Diet and endocrine effects on behavioral maturation-related gene expression in the *pars intercerebralis* of the honey bee brain

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ABSTRACT

Nervous and neuroendocrine systems mediate environmental conditions to control a variety of life history traits. Our goal was to provide mechanistic insights as to how neurosecretory signals mediate division of labor in the honey bee (*Apis mellifera*). Worker division of labor is based on a process of behavioral maturation by individual bees, which involves performing in-hive tasks early in adulthood, then transitioning to foraging for food outside the hive. Social and nutritional cues converge on endocrine factors to regulate behavioral maturation, but whether neurosecretory systems are central to this process is not known. To explore this, we performed transcriptomic profiling of a neurosecretory region of the brain, the *pars intercerebralis (PI)*. We first compared PI transcriptional profiles for bees performing in-hive tasks and bees engaged in foraging. Using these results as a baseline, we then performed manipulative experiments to test whether the PI is responsive to dietary changes and/or changes in juvenile hormone (JH) levels. Results reveal a robust molecular signature of behavioral maturation in the PI, with a subset of gene expression changes consistent with changes elicited by JH treatment. By contrast, dietary changes did not induce transcriptomic changes in the PI consistent with behavioral maturation or JH treatment. Based on these results, we propose a new verbal model of the regulation of division of labor in honey bees in which the relationship between diet and nutritional physiology is attenuated, and in its place is a relationship between social signals and nutritional physiology that is mediated by JH.
INTRODUCTION

A major goal in biology is to understand the mechanisms that underlie complex traits, including animal social behavior (Robinson et al., 2008). Social behaviors such as courtship, kin recognition and social foraging are tightly linked to reproduction and survival and as such, are regulated by the interplay between an organism’s internal physiological state and its environment (West-Eberhard, 2003). Understanding how internal and environmental signals interact with specific neural substrates to regulate social behaviors remains an important question. A large body of literature indicates that specialized sensory and neural mechanisms have evolved to process social information (Insel and Fernald, 2004).

Neurosecretory cells in the brain play a central role in integrating social and physiological information in both vertebrates and invertebrates. In mammals, for example, neurosecretory cells in the hypothalamus receive pheromonal information through neuronal inputs from the vomeronasal system. The hypothalamus subsequently regulates the production of hormones from the pituitary gland, eliciting changes in reproductive and aggressive behaviors (Dulac and Torello, 2003). Similarly in insects, neurosecretory cells in the brain innervate endocrine glands known as the corpora cardiaca and the corpora allata (Carrow et al., 1984; Eichmüller et al., 1991; Ludwig et al., 2002). The majority of these neurosecretory cells are located along the dorsal midline of the insect brain, in a region known as the pars intercerebralis (PI). The PI is comprised of an unpaired cluster of neurons, which is bordered laterally by the mushroom body calyces and ventrally by the central body (de Velasco et al., 2007; Ludwig et al., 2002; Strausfeld, 1976). The neurosecretory cells in the PI are specifically described as monopolar neurons whose dendrites project broadly into the medial protocerebrum and whose axons join the first nerve towards the corpora cardiaca (Hartenstein, 2006).

Similar to the hypothalamus in mammals, neurosecretory cells in the PI regulate the production of neuropeptides and hormones involved in growth and reproduction (Flatt et al., 2005; Hodková, 1976; Rulifson et al., 2002; Shiga and Numata, 2000), as well as, several behaviors including locomotion, sleep and aggressive behaviors (Belgacem and Martin, 2002; Crocker and Sehgal, 2010; Davis et al., 2014; Foltenyi et al., 2007). However, the role of PI neurons in regulating division of labor in social insects has not been investigated.
We explored whether the PI mediates worker division of labor in honey bees, a process based on the behavioral maturation of individual adult workers. Bees perform within-hive tasks such as brood care (“nursing”) for the first 2-3 weeks of life, and then switch to foraging tasks outside (Winston, 1987). However, behavioral maturation is not rigid and is regulated by social and dietary cues. For example, colony food shortage can induce precocious foraging (Schulz et al., 1998), while experimental exposure to excess levels of queen mandibular pheromone (QMP) delays foraging onset (Pankiw et al., 1998). Behavioral maturation also is associated with dietary changes and changes in nutritional physiology. Dietary changes include a switch from a proteinaceous pollen-based diet early in adulthood to a carbohydrate-rich diet primarily comprised of honey and nectar in older bees (Crailsheim et al., 1992). Changes in nutritional physiology include a substantial decrease in abdominal lipids levels (Toth and Robinson, 2005), and experimental depletion of abdominal lipids has been shown to induce precocious foraging (Toth et al., 2005).

Research has shown that environmental cues regulate division of labor in honey bees through changes in brain gene expression. Behavioral maturation involves changes in the expression of thousands of genes in the brain (Alaux et al., 2009a; Whitfield et al., 2003) and a subset of these is regulated by social and nutritional cues (Grozinger et al., 2003; Wheeler et al., 2013). These transcriptomic changes are thought to converge on endocrine systems including juvenile hormone (JH), a multi-function hormone produced by the corpora allata (Whitfield et al., 2006). In honey bees, JH levels increase during behavioral maturation (Huang and Robinson, 1995; Huang et al., 1991; Rutz et al., 1976) and several manipulative experiments, including removal of the corpora allata, have shown that an increase in JH titers leads to the onset of foraging (Robinson, 1985; Robinson, 1987; Sullivan et al., 2000). JH has co-regulatory interactions with insulin signaling pathways and peripheral nutritional signals related to lipid stores (Corona et al., 2007; Guidugli et al., 2005; Nilsen et al., 2011), and is known to elicit brain gene expression changes that also occur naturally during behavioral maturation (Whitfield et al., 2006). Moreover, recent bioinformatic analyses of brain transcriptomic data implicate transcription factors related to JH-signaling as key regulators of behavioral maturation (Ament et al., 2012a).

