Genome-wide search for parent-of-origin allele specific expression in *Bombus terrestris*.

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Abstract

Background: *Genomic imprinting is the expression bias of one allele in a diploid organism, expression being dependent upon which parent the allele was inherited from. Haig's kinship theory predicts that genomic imprinting occurs due to an evolutionary conflict-of-interest between the maternal alleles and paternal alleles of an individual. In social insects, it has been suggested that genomic imprinting should be widespread. One recent study identified parent-of-origin gene expression in honeybees and found evidence supporting one prediction of Haig's kinship theory. However, very little is known about genomic imprinting in insects and multiple theoretical predictions must be tested to avoid single-study confirmation bias. We therefore decided to test if parent-of-origin gene expression also occurs in another social bee using reciprocal crosses.*

Results: *We found equal numbers of maternally and paternally expressed alleles in both reproductive and sterile workers with the majority of genes showing the same expression bias in both castes. The most highly biased genes were maternally expressed. There was very little overlap of differentially expressed genes and genes showing parent-of-origin expression. We also found low evolutionary conservation of potentially imprinted genes with the honeybee.*

Conclusions: *Our results offer some support for the kinship theory of genomic imprinting. However, this theory does not fully explain the patterns we have obtained showing the need to consider alternative models. Additionally, the patterns we see differ from previous work in honeybees. This highlights the importance of using multiple species to test theory. Finally, the lack of conservation between species suggests rapid evolution of imprinted genes in Hymenoptera.*

Keywords— reciprocal cross, bumblebee, genomic imprinting, Hymenoptera, kinship theory, RNA-seq

Background

Genomic imprinting is the expression bias of one allele in a diploid organism, expression being dependent upon which parent the allele was inherited from, i.e. parent of origin- dependent allele-specific gene expression (Rodrigues and Zilberman, 2015). Multiple evolutionary theories attempt to explain its existence (reviewed in Patten et al., 2014). The most widely accepted explanation is the kinship theory developed by Haig (2000). This theory predicts genomic imprinting arose due to natural selection acting differently on the matrigenes (maternal alleles) and the patrigenes (paternal alleles) of an individual for given processes. For example; in a polyandrous mating system with maternal care, patrigenes are predicted to be subject to selection pressures which increase resource allocation from the mother at the expense of siblings. Whereas matrigenes in this scenario are predicted to be selected for equal resource distribution amongst offspring.

The majority of support for this theory comes from studies based on mammals and flowering plant systems (Patten et al., 2014). However, it has been suggested haplodiploid social insects can provide an ideal system to independently test Haig's kinship theory (Queller, 2003). Colonies of social bees consist of diploid females (queens and workers) and haploid males created from unfertilised eggs. This haplodiploidy results in workers which all share the full paternal genome, when queens are singly mated. In this scenario the kinship theory predicts patrigenes should be under stronger selection for general care-giving compared to matrigenes (Haig, 2000; Queller, 2003). However when queens mate with multiple males, workers are more likely to have higher maternally derived relatedness and the predictions reverse (Queller, 2003).

Research exploring parent-of-origin effects in social insects has focused on the behavioural and physiological outputs of genetic crosses. In the Argentine ant (*Linepithema humile*) paternal effects were observed in care-giving associated behaviours and in sex allocation of offspring (Libbrecht and Keller, 2012; Libbrecht et al., 2011). Paternal effects on dominance and stinging behaviour have also been observed in crosses of European and Africanized honeybees (Guzman-Novoa et al.,

2005). Additionally, Oldroyd et al. (2014) found a parent-of-origin effect of increased ovary size in honeybees but could not definitively determine which parent this effect was driven by.

More recently, reciprocal crosses and next generation sequencing technologies have been used to identify genes with parent-of-origin expression patterns in honeybees. Kocher et al. (2015) and Galbraith et al. (2016a) both used RNA-Seq to study parent-of-origin gene expression in hybrid crosses of honeybee sub-species. Kocher et al. (2015) found a matrigenic bias in gene expression however, it was later shown that sub-species incompatibility effects influenced the results obtained (Gibson et al., 2015). Showing some support for the kinship theory, Galbraith et al. (2016a) found greater patrigenic expression in reproductive workers compared to sterile workers, with increased patrigenic expression in the reproductive tissues. However, this study is limited to only one species and tests only one prediction from the many predictions made in Queller (2003) for how matrigenic/patrigenic expression bias may play a role in social insect colonies.

To test the robustness of Haig's kinship theory we present gene expression data of reproductive and sterile workers from reciprocal crosses of sub-species of the primitively eusocial bumblebee, *Bombus terrestris*. This species is naturally singly-mated and as such the reproductive predictions for the presence of matrigenic/patrigenic expression bias are the reverse of those predicted for the naturally multiply-mated honeybee.

