# Alternative splicing associated with phenotypic plasticity in the bumble bee $Bombus\ terrestris$

J. Price <sup>1</sup>, M.C. Harrison <sup>2</sup>, R.L. Hammond <sup>3</sup>, S. Adams <sup>1</sup>, J.F. Gutierrez-Marcos <sup>1</sup> & E.B. Mallon  $^{3^*}$ 

School of Life Sciences
 Gibbet Hill Campus
 University of Warwick
 Coventry, CV4 7AL
 United Kingdom

2) Institute for Evolution and Biodiversity
University of Münster
Hüfferstraße 1
48149 Münster
Germany

3) Department of Genetics and Genome Biology University of Leicester
University Road
Leicester, LE1 7RH
Phone: ++ (0)116 252 3488
Fax: +44 (0)116 252 3330
E-mail: ebm3@le.ac.uk

# Keywords: worker, queen, isoform, eusociality, transcriptomics, reproductive division of labour

Running title: "Alternative splicing in the bumble bee."

#### Abstract

Phenotypic plasticity is when one genome can produce more than one phenotype. The caste system found in many social insects is an important example of plasticity. Several studies have examined gene expression in social insect developmental and caste differences. Changes in gene expression, however, are not the only source of phenotypic plasticity. Here we investigate the role of alternative splicing in the buff tailed bumble bee *Bombus terrestris*. We found that 5458 genes in *Bombus terrestris* (40%) express more than one isoform. Larvae have the lowest level of splicing events, followed by adults and then pupae. We found that when an isoform is expressed in a given caste in the larval stage, it tends to be expressed in all castes at the larval stage. The same is true at the pupal stage. However, we see more complicated interactions between the adult castes with reproductive females showing different isoform expression compared to non-reproductive females and male adults showing the most distinct patterns. We found 455 isoform switching genes, that is genes, where one developmental stage, sex or caste uses a specific isoform and another type uses a different isoform. Among genes displaying isoform switching are some involved in the ecdysteriod pathway, an important system in insect behaviour.

#### 1 Introduction

A fundamental aim of evolutionary biology is to understand the link between genotype, phenotype and
fitness (de Visser and Krug, 2014). A powerful way to understand this is to investigate how a single
genome can give rise to multiple phenotypes. This question can be approached at the cellular level, for
example, how a single genome can make both a skin cell and a blood cell, but also at the societal level,
for example, how a single genome can make both the queen and worker castes in a eusocial insect colony.
Indeed, recent models suggest that these different levels could even be functionally similar (Patalano
et al., 2012).

In eusocial insect colonies, this differentiation between castes is fundamental, with queens carrying a out most of the reproduction while workers carry out other tasks required of the colony e.g. brood 10 care, foraging and nest maintenance. Queens are also generally bigger, live longer and have a host of 11 behavioural and physiological specialisations compared to workers. These distinct morphological and 12 behavioural castes are usually alternative expressions of the same genome. We previously found that the 13 main difference in gene expression, in the buff-tailed bumble bee *Bombus terrestris*, was between castes at 14 the adult stage rather than at larval or pupal stages (Harrison et al., 2015). A striking difference between 15 B. terrestris and higher eusocial hymenopterans is that reproductive worker bees have gene expression 16 profiles much more similar to queens than to their non-reproductive sister workers (Harrison et al., 2015). 17 Changes in gene expression are not the only way a single genome can give rise to multiple phenotypes. 18 For example, the difference between head lice (harmless) and body lice, (disease vector) is caused by the 19 alternative splicing of an identical genome not by differential gene expression (Tovar-Corona et al., 2015). 20 Alternative splicing results in a single gene coding for multiple processed messenger RNA (mRNA), 21 and potentially multiple proteins with distinct functions. Genome-wide analyses suggest alternative 22 splicing as a source of phenotypic variation in eusocial insects, where a single genome must encode for 23 numerous castes (honeybees (Foret et al., 2012; Li-Byarlay et al., 2013), possibly ants (Bonasio et al., 24 2012) and termites (Terrapon et al., 2014)). Bumble bees, as well as being one of the most ecologically and 25 economically important pollinators (Woodard et al., 2015), are an interesting taxon to study the role of 26 alternative splicing in eusociality as they possess both highly eusocial and more primitive characteristics 27 (Harrison *et al.*, 2015). 28

The diversity of forms and behaviours within a eusocial insect species is much greater than that found within solitary insect species. Yet eusocial insects have gene numbers within the range for solitary insects (Simola *et al.*, 2013). Tovar-Corona *et al.* 2015 recently found the rate of alternative splicing in eight arthropod species ranging from 23% to 44%. Do bumble bees use alternative splicing more than other studied, non-social insects, in order to increase phenotypic diversity?