These results indicate that environmental and physiological factors regulate behavioral maturation through JH signaling, but it is not known how JH interacts with neurosecretory factors in this process. Our goal was to develop a more complete understanding of the
regulation of division labor by testing whether the PI integrates diet and hormonal signals to produce transcriptional changes that eventually regulate behavior.

We first compared PI transcriptional profiles for bees performing in-hive tasks and foragers. Using these PI transcriptional profiles as a baseline, we then performed manipulative experiments to test whether the PI is responsive to dietary changes and/or to treatment with a JH analog (JHA). In this study we tested a key prediction of our hypothesis, that diet and JH manipulations cause changes in PI gene expression consistent with changes that occur during behavioral maturation. The results of this study implicate, for the first time, the PI in the regulation of honey bee division of labor.
MATERIALS AND METHODS

Behavioral collections, JHA treatments and diet manipulations

Honey bees (a mixture of European subspecies, mostly *Apis mellifera ligustica*) were collected from colonies maintained according to standard beekeeping practices at the University of Illinois Bee Research Facility, Urbana, IL, USA. To partially control for genetic variation, we used colonies derived from queens that were instrumentally inseminated with semen from a single male. We collected nurses and foragers using standard behavioral assays. Briefly, we opened each hive and collected bees inserting their head into honeycomb cells containing larvae as nurse bees.

For foragers, we chose to focus on bees collecting pollen because their brightly colored loads of pollen attached to corbiculae on their hind legs are easily visible making foraging status unequivocal. In wild type honey bees, pollen foragers either forage exclusively for pollen or collect both nectar and pollen, but limiting our analyses to these bees makes for at least a somewhat more homogeneous group than also including bees that forage for nectar and no pollen. As nectar and pollen foragers differ in a number of ways at the physiological and molecular levels (Amdam et al., 2004; Page et al., 2000; Schulz et al., 2004), the possible implications of this focus are considered in the discussion. For brevity we call the bees sampled here “foragers.” Field collections were performed in the summer of 2010.

JH analog (JHA) and diet manipulation experiments were performed with bees that were 7-9 days old. To collect this focal group, we removed frames of honeycomb containing dark-eyed pupae from colonies and placed them in a 34°C incubator with 80% RH. Bees that emerged from these frames were marked with a dot of colored paint (Testor's Paint, Rockford, IL, USA) and returned to their natal colony. We repeated this process for three consecutive days to obtain a large population of marked bees (> 1000 bees) in each colony. We collected marked bees from colonies when they were 7-9 days old. Marked bees were specifically collected from outer honeycomb frames and placed into Plexiglas cages (25-30 bees per cage) for JHA treatments and diet manipulations.

JHA and diet manipulations were set up as a 2x2 experiment and consisted of bees of uniform age that were: 1) fed a diet that was either nurse-like and protein-rich, or forager-like and carbohydrate-rich; and 2) treated with the JH analog methoprene (JHA+) or treated with a solvent control (Ctrl). We topically treated individuals on the abdomen with 200μg
methoprene in 5μl acetone, a dose that reliably induces precocious foraging behavior (Robinson, 1985, 1987). After treatment, both JHA-treated and control bees were placed separately into Plexiglas cages supplied with either a high protein diet (45% pollen, 45% honey, 10% water) (P+) or a diet with no protein (50% sucrose w/v) (P−) ad libitum (Ament et al., 2011a; Ament et al., 2008). Sucrose was used in place of honey because honey contains low levels of pollen and we wanted to contrast a protein-rich diet with a no protein diet, as in Ament et al. (2008). Cages were kept in a 34°C incubator with approximately 30% RH for four days. Consumption and mortality were monitored daily. We performed two independent trials of this experiment with unrelated bee colonies. These colonies also were unrelated to the colonies used in the nurse-forager experiment described above. The JHA and diet manipulation experiments were performed in the summer of 2011.

**Laser Capture Microdissection**

To collect cells from the PI, we first anesthetized bees using CO2 and then immobilized them further on wet ice. We then dissected brains from each individual using cold bee saline (Bicker, 1996) and embedded each brain into small tissue molds containing O.C.T. medium (Tissue-Tek). Each brain was embedded dorsal side down and frozen immediately using dry ice. Samples were placed at -80°C for long-term storage.

We performed laser capture microdissection (LCM) by sectioning frozen brains into 35 μm sections using a cryostat (Leica Biosystems). A total of 7-10 dorsal sections were collected onto PEN Membrane Glass slides (Applied Biosystems) and stained using the nuclear stain kit, Histogene LCM Frozen Section Staining Kit (Applied Biosystems). Cells from the PI were captured using an ArturusXT™ LCM instrument.

The PI is histologically recognized as the dorsal medial domain of the insect brain and is located between the calyces of the mushroom bodies and dorsal to the central complex (Ludwig et al., 2002; Strausfeld, 1976). We identified neurons in the PI from stained tissue sections based on its characteristic shape and on the color contrast between the cell bodies in the PI (nuclei were stained purple) and adjacent mushroom body nerve fibers (stained light pink). We captured PI neurons from all sections anterior to the central body (see Figure 1) (Eichmüller et al., 1991). Cells from these sections were collected onto 2-3 Capsure HS LCM caps (Applied Biosystems). Extraction buffer (15μl; PicoPure RNA Isolation Kit, Applied Biosystems) was applied directly onto each cap and incubated for 30 min at 42°C. After
incubation, we collected buffer from each cap using a centrifuge and stored each aliquot at -80°C for subsequent RNA isolation.

