http://blast.lepbase.org/) to identify putative homologs. With the exception of the previously identified IR sequences in B. anynana, all hits with an E-value  $< 1 \times 10^{-10}$  were further screened for conserved protein domains specific to each gene family using CD-Search [127]. Specifically, sequences with hits for the following domains were retained: OBPs, either pfam01395 (PBP/GOBP family) or smart00708 (Insect pheromone/odorant binding protein domains); CSPs, pfam03392 (Insect pheromone-binding family, A10/OS-D); ORs, either pfam02949 (7tm Odorant receptor) or pfam08395 (7tm Chemosensory receptor); GRs, pfam08395 (7tm Chemosensory receptor); and SNMPs, pfam01130 (CD36 family). Because the CD36 superfamily common to SNMPs consists of three different protein families, only one of which includes SNMPs [128], we filtered the final putative SNMP sequences by only retaining those that were also annotated as SNMPs in our functional annotation.

In addition, we performed a manual search of the Blast2GO functional annotation to identify any additional putative OBP, CSP, OR, IR, GR, and SNMP genes. Specifically, we searched the Blast2GO descriptions and best blast hits for key terms, including: "odorant binding protein," "pheromone binding protein," "chemosensory protein," "ejaculatory bulbspecific protein 3," "odorant receptor," "olfactory receptor," "gustatory receptor," and "sensory neuron membrane protein" and subjected any putative chemosensory genes to the conserved protein domain filtration described above. Fisher's exact tests were used to test if the identified chemosensory gene categories were enriched in the differentially expressed gene set, with all expressed genes composing the reference set. P-values resulting from these six tests, along with the p-values resulting from the vision gene enrichment tests, were corrected for multiple comparisons (FDR) [125]. Finally, sex-/stage-specific gene expression was determined as previously described for the vision genes.

## Identification of wing patterning genes

To further explore the expression of genes that might be relevant to sensory processing and signaling during mate choice, we manually searched our de novo functional annotation for genes known to be involved with wing patterning, many of which have been hypothesized to also be involved in mate preference as well as other behaviors. These genes included several known B. anynana wing patterning genes, such as those coding the proteins Antennapedia (antp) [129, 130], apterous (ap) [131], CD63 antigen (CD63) [132], Cubitus interruptus (Ci) [133], decapentaplegic (*dpp*) [134], Distal-less (*Dll*) [135], doublesex (dsx) [116], Ecdysone Receptor (EcR) [136], Engrailed (en) [137], hedgehog (Hh) [129], Invected (inv) [137], Notch (N) [138], patched (ptc) [138], Spalt (sal) [137], Ultrabithorax (Ubx) [130, 133], and wingless (wg) [132], as well as genes known to be critical for wing patterning in Heliconius and other butterflies, including aristaless [139], BarH-1 [140], cortex [141], optix [108], and Wnt [67, 70].

#### Abbreviations

bp: base pair; cDNA: Complementary DNA; CDS: Coding sequence; CSP: Chemosensory protein; DAG: Diacylglycerol; DEGs: Differentially expressed genes; EAG: Electroantennography; FDR: False discovery rate; GO: Gene ontology; GR: Gustatory receptor; GSN: Gustatory sensory neuron; iGluRs: Ionotropic glutamate receptors; IR: Ionotropic receptor; Iog<sub>2</sub>FC: Log<sub>2</sub>(fold change); MSP: Male sex pheromone; OBP: Odorant binding

## **Supplementary Information**

The online version contains supplementary material available at https://doi. org/10.1186/s12864-021-07819-4.

Additional file 1: Supplemental Tables S1 and S25; captions for Supplemental Tables S2-S24; Supplemental Figures S1-S9.

Additional file 2: Supplemental Tables S2-S24

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#### Authors' contributions

DAE and ELW designed this experiment and wrote the manuscript. DAE performed the research and analyzed the data. Both authors read and approved the final manuscript.

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#### Availability of data and materials

Raw sequence data associated with this study are accessible through the NCBI Sequence Read Archive (SRA) database under BioProject ID PRJNA730880. All other data presented in this study are available within this manuscript and its additional files.

## Declarations

## Ethics approval and consent to participate

No ethics approval was required for this study.

#### **Consent for publication**

Not applicable.

#### **Competing interests**

The authors declare that they have no competing interests.

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