Here, using RNA-seq, we ask how alternative splicing is associated with caste, sex and development 34 within the buff-tailed bumble bee, Bombus terrestris. We compare splicing patterns of larval (male 35 versus workers), pupal (male versus workers) and adult (male versus non-reproductive worker versus 36 reproductive worker versus queen) stages. Using the results of this analysis we answer a number of 37 questions. Do bumble bees have increased rates of alternative splicing compared to studied non-social 38 insects? Do splicing patterns follow those of gene expression with relatively fewer differences between 39 juvenile stages compared to adults? Are reproductive workers' splicing patterns more similar to queens' 40 or non-reproductive workers'? Do different castes, sexes or developmental stages use different isoforms 41 of the same genes? 42

#### 43 Methods

#### <sup>44</sup> Colony sampling, RNA libraries and sequencing

Data for this study were obtained from Harrison et al. (2015). Reads were downloaded from the ENA 45 under accession no. PRJEB9366. This contained a total of 469.3 million reads from 27 libraries. These 46 libraries are made up of larval, pupal and adults stages of males, queens, workers (reproductive and 47 non-reproductive). Whole bodies were used for sampling for two reasons. First, we had no prior assumptions regarding the tissues, within which genes would be alternatively spliced between castes, sexs 49 and developmental stages. Second, this would allow us to detect as many alternatively spliced genes as 50 possible across all comparisons. Most sample types are replicated over three colonies except for adult 51 nonreproductive workers (two colonies), reproductive workers (four colonies) and larval, pupal and virgin 52 queens (one colony). Sample production is described fully by Harrison et al. (2015). Due to the lack 53 of replicates, queen larvae, pupae and virgin queen were not analysed in our current alternative splicing 54 study. 55

## 56 Read processing and analysis

Raw reads were trimmed for adaptor sequence and low quality at the 5' and 3' end, and across a slid-57 ing window throughout the reads (PHRED >24) using Trimmomatic (v0.33) (Bolger et al., 2014), then 58 visualised using FastQC (v0.11.5). Reads were aligned to the Bter 1.0 genome (Refseq accession no. 59 GCF 000214255.1 (Sadd et al., 2015)) using Tophat (v2.1.0) (Trapnell et al., 2009), with an average 60 of 93.3% efficiency (82.8%-95.8%). After mapping, the protocol for the tuxedo package was followed 61 as outlined in Trapnell et al. (2012). In brief, cufflinks (v2.2.1) was performed on the alignments from 62 tophat, then cuffmerge (v1.0.0) was used to create a consensus transcriptome. Finally cuffdiff (v2.2.1)was used to quantify isoform expression and identify statistically significant changes in isoform expres-64 sion between the samples. For this study we have analysed isoforms at the CD level because they 65 represent a change in the protein translated. Further downstream analysis of these isoforms was then 66 performed in R 3.2.3 (core Team, 2016) using the cummeRbund (v2.16.0) package and custom R scripts 67 (https://dx.doi.org/10.6084/m9.figshare.3201355). rMATs (v3.2.5) was run with the alignments from 68 tophat to identify the types of alternative splicing present (Shen et al., 2014) 69

## <sup>70</sup> Isoform switching and Clustering

<sup>71</sup> Relative isoform contributions for each gene were tested for differences pairwise between the samples util-<sup>72</sup> ising the jensen-shannon divergence test implemented by the cuffdiff program (FDR < 0.01). Allometric

differences in the amount of tissue in different castes, sexes or reproductive status could produce signif-73 icant differences in isoform expression if judged solely on statistical testing. We therefore only consider 74 isoforms with at least a log2-fold change of one in order to reduce the false-positive effects of tissue scal-75 ing (Montgomery and Mank, 2016). To identify those genes that display biologically significant isoform 76 switching, the isoforms from significant genes identified by the jensen-shannon divergence test were sub-77 ject to K-means clustering (Hartigan and Wong, 1979) (k=30-150 step of 10, Iterations = 500) based on 78 their scaled relative abundance. The most distinct abundance patterns along with the fewest duplicated 79 clusters were found at K of 110. Each cluster was then plotted separately to visualize isoform expression. 80 As described by Aghamirzaie et al. 2015, clusters were then manually combined into super-clusters where 81 they had similar relative abundance patterns. 82

# <sup>83</sup> Gene ontology (GO) analysis

We extracted the nucleotide sequence for all isoforms found in each one of the chosen super-clusters and searched for any matching sequence on NCBI using BLASTx (Altschul *et al.*, 1990) with an E-value cutoff of 0.001. Using Blast2Go (Gotz *et al.*, 2008), we identified gene ontology (GO) terms associated with these loci. We carried out an enrichment analysis (Fisher exact test) using a custom R script (https://dx.doi.org/10.6084/m9.figshare.3201355.v1) on each of these lists of super-cluster associated GO terms. This identified GO terms that are overrepresented (FDR < 0.1) relative to the entire transcriptome (https://dx.doi.org/10.6084/m9.figshare.3458828.v1).

#### 91 Results

#### <sup>92</sup> Isoform, CD and gene level quantification

We measured expression level in terms of fragments per kilobase of exon per million reads mapped 93 (FPKM) of all isoforms present in published RNAseq libraries of several castes, sexes and developmental 94 stages of *Bombus terrestris* (Figure 1). After removing genes with FPKM < 1 in all libraries there are 13548 distinct loci with expression in at least one sample. Alternative splicing produces different mRNA (isoforms) from the same gene. A subset of these isoforms will differ in their conserved protein domains 97 (CD isoforms). At the isoform level, 8090 of the loci produce only one isoform, the remaining 5458 (40%) 98 genes express 22786 isoforms (FPKM > 0.5 in at least one library), averaging 4.2 isoforms per gene. At 99 the CD level 2833 (20.9%) show expression of more than one CD isoform in at least one sample, totalling 100 7726 CD isoforms (2.7 CD isoforms/gene). To avoid problems with assembly and annotation previously 101 well described in alternative splicing studies (Hiller et al., 2009; Jiang and Wong, 2009), we concentrated 102 on the 2833 genes expressing more than one CD isoform (see Table 1). 103

#### <sup>104</sup> CD isoform expression varies mainly between developmental stages, but also sex and caste

Expression (FPKM) for each of the 7726 CD isoforms is highly correlated between replicates of each biological type (mated queen, reproductive adult worker, non-reproductive adult worker, worker pupae, worker larvae, male adult, male pupae and male larvae) (Figure 1a) indicating that the patterns we observe here are of biological origin.