RNA extraction and Amplification

RNA pertaining to the PI of individual bees (pooled extraction buffer aliquots from cells collected on 2-3 caps) was extracted using PicoPure RNA Isolation Kits (Applied Biosystems) following the manufacturer’s guidelines for LCM tissue. After extraction, RNA from each sample was amplified using two rounds of linear antisense RNA (aRNA) amplification (Van Gelder et al., 1990). In vitro transcription was performed using the MEGAscript T7 Kit (Invitrogen™) and carried out for 14 h for the first amplification round and 6 h for the second round of amplification. aRNA quantity was assessed on a spectrophotometer and aRNA quality was assessed using an Agilent 2100 Bioanalyzer.

Microarrays

PI samples from nurses and foragers were hybridized onto microarrays for gene expression profiling. The two-dye, two-sample microarray platform was characterized previously by Alaux et al. (2009a) and consists of 13,440 oligonucleotide probes based primarily on the Apis mellifera genome sequence v4.0 (Honeybee Genome Sequencing Consortium, 2006). Prior to hybridization, 2 μg of each sample were labeled with a Cy3 or a Cy5 dye using the ULS aRNA labeling system (Kreatech Diagnostics). An aliquot of 60 pmol of each labeled sample were hybridized onto each microarray. Hybridization was carried out overnight using the MAUI Hybridization System (BioMicro Systems Inc). Two samples labeled with different dyes were hybridized onto each microarray following a loop design that maximized the number of direct comparisons between contrasts of interest (Figure S2). In total, we hybridized 32 samples, 8 per behavioral group and colony. Microarray slides were scanned with an Axon 4000B Microarray Scanner (Molecular Devices) and analyzed with GENEPIX Pro 6.0 software (Molecular Devices).

Microarray data analysis

Expression intensities were normalized with a Lowess transformation with BEEHIVE (http://stagbeetle.animal.uiuc.edu/beehive.html). A linear mixed-effects model that accounted for the effects of dye, treatment, colony and individual bee was used to analyze the log2-transformed fluorescent intensities for each gene. The results were evaluated with an F-test statistic and False Discovery Rate (FDR) corrected P-values. Array probes were updated to
the newest version of the *Apis mellifera* genome, Assembly 4.5 (Elsik et al., 2014), by mapping array probes using Bowtie 2.

During the course of our analyses, we observed that seven major royal jelly protein genes were differentially expressed in *PI* samples of nurses and foragers, with substantial log-fold change differences. These genes are differentially expressed, and at high levels, in the hypopharyngeal glands (HPG) that surround the brain. To minimize the possibility that our results were affected by small amounts of HPG tissue, we filtered gene lists with a set of 113 genes expressed at very high levels in the HPG, 2-fold higher than in the brain (Alaux et al., 2009a; Whitfield et al., 2003). A total of 4 “HPG genes” were filtered from nurse-forager gene list (FDR<0.1), 22 “HPG genes” were filtered from JHA (FDR<0.1), while none were filtered from the diet gene list (FDR<0.1). Expression of a few major royal jelly protein genes have been found in the mushroom bodies of the bee brain (Peixoto et al., 2009), so it is possible that some of these genes were actually also expressed in various parts of the brain, but without further validation we cannot determine if these genes were expressed in the *PI* or the HPG. Because the number of genes is relatively small compared to the 13,774 total analyzed here, we chose this conservative approach.

**cDNA libraries and RNA-sequencing**

Gene expression profiles for *PI* samples from JHA and diet-treated bees were generated using RNA-sequencing (RNA-seq). cDNA libraries from each *PI* sample were generated from 400 ng of aRNA with the TruSeq RNA Sample Preparation Kit (Illumina). Library concentrations were quantified using Qubit fluorometric quantitation and quantitative real-time PCR (qPCR) using Kapa Library Quant kits (KapaBiosystems). Average fragment size and overall quality were evaluated with the Agilent 2100 Bioanalyzer platform and an Agilent High Sensitivity DNA kit. For sequencing, all libraries were diluted to a 10nM concentration. We sequenced a total of 32 samples (8 samples per treatment group, 4 from each colony replicate). Eight samples were sequenced per lane, with 2 samples from each treatment group per lane. cDNA libraries were sequenced as single-end, 100 nt reads, using an Illumina HiSeq2000.

**RNA-seq data analysis**

RNA-seq generated an average of 23,833,961 reads per cDNA library. Reads from each library were aligned to the *Apis mellifera* genome, Assembly 4.5 (Elsik et al., 2014) using Tophat (Trapnell et al., 2009). Approximately 80% of reads within each library mapped to
the honey bee genome. Aligned read counts for each gene were counted using the program HTSeq v0.5pv2 (http://www-huber.embl.de/users/anders/HTSeq) and the *Apis mellifera* official gene set, v3.2. Reads that did not map uniquely or that mapped to genomic locations outside genes were not included in subsequent analyses for differential expression. Differential expression was assessed using a negative binomial model with count data normalized by library size and library composition. Dispersion estimates for each individual gene were used to calculate differential expression. The model tested for the main effects of JHA treatment and diet, and an interaction between these two factors. Significance for these main effects was assessed using FDR corrected *P*-values (FDR<0.1). *P*-values (*P*<0.001) were used to test significance for pairwise contrasts to assess whether genes were significant due to JHA treatment, diet or the interaction between these to factors.