As in Galbraith et al. (2016a) we test the effect of queen-less conditions. Under queen-less conditions matrigenes should be selected to favour individual worker reproduction as there is a higher likelihood they are present in the individual worker's offspring than in her nephews (Fig.1). Patrigenes should not experience selective pressure for reproductive behaviour as it is equally likely they will occur in the offspring of an individual worker or her nephews, meaning sterility and nursing behaviour are just as beneficial as reproductive behaviour.

We have utilised RNA-seq libraries from reproductive workers and sterile workers, as well as whole genome sequencing libraries from both parents, in order to identify parent-of-origin allele specific expression as a test for Haig's kinship theory of genomic imprinting. Based on the kinship

theory we predict higher matrigenic expression bias in both reproductive and sterile workers under queen-less conditions. We also predict that genes showing parent-of-origin expression will be enriched for reproductive related processes.

Reproductive and sterile workers were chosen in order to provide a robust test for the kinship theory. Imprinted genes should maintain their expression bias regardless of the current reproductive state of the individual, i.e. higher matrigenic expression compared to patrigenic expression should be present in queen-less workers regardless of whether they have become reproductive or remained sterile. Additionally the use of sterile and reproductive workers allows us to assess differential expression between castes. This means we can investigate if there is a relationship between differentially expressed genes between reproductive castes and genes showing parent-of-origin expression. A high overlap of differentially expressed genes between reproductive castes with genes showing parent-of-origin expression would suggest a role for imprinted genes in reproductive caste determination.

Figure 1: Schematic adapted from Drewell et al. (2012) showing the inheritance probabilities of the maternal and paternal genome in queen-less conditions. Matrigenes should experience higher selection pressures for worker reproduction compared to nursing behaviour for nephews.

Results

Differential expression between reproductive castes

Ten bases were trimmed from the 3' end of each worker RNA-seq read due to base bias generated by the Illumina protocol (Krueger et al., 2011). The mean number of uniquely mapped reads to the maternal genomes was 91.31% ± 0.57% (mean ± standard deviation) for the head samples and 91.53% ± 1.86% for the abdomen samples. This equated to a mean of 13,602,926 ± 2,774,040 and 14,181,003 ± 1,303,486 uniquely mapped reads respectively (supplementary 1.0.1). The mean number of uniquely mapped reads to the paternal genomes was 91.50% ± 0.68% (mean ± standard deviation) for the head samples and 91.70% ± 1.83% for the abdomen samples. This equated to a mean of 13,630,611 ± 2,776,779 and 14,208,273 ± 1,307,054 uniquely mapped reads respectively

(supplementary 1.0.1).

Tissue type explains the majority of variation within all of the RNA-seq samples, followed by

reproductive status; either reproductive or sterile (supplementary 2.0: Fig.S1). Following differential

expression analysis a total of 3,505 genes were up-regulated in the abdomen of reproductive workers

compared to sterile workers and 4,069 genes were down-regulated (q<0.01) (supplementary 1.0.2).

The enriched GO terms for the differentially expressed genes between reproductive and sterile

castes in the abdomen included mostly regulatory processes but also "*reproduction*" (GO:0000003)

(supplementary 1.0.3). Enriched GO terms associated specifically with up-regulated genes in

reproductive workers in the abdomen also included: "*reproduction*" (GO:0000003) and "*DNA*

methylation" (GO:0006306) (supplementary 1.0.4), these terms were not found in the enriched GO

terms for genes up-regulated in sterile workers (supplementary 1.0.5).

Considerably fewer genes were differentially expressed in the head samples; 86 up-regulated

genes in reproductive compared to sterile workers and 41 down-regulated genes (q<0.01) (supple-

mentary 1.0.6). The majority of the GO terms associated with these differentially expressed genes

involved biosynthetic processes (supplementary 1.0.7). Up-regulated genes in the head tissue of

reproductive workers also included "*reproduction*" (GO:0000003) whereas the up-regulated genes in

the head tissue of sterile workers consisted of mostly metabolic processes (supplementary 1.0.8 and

1.0.9).

Parent-of-origin gene expression

A total of 10,211 genes had a minimum of two SNPs with at least a coverage of five reads each. Of

those, 7,508 genes occurred in every cross, worker-type and tissue type. 700 genes had significant

maternal/paternal expression bias in both cross-directions for reproductive workers (q <0.05), and

747 were significant for sterile workers. The expression bias was averaged across; tissue type, worker

type, family and direction of cross to obtain an extremely conservative expression proportion. The

significant genes were then filtered to also have an average maternal expression proportion of >0.6 or

<0.4 to give a final confident list of genes showing parent-of-origin expression.