Principle component analysis of the 7726 CD isoform's expression (Figure 1b) shows that there is 109 variance in the expression of these isoforms which is associated primarily with developmental stage but 110 also sex and caste. PC1 principally describes variance in the isoform expression of different developmental 111 stages by separating adult and pupal replicates on the left and larval replicates on the right, this difference 112 explains 36% of the variance. PC2 is explained also by differences in developmental stages but this time 113 separating the pupae samples from the rest (22% variance). PC3 displays the variance that exists between 114 the sexes in the adult stages by dividing male adults and the female adult samples but also separating 115 the female adult samples (13% variance). 116

Alternative splicing events can come in different forms; exon skipping, mutually exclusive exons, alternative 5' splice junction, alternative 3' splice junction and intron retention (Black, 2003). The proportions of the splicing event forms stay relatively constant between samples with only a small increase in skipped exon splice events for non-reproductive workers (see Figure S1). We observed differences in the numbers of spliced genes and the number of isoforms expressed in our samples (Table 1). Male and

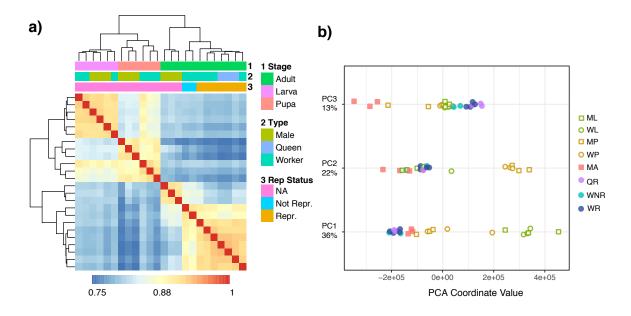


Figure 1: Global splicing analysis **a**. Correlogram of Pearson correlations of expression (FPKM) between replicates for the 7726 coding isoforms from multiple isoform loci. Clustering is produced based on Euclidean distances. This clustering separates replicates into stage, sex and reproductive status (coloured bars on top). **b**. A principal component analysis (PCA) of the 7726 isoforms from multiple isoform loci. QR = Queen Reproductive, WR = adult Worker Reproductive, WNR = adult Worker Non-Reproductive, WP = Worker Pupae, WL = Worker Larvae, MA = Male Adult, MP = Male Pupae, ML = Male Larvae.

Table 1: Total numbers of expressed features in the eight biological types examined

Feature	$\mathbf{QR}$	MA	ML	MP	WR	WNR	WL	WP
Genes	9954	10043	9685	10756	10249	10418	9762	9969
Genes With Multiple Isoforms	5233	5295	5226	5338	5282	5311	5250	5265
Isoforms from Genes with multi-	16210	16840	16048	16844	16909	17090	16071	16274
ple isoforms								
Genes with multiple CD isoforms	2792	2801	2760	2800	2812	2818	2772	2782
CD isoforms from genes with	6265	6326	6092	6349	6446	6472	6107	6208
multiple CD isoforms								

worker larvae have the lowest number of transcripts expressed in each category (genes, multiple isoform genes, multiple isoforms, multiple CD genes, multiple CD isoforms). The pupae shows a discrepancy between the sexes with the male pupae expressing more transcripts of each type than the worker pupae. Male pupae express the most genes and the most multiple isoform genes but adult workers (WR and WNR) express the most isoforms, multiple CD isoform genes and the most CD isoforms.

# <sup>127</sup> 455 genes with varied functions display significant isoform switching

The 2833 multiple isoform loci equate to the total amount of alternative splicing at the CD level observed in our samples but not all of these loci express different proportions of isoforms in different samples, that is, isoform switching. To find these loci, we tested the 2833 multiple isoform loci pairwise for differences in their relative isoform abundance between samples (FDR < 0.01). 455 genes, 16% of the multiple isoform loci (2833) display significant isoform switching between samples. These 1303 CD isoforms from 455 genes were analysed further to identify biologically significant isoform switching events.