**Gene Ontology enrichment analyses**

Functional inferences for microarray and RNA-seq data sets were drawn using Gene Ontology (GO) enrichment analyses using DAVID Bioinformatic Resources Functional Annotation tool (Dennis et al., 2003). We tested for enrichment of terms in the functional categories: Biological Processes (BP), Molecular Function (MF) and Cellular Component (CC), and used the GO category, GO FAT to filter out the broadest GO terms. We also examined GO terms annotated using InterPro and KEGG pathways. GO analyses were accomplished with the *Drosophila melanogaster* orthologs associated with each gene list. Significant enrichment was determined using a modified Fisher’s exact test that used the number of honey bee genes with annotated *Drosophila* orthologs as a background.

**Bioinformatic analysis of transcription factors and enrichment of transcription factor regulatory motifs**

To identify transcription factors that were differentially expressed in our experiments, we drew upon a comprehensive list of transcription factors that was compiled previously (Chandrasekaran et al., 2011). Because few transcription factors have been experimentally validated in the honey bee, this transcription factor list (256 transcription factor, total) included robust orthologs of transcription factors experimentally characterized in *Drosophila melanogaster* for which there is little or no critical residue changes between the honey bee gene and the *Drosophila melanogaster* ortholog (Kim et al., 2010). We updated this list with information from the latest *Apis mellifera* official gene set (v3.2)(Elsik et al., 2014).
To determine whether our lists of differentially expressed genes (DEGs) suggest the involvement of specific transcription factors as regulators, we determined whether our lists were enriched for particular cis regulatory motifs, using the Motif Enrichment Tool (http://veda.cs.uiuc.edu/regSetFinder/interface_help.html). This bioinformatic tool predicts transcription factor regulators by finding significantly associated sets of genes that share a transcription factor motif in their promoter regions (Ament et al., 2012a). Genes thus targeted by a transcription factor motif were determined for the Apis mellifera genome (v4.5) using the official gene set (v3.2) following methods similar to Alaux et al. (2009b). We analyzed 5 kbp of sequence upstream of each gene’s transcriptional start site. We tested for significant associations between sets of significantly upregulated gene sets and specific cis regulatory motifs with a Fisher’s exact test and an FDR correction, controlling for differences in GC content in the promoter regions (Sinha et al., 2006). To test whether cis motifs were significantly associated across multiple gene lists, we followed the methods in Alaux et al. (2009b). We calculated a combined P value using the FDR-corrected P values associated with motifs and upregulated gene sets using the following formula:

\[ P_c = 1 - \prod_{i=1}^{n} (1 - P_i) \]

We looked for significant cis motifs (raw P<0.05) that occurred on different gene lists and calculated the combined P-value for each motif.
RESULTS

Gene expression differences associated with behavioral maturation in the PI

Microarray profiling of the PI revealed extensive differences in PI gene expression between nurses and foragers (2,663 genes, ANOVA, FDR<0.1). The magnitude of the gene expression differences in the PI is in the same range as previously reported for whole brain microarray comparisons of nurses and foragers (Alaux et al., 2009a). Moreover, 22% (589 genes) of the genes differentially expressed between nurses and foragers in the PI also were differentially expressed in the whole brain (Figure 2A). Correlation analysis of the log-fold changes of genes overlapping between the whole brain (Alaux et al., 2009a) and the present dataset revealed that the majority of genes were concordant in their direction of change (Figure 2B).

Gene Ontology (GO) enrichment analyses showed that the list of transcripts differentially expressed in the PI of nurses and foragers was enriched for terms related to energy metabolism and protein turnover (Table S1). Genes upregulated in foragers were related to Detection of Light Stimulus and Oxidative Phosphorylation, while genes upregulated in nurses were related to Ribosome and Translation. Genes differentially expressed between nurses and foragers in both the PI and the whole brain were related to Translation, Mitochondrial Processes and Branched Amino Acid Degradation (Figure 2A, Table S2). Genes only differentially expressed in the PI were related to Response to Radiation, Translation Factor Activity, Mitochondrial Envelope and Amine Transport while genes only differentially expressed in whole brain were related to Glycoprotein Biosynthesis (Figure 2A, Table S2).

A finer-grained analysis, using genes differentially expressed in both the PI and the whole brain and with directionally concordant log-fold changes (323 genes), showed enrichment for terms related to protein turnover (Ribosome, 28 genes, Benjamini = 2.39E-19). GO terms related to energy metabolism were not enriched in the concordant gene set because the relevant genes were regulated in the opposite direction in whole brain (downregulated in foragers) compared to the PI (upregulated in foragers).

As the PI contains neurosecretory cells, we expected to detect differentially expressed neuropeptide genes that had been undetected in prior whole brain microarray analyses. We found a total of 10 differentially expressed neuropeptide genes in the PI of nurse and forager bees (Figure 2C); four of these genes were not detected in whole brain. Neuropeptide genes
that were only differentially expressed in the \textit{PI} encode \textit{neuropeptide F, orcokinin, sulfakinin} and \textit{tachykinin}. The neuropeptide genes that overlapped between both datasets showed similar upregulation in foragers in both the \textit{PI} and the whole brain, with the exception of \textit{adipokinetic hormone}, which was downregulated in forager whole brain and upregulated in forager \textit{PI}.

\textit{Effect of diet on gene expression in the PI}

RNA-seq results revealed that diet treatment did not influence gene expression in the \textit{PI} (1 differentially expressed gene, FDR<0.1, Table 1). Pairwise comparisons of diet-treated bees showed a total of 62 and 73 differentially expressed genes (P<0.001) for bees that received no pollen vs. high pollen diets (Ctrl P- vs. Ctrl P+) and for bees that received the same diet treatments and were also treated with JHA (JHA P- vs. JHA P+) (Table 1). Due to the relatively low numbers of differentially expressed genes in each of these gene lists, GO functional enrichment analyses performed for diet pairwise comparisons only yielded significant enrichment for the JHA P- vs. JHA P+ comparison; this pairwise contrast was enriched for GO terms related to cytochrome P450 expression (Table S3).