Reproductive workers have 163 genes showing significant parent-of-origin expression (Fig.2)

(supplementary 1.1.0). Sterile workers have 170 genes showing significant parent-of-origin expression

(Fig.2) (supplementary 1.1.1). There is no significant difference between the number of genes

showing maternal expression bias compared to paternal expression bias based on reproductive status

(chi-squared test of independence, X-squared = 0, df = 1, p-value = 1). There is also no difference

in the number of genes showing paternal expression bias compared to maternal expression bias in

reproductive and sterile workers, assessed independently (chi-squared goodness of fit, reproductive:

X-squared = 1.3804, df = 1, p-value = 0.24, sterile: X-squared = 1.5059, df = 1, p-value = 0.2198).

The most extreme expression bias is seen in the maternally expressed alleles in both castes, with 17

genes showing a maternal expression proportion of >0.9 in both reproductive and sterile workers

(Fig.2). There were no genes showing >0.9 paternal expression bias. Additionally we did not find

any genes with significant sub-species expression bias.

Figure 2: Maternal expression proportion by worker caste, sterile and reproductive. Each point represents a gene. Blue points are genes with significant parental expression bias (q<0.05 and expression proportion >0.6). Red points are genes with significant parental expression bias (q<0.05) with the proportion of expression >0.9. The top left quadrant of each plot represents genes with a *B. terrestris audax* expression bis, the bottom right quadrant represents gene with a *B. terrestris dalmatinus* expression bias. The top right represents genes with a maternal expression bias and the bottom left represents genes with a paternal expression bias.

Reproductive and sterile workers share a significant number of genes showing parent-of-origin

expression with the same parental bias (Fig.3, maternal expression bias: hypergeometric test, p =

9.20×10^{-108}, paternal expression bias: hypergeometric test, p = 7.66×10^{-90}). There were no

genes with maternal/paternal bias in one caste which also had the opposite bias in the other caste.

Additionally the majority of genes identified as showing parental expression bias show the same

bias in both abdomen and head tissue as well as across behaviourally defined castes (dominant and

subordinate reproductives and sterile foragers and nurses), see supplementary 2.0: Fig.S2-S7.

Figure 3: Overlapping genes showing parent-of-origin expression in reproductive and sterile workers. The set size indicates the number of genes in each list. The intersection size shows how many genes the corresponding lists have in common. A single dot refers to the number of genes unique to each list.

Overall genes showing parent-of-origin expression have enriched GO terms for multiple

biological processes (supplementary 1.1.2), specifically the GO terms "*negative regulation of*

reproductive processes" (GO:2000242) and "*female germ-line sex determination*" (GO:0019099) are

enriched. Genes with maternal and paternal bias in both reproductive and sterile workers also have

enriched GO terms for multiple biological processes (supplementary 1.1.3 and 1.1.4). Specifically,

paternally expressed genes in both reproductive and sterile workers are enriched for the GO term;

"*behaviour*" (GO:0007610).

Enriched GO terms for genes showing parent-of-origin expression in only reproductive or

sterile workers were also enriched for various biological processes (supplementary 1.1.5). Including

"*histone ubiquitination*" (GO:0016574) and "*histone H2A monoubiquitination*" (GO:0035518) in

reproductive paternally expressed genes.

Genes showing maternal parent-of-origin expression are enriched for genes which are also

differentially expressed in head tissue (Supplementary 2.0: Fig.S8, hypergeometric test, p = 0.004).

Specifically *Serine Protease Inhibitor 3/4* (LOC100652301) shows maternal expression bias in both

reproductive and sterile workers and is up-regulated in the head tissue of reproductive workers.

Genes with paternal parent-of-origin expression do not significantly overlap with differentially

expressed genes (supplementary 2.0: Fig.S8, hypergeometric test, p = 0.148). There is also no

significant overlap between genes showing parent-of-origin expression bias and differential expression

in the abdomen (supplementary 2.0: Fig.S9, hypergeometric test, p = 0.996).

Honeybee homology

A custom database of putative orthologs was made between *A. mellifera* and *B. terrestris*, as in

Marshall et al. (2019), containing 6,539 genes. 68% of differentially expressed abdominal genes were

identified within the database, 43% of differentially expressed head genes and 46% of genes showing

parent-of-origin expression bias (supplementary 1.1.6). Gene lists were obtained from Galbraith

et al. (2016a), the ortholog database contained 38% of the differentially expressed genes identified

between honeybee reproductive worker castes and 53% of the genes found to show parent-of-origin

expression bias (supplementary 1.1.6).