We used K-means clustering to identify clusters of isoforms displaying similar expression patterns 134 across biological types. 297 (from 1303) were not clustered because they have small changes in their 135 relative abundance between samples (range < 0.2) and would be misrepresented when their isoform 136 abundance was scaled before clustering. K-means clustering (K = 110) of the 1006 remaining isoforms 137 achieved separation of most isoforms by their relative abundance (Figure S2). By manually combining 138 clusters with the same pattern of relative abundance (Figure 2) we identified 26 super-clusters that show 139 a high degree of sample-specific expression (658 isoforms). The remaining 348 isoforms showed cryptic 140 abundances and could not be assigned to a super-cluster, these isoforms are included in the variable cluster 141 (Figure 2). 22 of the 26 super-clusters form antagonistic pairs, where both super-clusters represent the 142 high and low abundance isoforms for that particular sample or group of samples. Most super-clusters 143 (491 isoforms) show preferential high or low expression in samples(s) from one developmental stage and 144 four clusters (167 isoforms) have preferential expression in samples from more than one developmental 145 stage. The majority of isoforms show adult sample(s) specific expression (374) with 105 for pupae and 146 76 for larvae (supplementary data: isoform cluster database). Of the 455 isoform switching genes; 328 147 have multiple isoforms in multiple super-clusters, 39 have isoforms solely in the variable cluster, 25 genes 148 have one or zero isoforms in a super-cluster and 63 are uncharacterised loci. From the 328 genes that 14 have multiple isoforms in multiple super-clusters 80 genes have their isoforms clustered in antagonistic 150 pairs. 151

For each super-cluster and groups of super-clusters relating to each developmental stage we tested 152 for enriched gene ontology (GO) terms against their background value in the transcriptome. No dis-153 crete cluster had significant enriched GO terms at the FDR < 0.1. However, twenty three GO terms 154 were associated with isoform switching genes found in adults (supplementary data: cluster\_GO\_terms). 155 Two of these, steroid hormone mediated signalling pathway (GO:0043401) and steroid hormone receptor 156 activity (GO0003707) relate to important functions in social insect biology. A number of isoform switch-157 ing genes are associated with these terms, including; ecdysone inducible protein 74EF (LOC100651988), 15 E75 (LOC100644185), E78 (LOC100646780), ecdysone receptor (LOC100646757) and farnysl pyrophos-159 photase synthase-like (LOC00165005). The majority of these genes differ in their isoform composition 160 between one or more adult sample. As an example of one of these genes, we show the expression, 161 exon map and protein domains for ecdysone inducible protein 75 (Figure 3). In this gene, transcript 162 variant X1 (XM 003398944.2) has high levels of expression especially for non-reproductive females com-163 pared to transcript variant X2 (XM 003398942.2) (see Figure 3b). Expression plots and exon maps 164

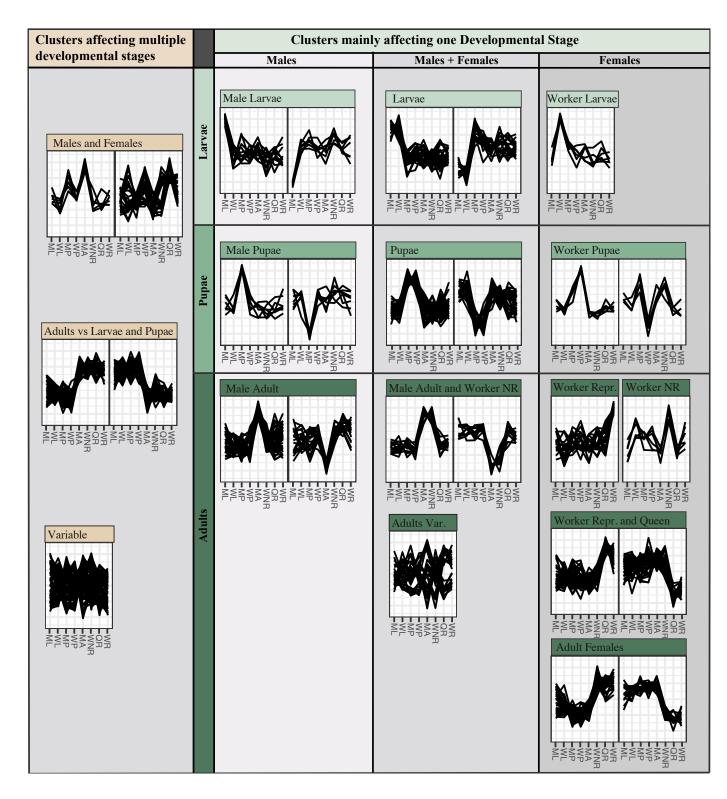
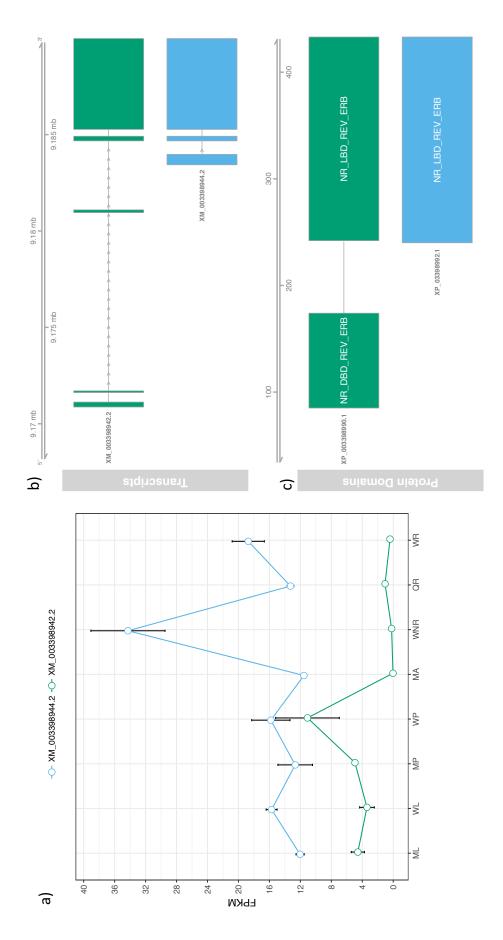