Diet treatment influenced the expression of 3 neuropeptide genes, including \textit{corazonin} (GB53951), \textit{LRNQLDIGDLQ-containing} (GB43119) and \textit{NVPIYQEPRF-containing} (GB44988). \textit{Corazonin} and \textit{LRNQLDIGDLQ-containing} were upregulated in response to high pollen diet in bees treated with JHA (JHA P- vs. JHA P+), while \textit{NVPIYQEPRF-containing} was upregulated by a high pollen diet in the Ctrl P- vs. Ctrl P+ contrast.

\textit{Effect of JHA treatment on gene expression in the PI}

By contrast to the diet treatment, JHA treatment caused changes in hundreds of genes in the \textit{PI} (365 differentially expressed genes, FDR<0.1). Pairwise comparisons for hormone-treated bees showed 110-359 differentially expressed genes (P<0.001) in the \textit{PI}, depending on the contrast (Table 1). Significantly enriched GO terms for hormonally induced differential gene expression were related to Oxidation Reduction and Protein Folding (Heat Shock Proteins) for the JHA*P- vs. Ctrl P- contrast and Translation (Ribosome) and Epidermal Growth Factor Domain for the JHA*P- vs. Ctrl P+ and JHA*P+ vs. Ctrl P- contrasts (Table S3).

JHA treatment influenced the expression of the same neuropeptide genes that were regulated by diet manipulations. Similar to diet comparisons, \textit{corazonin} was upregulated in bees that
received JHA treatment and a high-protein diet (JHA\textsuperscript{+} P\textsuperscript{+} vs. Ctrl P\textsuperscript{+} and JHA\textsuperscript{+} P\textsuperscript{+} vs. Ctrl P\textsuperscript{−}), while \textit{LRNQLDIGDLQ}-containing and \textit{NVPIYQEPRF}-containing were upregulated in Ctrl P\textsuperscript{+} compared to JHA\textsuperscript{−} P\textsuperscript{−} bees. \textit{NVPIYQEPRF}-containing gene was also differentially expressed in the \textit{PI} of nurse and foragers but was upregulated in foragers relative to nurses (even though nurses have a diet richer in protein than foragers).

\textit{Regulatory changes associated with behavioral maturation and the PI}

To determine whether there were diet and hormonally induced gene expression changes that were generally consistent with behavioral maturation in the \textit{PI}, we compared the nurse vs. forager DEG list with the list from each diet x treatment combination. The DEG list from each pairwise comparison showed 27-49\% overlap with the nurse-forager list (Figure 3A). For these genes, we tested whether the degree and direction of differential expression (using log-fold change) was significantly correlated with the results from the nurse-forager comparison. A significant positive correlation would suggest that the diet or JHA treatments led to gene expression patterns that resemble those observed as a result of behavioral maturation. There were no significant correlations between the nurse-forager and diet comparisons (Figure 3B). By contrast, there were significant correlations between the nurse–forager and JHA treatment comparisons, in the expected direction. For example, the ortholog of the cytochrome P450 gene, \textit{Cyp4g1}, was upregulated in foragers compared to nurses and upregulated by JHA treatment in the JHA\textsuperscript{+}P\textsuperscript{−} vs. Ctrl P\textsuperscript{−} contrast.

Given the known causal relationship between JH and behavioral maturation in honey bees (Sullivan et al., 2000), these results suggested that differences in endogenous JH levels could be driving the nurse-forager differences we detected in the \textit{PI}. If this is the case, we would expect that these shared gene expression changes were elicited by similar gene regulatory changes. To begin to explore this, we first looked for transcription factors (orthologs of transcription factors in \textit{Drosophila melanogaster}) that were differentially expressed in the \textit{PI} of nurses vs. foragers and as a function of JHA treatment. We found a total of 82 differentially expressed transcription factors in the \textit{PI} of nurses and foragers (Table S4). These included \textit{ftz-f1}, \textit{fruitless}, \textit{Xpb1}, \textit{Creb}, \textit{Deaf1}, and \textit{NFκB}; all of which have been proposed as major regulators of honey bee behavioral maturation (Chandrasekaran et al., 2011). Seven transcription factors were differentially expressed in JHA pairwise contrasts, and of these 2 overlapped with the \textit{PI} nurse vs. forager data set (GB50553, GB55635, Table
The JH-related transcription factor kr-h1 was differentially expressed in two of the JHA pairwise contrasts but was not differentially expressed in the PI nurse vs. forager dataset.

Next, we performed transcription factor motif analyses to indirectly identify transcription factors contributing to the observed differential gene expression. Genes upregulated in the PI of nurse bees were significantly enriched (FDR<0.1) for 9 cis motifs (Table S6) including the cis motif for the JH-related transcription factor, usp. No transcription factor motifs were enriched for genes upregulated in the PI of forager bees. In diet x treatment comparisons, we found significant transcription factor motif enrichment for one gene list: genes upregulated by JHA treatment in the JHA+P vs. Ctrl P- comparison were enriched for 4 cis motifs, including the motif for NFkB and the NFkB-related heterodimers, DIF and relish (Table S7).

To compare across nurse vs. forager and diet x JHA experiments, we identified transcription factor motifs (P<0.05) that overlapped between experiments. We found 5 cis motifs associated with genes upregulated in nurses and genes upregulated in bees that were not treated with JHA (Ctrl bees) (Table 2). These were indicative of changes in endocrine signaling and included the heterodimer, NR1H2-RXRA, which contains an isoform of the vertebrate homolog of usp, RXR (Oro et al., 1990). Overlapping cis motifs for genes upregulated in foragers and JHA-treated bees indicate both of these gene lists were associated with NFkB and the heat shock factor, HSF.