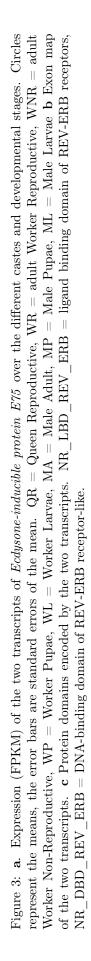
Figure 2: Super-clusters showing abundance patterns around particular biological sample types. Kmeans clustering for the 1006 isoforms from differentially spliced genes. Y-axis displays scaled relative abundance (-2 to 2). QR = Queen Reproductive, WR = adult Worker Reproductive, WNR = adult Worker Non-Reproductive, WP = Worker Pupae, WL = Worker Larvae, MA = Male Adult, MP = Male Pupae, ML = Male Larvae. The labels in the banners above figures identify the biological types in which the cluster is differentially expressed in. For example, Male Pupae (second column, second row) shows two clusters, one where there is a spike in expression in male pupae and one where there is a drop.

(10.6084/m9.figshare.5208940) are available in the supplementary data for all 455 isoform switching genes 165 along with a database containing their annotation (supplementary data: isoform\_cluster\_database), 166 their isoform's super-cluster membership (supplementary data: Clusters in super clusters) and GO terms 167 (supplementary data: cluster\_GO\_terms).

168

9





#### 169 Discussion

Alternative splicing is a way to increase the variety of proteins produced by a given number of genes. One 170 aim of this paper was to ask do bumble bees have increased rates of alternative splicing to account for the 171 increased phenotypic diversity within a eusocial insect species despite them having gene numbers within 172 the range for solitary insects (Simola et al., 2013). We observed 2833 genes that have expression of more 173 than one CD isoform in the samples examined. This corresponds to 20% (2833/13548) of the bumble 174 bee genes producing different proteins from the same genotype. To compare Bombus terrestris with 175 current literature we also looked at the number of genes that express more that one isoform regardless 176 of the protein produced (Tovar-Corona et al., 2015). Compared to the rate of alternative splicing in 177 eight arthropod species recently studied (23% to 44%) (Tovar-Corona et al., 2015), bumble bees' rate 178 of 40% is at the higher end. However this rate is equivalent to those of two other insects (Drosophila 179 melanogaster 42% and the pea aphid, Acyrthosiphon pisum 44%). Further work in other insects will be 180 needed to confirm this, but our data indicates that an increased rate of alternative splicing is not required 181 by bumble bees. 182

We then examined how the bumble bee uses these isoforms. We found four hundred and fifty five 183 genes express different proportions of isoforms in different samples, that is, isoform switching. We have 184 annotated and ranked these genes according to their super cluster membership, conserved domain changes 185 in their isoforms, GO terms and gene expression status, providing a rich resource for future studies in 186 this and related species. Patterns of alternative splicing follow those previously found for gene expression 187 (Harrison et al., 2015). This is not due to the effect of overall expression itself, as we only looked at 188 genes that have expression of at least two isoforms, removing almost 80% of the observed genes (13548) 18 2,833). Even still, within the 455 isoform switching genes, 45% also show gene expression changes. 190 This exemplifies how alternative splicing studies can both add to the knowledge of genes known to be 191 differentially expressed and also find novel source of plasticity that could not be found by only examining 192 gene level expression. 193

We found relatively little differentiation between the sexes at the larval stage when compared to 194 adult stages (see Figures 1 and 2). These findings suggest a comparatively low number of isoforms are 195 associated with the creation of distinct morphological sexes compared to the high number involved in 196 distinct behaviours between adult males and females. Reproductive workers show more similarity to 197 queens than to their fellow, but non-reproductive, workers (see horizontal dendrograms Figure 1a). We 198 have hypothesised that this is due to the plastic nature of bumble bee workers which allow them to 199 compete with the queen at the end of the annual colony cycle (Harrison et al., 2015). Male adults are 200 the most distinct group in terms of isoform expression (Figure 1), a finding that reflects their similarly 201

<sup>202</sup> distinct behaviour, physiology and life history.

No GO terms were found to be significantly associated with any of the super clusters. However, twenty three GO terms were associated with isoform switching genes found in adults. Two of these, steroid hormone mediated signalling pathway (GO:0043401) and steroid hormone receptor activity (GO0003707) relate to the ecdysteroid pathway, an important system in insect biology (Niwa and Niwa, 2016). Ecdysteriods are key compounds involved in ovary activation, regulating agonistic behaviour and establishing the dominance hierarchy in bumble bee workers and queens (Geva *et al.*, 2005).

In the results, as an example of an isoform switching gene, we expanded our analysis for one ecdysone 209 related gene (Ecdysone-inducible protein E75 (LOC100644185)). Ecdysone-inducible protein E75 is a 210 transcription factor in the ecdysone cascade (Li et al., 2015). Transcript variant X1 (XM 003398944.2) 211 has high levels of expression especially for non-reproductive females compared to transcript variant X2 212 (XM 003398942.2) (see Figure 3b). In Drosophila melanogaster, different isoforms of E75 have oppo-213 site roles in controlling female reproduction with, for example, DmE75A inducing apoptosis in the egg 214 chamber, while DmE75B inhibits DmE75A function allowing egg development (Terashima and Bownes, 215 2006). The difference between the transcripts is a number of exons encoding for binding domains of the 216 nuclear receptor REV-ERB (Figure 3c). REV-ERB receptors are transcriptional regulators belonging 217 to the nuclear receptor superfamily. They regulate a number of physiological functions including the 218 circadian rhythm, lipid metabolism, and cellular differentiation. The ligand binding domain (LBD) of 219 REV-ERB receptor-like, found in both isoforms, is responsible for coactivator interaction with steroid 220 hormones (Raghuram et al., 2007). The DNA-binding domain (DBD), found only in transcript variant 221 X2, interacts with specific DNA sites upstream of the target gene and modulates the rate of transcrip-222 tional initiation. This truncation of a binding domain is a very simple way for a gene to go from 223 being expressed specifically to a more global pattern of expression. We found this truncation in two 224 other genes we examined in depth, the CXXC zinc finger domain in Methylcytosine dioxygenase TET2 225 (LOC100642293 Figure S3) and the RNA recognition motif in Insulin-like growth factor 2 mRNA-binding 226 protein 1 (LOC100647990 Figure S4). Further study of our data set and others could test if this is a 227 common phenomenon. 228

We have shown that alternative splicing of genes is important for bumble bee biology. How is this alternative splicing is controlled? Alternative splicing in some social insect species has been shown to be affected by DNA methylation (Bonasio *et al.*, 2012; Foret *et al.*, 2012). Methylation has also been shown to play a role in social insect biology (Yan *et al.*, 2015) including bumble bee reproductive division of labour (Amarasinghe *et al.*, 2014). Together these observations suggest that a fruitful area of research for social insect biologists would be in understanding the role of methylation in controlling alternative splicing.

## 236 Acknowledgements

JP was supported by a a PhD research grant from the BBSRC. MCH was supported by a PhD research grant from the Natural Environment Research Council (NERC). EBM was supported by research grant NE/N010019/1 from the Natural Environment Research Council, UK. The raw data used in this study was funded by a NERC Biomolecular Analysis Facility research grant (NBAF 829). Illumina library preparation and sequencing were carried out by Edinburgh Genomics, The University of Edinburgh. Edinburgh Genomics is partly supported through core grants from NERC (R8/H10/56), MRC (MR/K001744/1) and BBSRC (BB/J004243/1).

#### 244 References

- Aghamirzaie, D., Batra, D., Heath, L. S., Schneider, A., Grene, R., and Collakova, E. 2015.
   Transcriptome-wide functional characterization reveals novel relationships among differentially expressed transcripts in developing soybean embryos. *BMC Genomics*, 16.
- Altschul, S., Gish, W., Miller, W., Myers, E., and Lipman, D. 1990. Basic local alignment search tool.
   Journal of Molecular Biology, 215(3): 403–410.
- Amarasinghe, H. E., Clayton, C. I., and Mallon, E. B. 2014. Methylation and worker reproduction in the bumble-bee (Bombus terrestris). *Proceedings of the Royal Society B: Biological Sciences*, 281(1780): 20132502.
- <sup>253</sup> Black, D. L. 2003. Mechanisms of Alternative Pre-Messenger RNA Splicing.
- Bolger, A. M., Lohse, M., and Usadel, B. 2014. Trimmomatic: a flexible trimmer for Illumina sequence
  data. *Bioinformatics*, 30(15): 2114–2120.
- Bonasio, R., Li, Q., Lian, J., Mutti, N. S., Jin, L., Zhao, H., Zhang, P., Wen, P., Xiang, H., Ding, Y.,
  Jin, Z., Shen, S. S., Wang, Z., Wang, W., Wang, J., Berger, S. L., Liebig, J., Zhang, G., and Reinberg,
  D. 2012. Genome-wide and Caste-Specific DNA Methylomes of the Ants Camponotus floridanus and
  Harpegnathos saltator. *Current Biology*, 22(19): 1755–1764.
- <sup>260</sup> core Team, R. 2016. R: A language and environment for statistical computing.
- de Visser, J. A. G. M. and Krug, J. 2014. Empirical fitness landscapes and the predictability of evolution.
   *Nature Reviews Genetics*, 15(7): 480–490.
- Foret, S., Kucharski, R., Pellegrini, M., Feng, S., Jacobsen, S. E., Robinson, G. E., and Maleszka, R.
  2012. DNA methylation dynamics, metabolic fluxes, gene splicing, and alternative phenotypes in honey
  bees. Proceedings of the National Academy of Sciences, 109(13): 4968–4973.
- Geva, S., Hartfelder, K., and Bloch, G. 2005. Reproductive division of labor, dominance, and ecdysteroid
  levels in hemolymph and ovary of the bumble bee Bombus terrestris. Journal of Insect Physiology,
  51(7): 811–823.
- Gotz, S., García-Gómez, J. M., Terol, J., Williams, T. D., Nagaraj, S. H., Nueda, M. J., Robles, M.,
  Talón, M., Dopazo, J., and Conesa, A. 2008. High-throughput functional annotation and data mining
  with the Blast2go suite. Nucleic Acids Research, 36(10): 3420–3435.
- Harrison, M. C., Hammond, R. L., and Mallon, E. B. 2015. Reproductive workers show queen-like gene expression in an intermediately eusocial insect, the buff-tailed bumble bee Bombus terrestris. *Molecular Ecology*, 24: 121–129.
- Hartigan, J. A. and Wong, M. A. 1979. Algorithm AS 136: A K-Means Clustering Algorithm. Journal of the Royal Statistical Society. Series C (Applied Statistics), 28(1): 100–108.
- Hiller, D., Jiang, H., Xu, W., and Wong, W. H. 2009. Identifiability of isoform deconvolution from junction arrays and RNA-Seq. *Bioinformatics (Oxford, England)*, 25(23): 3056–3059.
- Jiang, H. and Wong, W. H. 2009. Statistical inferences for isoform expression in RNA-Seq. *Bioinformatics* (Oxford, England), 25(8): 1026–1032.
- Li, K., Guo, E., Hossain, M. S., Li, Q., Cao, Y., Tian, L., Deng, X., and Li, S. 2015. Bombyx E75 isoforms
   display stage- and tissue-specific responses to 20-hydroxyecdysone. *Scientific Reports*, 5: 12114.
- Li-Byarlay, H., Li, Y., Stroud, H., Feng, S., Newman, T. C., Kaneda, M., Hou, K. K., Worley, K. C.,
  Elsik, C. G., Wickline, S. A., Jacobsen, S. E., Ma, J., and Robinson, G. E. 2013. RNA interference
  knockdown of DNA methyl-transferase 3 affects gene alternative splicing in the honey bee. *Proceedings*of the National Academy of Sciences, 110(31): 12750–12755.
- Montgomery, S. H. and Mank, J. E. 2016. Inferring regulatory change from gene expression: the con founding effects of tissue scaling. *Molecular Ecology*, 25(20): 5114–5128.