Several transcription factors were differentially expressed between nurses and foragers and also showed motif enrichment among differentially expressed genes. These included fruitless, Deaf1, HLH54F, ATF-2 and NFkB, suggesting these may be regulators of changes in the PI related to behavioral maturation (Table S8). We used the transcription factor list from the nurse vs. forager experiment and looked for overlap with the JHA-based cis motif analyses. We found 3 transcription factors that met these criteria: Tkr, HLH54F and crc. All three were associated with genes upregulated by JHA treatment.
DISCUSSION

Our results reveal a robust molecular signature of honey bee behavioral maturation in the *pars intercerebralis*. Moreover, this signature appears to be strongly related to JH, a known regulator of honey bee behavioral maturation. These results support the hypothesis that interactions between the *PI* and JH signaling are involved in the regulation of behavioral maturation. This hypothesis should be tested in the future, by testing the effects of perturbations to *PI* gene expression on behavioral maturation. Such targeted manipulations are currently beyond the scope of what is available for honey bees, but the recent report of transgenic honey bees (Schulte et al., 2014), coupled with advances in genome editing (Doudna and Charpentier, 2014), promise new possibilities in the near future.

The molecular signature of behavioral maturation in the *PI* involves changes in protein turnover, heat shock protein genes, and GO terms related to energy metabolism. This suggests there is an increase in protein translation in the *PI* of nurses compared to foragers, something also inferred from whole brain analysis. However, many of the nurse-forager expression differences in the *PI* were not detected at the whole brain level, including differences in the neuropeptide gene *neuropeptide F*, whose expression has been shown to be restricted to cells in the *PI* in honey bees (Ament et al., 2011b) and involved in food searching and appetitive behaviors in vertebrates and invertebrates (Morton et al., 2006; Wu et al., 2003). Furthermore, gene expression differences related to energy metabolism were not directionally concordant between the *PI* and whole brain data sets. This result implicates regional differences in energy metabolism in the honey bee brain. It is possible that the smaller neuronal clusters, such as the *PI*, differ relative to the larger brain regions, which likely reflect the picture obtained with whole brain measures. Higher expression of energy metabolism genes in the *PI* of foragers fits with the previously reported involvement of insulin signaling in honey bee foraging (Ament et al., 2008; Ihle et al., 2014; Wang et al., 2010), and with our results showing that *insulin-like peptide 1* is upregulated in the *PI* of foragers. These results demonstrate that the *PI* has a distinct transcriptional profile that reflects its neurosecretory function.

Both transcriptomic results and transcription factor motif analyses support the hypothesis that interactions between the *PI* and JH signaling are involved in the regulation of behavioral maturation in honey bees. Maturational and JH-related transcriptomic changes in the *PI* appear to be regulated by transcription factors already implicated in the regulation of
behavioral maturation (Ament et al., 2012b; Chandrasekaran et al., 2011) including NFkβ and usp. If the PI is involved in the regulation of division of labor as suggested here, it may do so through the action of these transcription factors. With regards to NFkβ, our results suggest that this transcription factor may play a similar role in honey bees as it does in the hypothalamus of vertebrates where it is linked to changes in nutritional physiology and insulin-signaling (Kaltschmidt and Kaltschmidt, 2009). In addition, neuronal circuits in the hypothalamus are central to sleep regulation in vertebrates and NFkβ expressing cells in the hypothalamus are important to this process (Brandt et al., 2004). There is evidence that in the honey bee PI, protein synthesis follows a circadian rhythm (Vogel et al., 1977). Thus, it would be interesting for future research to investigate whether NFkβ and other transcription factors expressed in the PI mediate the metabolic and behavioral changes related to sleep in honey bees (Eban-Rothschild and Bloch, 2008) as it does in other insects (Foltenyi et al., 2007).

The vertebrate homolog of usp, RXR, is also known as a regulator of metabolism and nutritional physiology (Keller et al., 1993). In insects, usp is linked to JH-signaling (Hiruma et al., 1999; Jones and Sharp, 1997). In honey bees, usp has been shown to be expressed in the mushroom bodies of the honey bee brain (Velarde et al., 2006) and to influence maturation-related transcriptional networks that regulate behavior (Ament et al., 2012b; Sinha et al., 2006; Wang et al., 2012). Our results provide evidence that usp is involved in regulating transcriptional changes in a brain region that is structurally and functionally proximal to the corpora allata and JH production, a finding that is consistent with the idea that there is a feed forward endocrine loop that regulates foraging behavior in honey bees (Amdam and Omholt, 2003).

There were thousands of genes differentially expressed in the PI of nurses and foragers and hundreds in the PI of JHA-treated bees. One possible explanation for the difference in numbers is that JH regulates some, but not all, of the physiological and neurobiological changes that occur during honey bee behavioral maturation. Another possibility may be related to technology differences between the two experiments: the nurse-forager profiles were generated using microarrays, while JHA-treated bees were profiled using RNA-seq. There are many differences between these two technologies, one of which is that RNA-seq has greater dynamic range compared to microarrays (Ozsolak and Milos, 2011), making RNA-seq a more sensitive technology, but possibly more susceptible to within-group
variation. These technological differences may be related to our lack of an overlapping set of neuropeptide genes between the PI nurse-forager gene list and the gene lists associated with JHA treatment (with the exception of NVPIYQEPRF-containing). Given that insulin-like peptide 1 was differentially expressed in PI of nurses and foragers and that both neuropeptide F and insulin-like peptide 1 have been shown to be responsive to diet and JHA treatment in honey bees (respectively) (Ament et al., 2011a; Corona et al., 2007), we believe our RNA-seq analysis may have lacked sufficient sensitivity or statistical power. Nevertheless, our RNA-seq experiments do show the neuropeptide genes, corazonin, NVPIYQEPRF-containing, LRNQLDIGDLQ-containing were differentially expressed in the PI of JH-treated bees. These neuropeptides have been localized to the corpora cardiaca and corpora allata (Boerjan et al., 2010) indicating these neuropeptides may act as neurohormones in honey bees. In addition, our analyses were able to detect a robust overlapping signal between the behavioral maturation and JHA experiments, for both differentially expressed genes in general and transcription factor motifs.