Niwa, Y. S. and Niwa, R. 2016. Transcriptional regulation of insect steroid hormone biosynthesis and its role in controlling timing of molting and metamorphosis. Development, Growth & Differentiation, 58(1): 94–105.

Patalano, S., Hore, T., Reik, W., and Sumner, S. 2012. Shifting behaviour: Epigenetic reprogramming
in eusocial insects. *Current Opinion in Cell Biology*, 24(3): 367–373.

Raghuram, S., Stayrook, K. R., Huang, P., Rogers, P. M., Nosie, A. K., McClure, D. B., Burris, L. L.,
Khorasanizadeh, S., Burris, T. P., and Rastinejad, F. 2007. Identification of heme as the ligand for the
orphan nuclear receptors REV-ERBalpha and REV-ERBbeta. *Nature Structural & Molecular Biology*,
14(12): 1207–1213.

Sadd, B. M., Barribeau, S. M., Bloch, G., Graaf, D. C. d., Dearden, P., Elsik, C. G., Gadau, J., Grim-298 melikhuijzen, C. J., Hasselmann, M., Lozier, J. D., Robertson, H. M., Smagghe, G., Stolle, E., Vaeren-299 bergh, M. V., Waterhouse, R. M., Bornberg-Bauer, E., Klasberg, S., Bennett, A. K., Câmara, F., 300 Guigó, R., Hoff, K., Mariotti, M., Munoz-Torres, M., Murphy, T., Santesmasses, D., Amdam, G. V., 301 Beckers, M., Beye, M., Biewer, M., Bitondi, M. M., Blaxter, M. L., Bourke, A. F., Brown, M. J., 302 Buechel, S. D., Cameron, R., Cappelle, K., Carolan, J. C., Christiaens, O., Ciborowski, K. L., Clarke, 303 D. F., Colgan, T. J., Collins, D. H., Cridge, A. G., Dalmay, T., Dreier, S., Plessis, L. d., Duncan, E., 304 Erler, S., Evans, J., Falcon, T., Flores, K., Freitas, F. C., Fuchikawa, T., Gempe, T., Hartfelder, K., 305 Hauser, F., Helbing, S., Humann, F. C., Irvine, F., Jermiin, L. S., Johnson, C. E., Johnson, R. M., 306 Jones, A. K., Kadowaki, T., Kidner, J. H., Koch, V., Köhler, A., Kraus, F. B., Lattorff, H. M., Leask, 307 M., Lockett, G. A., Mallon, E. B., Antonio, D. S. M., Marxer, M., Meeus, I., Moritz, R. F., Nair, A., 308 Näpflin, K., Nissen, I., Niu, J., Nunes, F. M., Oakeshott, J. G., Osborne, A., Otte, M., Pinheiro, D. G., 309 Rossié, N., Rueppell, O., Santos, C. G., Schmid-Hempel, R., Schmitt, B. D., Schulte, C., Simões, Z. L., 310 Soares, M. P., Swevers, L., Winnebeck, E. C., Wolschin, F., Yu, N., Zdobnov, E. M., Aqrawi, P. K., 311 Blankenburg, K. P., Coyle, M., Francisco, L., Hernandez, A. G., Holder, M., Hudson, M. E., Jackson, 312 L., Jayaseelan, J., Joshi, V., Kovar, C., Lee, S. L., Mata, R., Mathew, T., Newsham, I. F., Ngo, R., 313 Okwuonu, G., Pham, C., Pu, L.-L., Saada, N., Santibanez, J., Simmons, D., Thornton, R., Venkat, 314 A., Walden, K. K., Wu, Y.-Q., Debyser, G., Devreese, B., Asher, C., Blommaert, J., Chipman, A. D., 315 Chittka, L., Fouks, B., Liu, J., O'Neill, M. P., Sumner, S., Puiu, D., Qu, J., Salzberg, S. L., Scherer, 316 S. E., Muzny, D. M., Richards, S., Robinson, G. E., Gibbs, R. A., Schmid-Hempel, P., and Worley, 317 K. C. 2015. The genomes of two key bumblebee species with primitive eusocial organization. Genome 318 Biology, 16(1): 76.319