A surprising aspect of these results is that there is limited evidence to support our hypothesis that the PI is responsive to dietary changes related to behavioral maturation. Effects of JHA treatment were much stronger than dietary manipulation. We believe the JHA dosage produced results that were physiologically relevant, for two reasons. First, as described above, this treatment caused differences in PI gene expression that were similar to the nurse-forager PI gene expression differences. Second, the same result was obtained for whole brain analyses (Whitfield et al., 2006). By contrast, dietary manipulations had little impact on PI gene expression and did not elicit changes consistent with behavioral maturation. One possible explanation is that age has strong effects on brain gene expression in honey bees (Whitfield et al., 2006) and the bees in the diet experiment were the same age. Nevertheless, this result is still surprising because the PI is known to integrate nutritional changes in other insects (Rajan and Perrimon, 2012) and in honey bees there is a switch from a high protein diet to a low protein diet prior to foraging onset (Crailsheim et al., 1992). There were also differences in gene expression measurement technology between these two experiments; however, this explanation is unlikely because, as noted above, there were substantial overlapping results between the nurse-forager and JHA experiments, across the same two analytical platforms. Another possibility is that there are differences in the endocrine responsiveness of the PI in pollen foragers compared to nectar foragers, given that there are known physiological and molecular differences between these two groups (Amdam et al.,
It would be interesting to compare the responsiveness of nectar and pollen foragers in the future, perhaps using the well-known selected lines of pollen and nectar foragers, where the specializations are likely more extreme than in our group of foragers. For the present, we present a verbal model that suggests that these results reflect an evolved attenuation of the relationship between diet and nutritional physiology, as follows.

We propose that adult worker honey bees have evolved an attenuation of the traditional relationship between diet and nutritional physiology, and instead have evolved a relationship between social factors and nutritional physiology (Figure 4). The strongest effects linking nutrition to foraging onset in honey bees have come from starvation experiments (Schulz et al., 1998; Toth et al., 2005). These studies have shown that a depletion of a colony’s food stores induces early foraging; however, depriving colonies of just pollen does not elicit these same effects (Toth et al., 2005). These results indicate that more moderate diet changes are not causal to foraging onset. Recent transcriptomic studies on the brain and peripheral tissues are consistent with our hypothesis by showing that diet did not elicit gene expression changes consistent with behavioral maturation (Ament et al., 2011a; Wheeler et al., 2013). According to our hypothesis, molecular and behavioral effects of experimental depletion of abdominal lipids and peripheral (not brain) RNAi knockdown of the lipid storage protein, vitellogenin (Nunes et al., 2013; Wheeler et al., 2013), relate to the fact that these physiological factors are modulated by social signals. The expression of vitellogenin, for example, is regulated by queen mandibular pheromone (QMP) (Fischer and Grozinger, 2008) and brood pheromone BP (Smedal et al., 2009). Moreover, recent transcriptomic studies show that unlike diet, both QMP and BP affect brain gene expression in a manner consistent with behavioral maturation (Alaux et al., 2009a; Grozinger et al., 2003). Together these findings suggest that pheromones are the primary extrinsic regulators of behavioral maturation.

The connection between pheromones and nutritional physiology is likely JH-mediated because QMP has been shown to modulate JH levels (Pankiw et al., 1998) and because JH has co-regulatory interactions with vitellogenin (Guidugli et al., 2005; Pinto et al., 2000). One additional possibility is that social factors mediate nutritional physiology through interactions with the corpora allata, followed by the PI. Our results provide indirect evidence for this idea by demonstrating that maturation-related changes are present in the PI, but these
maturational changes are not regulated by variation in diet, or at least the variations that we tested. Future work should test these connections directly, and if confirmed the results would further suggest that neuroendocrine systems in honey bees have evolved to regulate worker division of labor by becoming less sensitive to dietary inputs and more sensitive to social factors tied to colony-level needs.
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REFERENCES:


Figure 1: Stained section of the honey bee brain before and after laser capture microdissection. Frozen stained section of the honey bee brain depicting microdissection of cells in the pars intercerebralis. Cells were collected along the midline for sections anterior to the central body.
Figure 2: Comparison of results from microarray analyses of nurse vs. forager *pars intercerebralis* (PI) (n=16 for each behavioral group) and previously published nurse vs. forager whole brain (Alaux et al., 2009a). (A) Venn diagram showing significant Gene Ontology terms (Fisher’s exact test, $P \leq 0.001$) enriched from the lists of overlapping (589 genes) and non-overlapping DEGs (PI: 2074 genes). (B) Pearson correlations of log-fold changes of differentially expressed genes that overlapped between whole brain and PI microarray results. (C) Heat map for differentially expressed neuropeptide genes in whole brain (WB) and PI. Yellow indicates neuropeptide genes that are significantly upregulated in foragers, blue upregulated in nurses.
Figure 3: Overlap and correlation analyses for genes differentially expressed in the *pars intercerebralis* of nurses and foragers (n=16 for each behavioral group) and as a function of diet and/or JH analog (JHA) treatments (n=8 for each diet x treatment combination). (A) Number of genes overlapping in various pairwise comparisons. (B) Pearson’s correlation coefficients for genes in Panel A. Numbers represent the correlation coefficients that were significant (*P*<0.05). Yellow = positive correlation; Blue = negative correlation. JHA+ = JHA treatment; Ctrl = acetone treatment, P+ = high protein diet; P− = diet with no protein.
Figure 4: Verbal model for effects of diet, social factors and juvenile hormone on nutritional physiology and behavioral maturation in honey bees. (A) Previous understanding of the relationships between diet and nutritional physiology and between social factors and nutritional physiology (modified from Ament et al. 2011). (B) New model, which proposes weaker role for diet, stronger role for social factors and a possible interaction between PI and JH signaling in the corpora allata. Social = pheromonal cues; JH = juvenile hormone; PI = pars intercerebralis.
Table 1. Number of differentially expressed genes due to diet and juvenile hormone analog manipulations.

<table>
<thead>
<tr>
<th>Comparison</th>
<th>( P &lt; 0.001 )</th>
<th>Treatment</th>
<th>Diet</th>
<th>Interaction</th>
</tr>
</thead>
<tbody>
<tr>
<td>Overall effect (FDR&lt;0.1)</td>
<td>-</td>
<td>365</td>
<td>1</td>
<td>17</td>
</tr>
<tr>
<td>Ctrl P- vs. Ctrl P+</td>
<td>62</td>
<td>16</td>
<td>0</td>
<td>9</td>
</tr>
<tr>
<td>JHA+P- vs. JHA+P+</td>
<td>73</td>
<td>11</td>
<td>1</td>
<td>10</td>
</tr>
<tr>
<td>JHA+P- vs. Ctrl P-</td>
<td>110</td>
<td>75</td>
<td>1</td>
<td>5</td>
</tr>
<tr>
<td>JHA+P+ vs. Ctrl P+</td>
<td>359</td>
<td>199</td>
<td>1</td>
<td>14</td>
</tr>
<tr>
<td>JHA+P+ vs. Ctrl P-</td>
<td>141</td>
<td>104</td>
<td>1</td>
<td>2</td>
</tr>
<tr>
<td>JHA+P- vs. Ctrl P+</td>
<td>163</td>
<td>132</td>
<td>1</td>
<td>2</td>
</tr>
</tbody>
</table>

JHA\(^+\) = JHA treatment; Ctrl = acetone treatment; P\(^+\) = high protein diet; P\(^-\) = diet with no protein; \( n=8 \) for each diet x treatment combination.
Table 2. cis regulatory motifs and corresponding transcription factors common to *pars intercerebralis* DEG lists from Nurse vs. Forager and Control (Ctrl) vs. juvenile hormone analog (JHA) experiments

<table>
<thead>
<tr>
<th>Motif</th>
<th>Transcription Factor</th>
<th>Nurses</th>
<th>Ctrl</th>
<th>Pc</th>
</tr>
</thead>
<tbody>
<tr>
<td>NR1H2_RXRA</td>
<td>NR1H2 &amp; RXRA</td>
<td>0.027</td>
<td>0.003</td>
<td>0.031</td>
</tr>
<tr>
<td>tap_da_SOLEXA_5</td>
<td>tap &amp; da</td>
<td>0.010</td>
<td>0.021</td>
<td>0.031</td>
</tr>
<tr>
<td>V_AP1_Q4</td>
<td>AP1</td>
<td>0.007</td>
<td>0.045</td>
<td>0.052</td>
</tr>
<tr>
<td>ESR2</td>
<td>ESR2</td>
<td>0.037</td>
<td>0.021</td>
<td>0.057</td>
</tr>
<tr>
<td>V_HOX13_01</td>
<td>HOX13</td>
<td>0.027</td>
<td>0.033</td>
<td>0.059</td>
</tr>
</tbody>
</table>

<table>
<thead>
<tr>
<th>Motif</th>
<th>Transcription Factor</th>
<th>Forager</th>
<th>JHA</th>
<th>Pc</th>
</tr>
</thead>
<tbody>
<tr>
<td>Hsf_compiled</td>
<td>HSF</td>
<td>0.005</td>
<td>0.005</td>
<td>0.010</td>
</tr>
<tr>
<td>V_NFKAPPAB50_01</td>
<td>NF-kappaβ</td>
<td>0.034</td>
<td>0.000</td>
<td>0.034</td>
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<tr>
<td>Fer1_SOLEXA_5</td>
<td>Fer1</td>
<td>0.044</td>
<td>0.017</td>
<td>0.060</td>
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<tr>
<td>gsb_SOLEXA</td>
<td>gsb</td>
<td>0.034</td>
<td>0.028</td>
<td>0.060</td>
</tr>
<tr>
<td>Nkx2-5</td>
<td>Nkx2</td>
<td>0.044</td>
<td>0.020</td>
<td>0.063</td>
</tr>
<tr>
<td>V_CAAT_C</td>
<td>CAAT</td>
<td>0.044</td>
<td>0.028</td>
<td>0.070</td>
</tr>
</tbody>
</table>

Numbers are *P*-values (Fisher’s exact test) that denote enrichment for genes that were upregulated in Nurses vs. Foragers (Nurses) and Ctrl vs. JHA (Crtl) and *vice versa* (upregulated in Forager and JHA, respectively). Significance for associations between experiments, in the expected direction, is denoted by a combined *P* value, *Pc*.