Shen, S., Park, J. W., Lu, Z.-x., Lin, L., Henry, M. D., Wu, Y. N., Zhou, Q., and Xing, Y. 2014.
 rMATS: Robust and flexible detection of differential alternative splicing from replicate RNA-Seq data.
 *Proceedings of the National Academy of Sciences*, 111(51): E5593–E5601.

Simola, D. F., Wissler, L., Donahue, G., Waterhouse, R. M., Helmkampf, M., Roux, J., Nygaard, S.,
Glastad, K., Hagen, D. E., Viljakainen, L., Reese, J. T., Hunt, B. G., Graur, D., Elhaik, E., Kriventseva,
E., Wen, J., Parker, B. J., Cash, E., Privman, E., Childers, C. P., Munos-Torres, M. C., Boomsma, J. J.,
Bornberg-Bauer, E., Currie, C., Elsik, C. G., Suen, G., Goodisman, M. A., Keller, L., Liebig, J., Rawls,
A., Reinberg, D., Smith, C. D., Smith, C. R., Tsutsui, N., Wurm, Y., Zdobnov, E. M., Berger, S. L., and
Gadau, J. 2013. Social insect genomes exhibit dramatic evolution in gene composition and regulation

while preserving regulatory features linked to sociality. *Genome Research*, page gr.155408.113.

Terashima, J. and Bownes, M. 2006. E75a and E75b have opposite effects on the apoptosis/development choice of the Drosophila egg chamber. *Cell Death and Differentiation*, 13(3): 454–464.

332 Terrapon, N., Li, C., Robertson, H. M., Ji, L., Meng, X., Booth, W., Chen, Z., Childers, C. P., Glastad,

333 K. M., Gokhale, K., Gowin, J., Gronenberg, W., Hermansen, R. A., Hu, H., Hunt, B. G., Huylmans,

A. K., Khalil, S. M. S., Mitchell, R. D., Munoz-Torres, M. C., Mustard, J. A., Pan, H., Reese, J. T.,

- Scharf, M. E., Sun, F., Vogel, H., Xiao, J., Yang, W., Yang, Z., Yang, Z., Zhou, J., Zhu, J., Brent,
- C. S., Elsik, C. G., Goodisman, M. A. D., Liberles, D. A., Roe, R. M., Vargo, E. L., Vilcinskas, A.,
- Wang, J., Bornberg-Bauer, E., Korb, J., Zhang, G., and Liebig, J. 2014. Molecular traces of alternative
- social organization in a termite genome. *Nature Communications*, 5: 3636.

- Tovar-Corona, J. M., Castillo-Morales, A., Chen, L., Olds, B. P., Clark, J. M., Reynolds, S. E., Pitten-
- drigh, B. R., Feil, E. J., and Urrutia, A. O. 2015. Alternative Splice in Alternative Lice. Molecular Biology and Evolution, 32(10): 2749–2759.
- Trapnell, C., Pachter, L., and Salzberg, S. L. 2009. TopHat: discovering splice junctions with RNA-Seq.
   *Bioinformatics*, 25(9): 1105–1111.
- Trapnell, C., Roberts, A., Goff, L., Pertea, G., Kim, D., Kelley, D. R., Pimentel, H., Salzberg, S. L.,
  Rinn, J. L., and Pachter, L. 2012. Differential gene and transcript expression analysis of RNA-seq
  experiments with TopHat and Cufflinks. *Nature Protocols*, 7(3): 562–578.
- Woodard, S. H., Lozier, J. D., Goulson, D., Williams, P. H., Strange, J. P., and Jha, S. 2015. Molecular
  tools and bumble bees: revealing hidden details of ecology and evolution in a model system. *Molecular*
- *Ecology*, 24(12): 2916–36.
- Yan, H., Bonasio, R., Simola, D. F., Liebig, J., Berger, S. L., and Reinberg, D. 2015. DNA Methylation in
- Social Insects: How Epigenetics Can Control Behavior and Longevity. Annual Review of Entomology,
   60(1): 435–452.

# 353 Data Accessibility,

All sequence data for this study are archived at European Nucleotide Archive (ENA); Accession no. PR-JEB9366 (http://www.ebi.ac.uk/ena/data/view/PRJEB9366). GO-analysis results and lists of isoforms

356 are available as Supporting Information.

# 357 Author contributions

All authors developed the project idea and were involved in the interpretation of data and finalization of the manuscript. JP and EBM analyzed the data. EBM and JP drafted the manuscript.