There was no significant overlap between the genes identified as showing parent-of-origin

expression between both studies (hypergeometric p = 0.64), with only two genes overlapping

(supplementary 2.0 Fig.S10). One of these is uncharacterised in both species (honeybee id:

LOC552195, bumblebee id: LOC100648162) and the second is a serine protease inhibitor (honeybee

id: LOC411889, bumblebee id: LOC100644680). The serine protease inhibitor shows paternal

expression bias in honeybees and maternal bias in both bumblebee reproductive and sterile castes.

It is not differentially expressed in the honeybee but it shows up-regulation in the abdomen

tissue of reproductive bumblebee workers compared to sterile workers. Additionally, Galbraith

et al. (2016a) identified numerous genes of interest which are involved in reproductive behaviour

(*vitellogenin, yolkless, ecdysone-receptor and ecdysone-induced protein*) which show paternal

expression bias in honeybees, none of which show significant parent-of-origin expression in the

bumblebee (supplementary 2.0 Fig.S11).

There was also no significant overlap between differentially expressed genes identified in

head tissue and abdomen tissue between *B. terrestris* reproductive castes with those identified as

differentially expressed between reproductive castes of *A. mellifera* from Galbraith et al. (2016b)

(supplementary 2.0 Fig.S12, head: hypergeometric p = 1, abdomen hypergeometric p = 1).

Discussion

Using parental genome sequencing and offspring RNA-seq we have identified genes showing

parent-of-origin expression in a primitively eusocial bumblebee species. We predicted higher

matrigenic expression bias in queen-less workers in genes related to reproductive functions following

the predictions of Haig's kinship theory (Queller, 2003; Haig, 2000). There was no difference in

the number of genes showing maternal or paternal expression bias in either reproductive or sterile

workers, however, genes showing the highest proportion of expression bias were all maternally

expressed in both worker castes. Additionally, reproductive related GO terms were enriched in both

maternally and paternally expressed genes along with multiple other biological processes.

These results provide some support for Haig's kinship theory; we find the most highly biased

genes are maternally expressed and some genes showing parent-of-origin expression are related

to reproductive processes. Galbraith et al. (2016a) found overall patrigenic expression bias in

reproductive and sterile workers from a reciprocal cross of honeybee sub-species, with significantly

more patrigenic expression bias in reproductive workers compared to sterile workers, supporting

Haig's kinship theory. Whilst, we do not find an overall maternal expression bias, the difference

in the signal obtained between species highlights the importance of using multiple species to test

various predictions when evaluating evolutionary theory. Additionally, many imprinted genes in

mammals are tissue-specific (Babak et al., 2015). Given that multiple tissues were used in this study,

to find the most extreme expression bias, it may be that the signal from tissue-specific imprinted

genes is diluted.

We do not find any direct association between parent-of-origin expression and reproductive

status. However, we did find different genes involved in histone modifications to be paternally

expressed in reproductive workers. Histone modifications have been identified as an imprinting mark

in plants (Rodrigues and Zilberman, 2015) and thought to be involved in imprinting maintenance in

mammals (Delaval and Feil, 2004). Histone modifications can alter gene expression by affecting

gene accessibility via chromatin (Bannister and Kouzarides, 2011). Chromatin modifications have

been associated with parent-of-origin expression in the fruit fly *Drosophilia melanogaster* (Joanis

and Lloyd, 2002). Additionally, Galbraith et al. (2016a) also found genes involved in histone

modifications showing parent-of-origin expression in the honeybee *A. mellifera*. Our results hint to

the possibility that parent-of-origin expression affects epigenetic mechanisms, which may in turn

influence reproductive related genes. This is purely speculative and provides a potential avenue for

future research to pursue.

As in Galbraith et al. (2016a) we also found no significant overlap of paternally expressed

genes with differentially expressed genes between reproductive and sterile workers. However, we

did find a significant overlap with maternally expressed genes and genes differentially expressed in

head tissue between reproductive and sterile castes. This significant overlap should be interpreted

cautiously however as only seven of the 103 unique maternally biased genes were differentially

expressed in head tissue between reproductive castes. The lack of overlap of differentially expressed

genes with paternally expressed genes and the small overlap with maternally expressed genes suggests

parent-of-origin expression may not directly influence reproductive status in bumblebee workers.

One of the overlapping genes found to be differentially expressed in head tissue between

reproductive castes which also shows maternal expression bias is a serine protease inhibitor. One of

the two homologous genes identified as showing parent-of-origin expression in this study and in

honeybees from Galbraith et al. (2016a) was also a serine protease inhibitor. Serine proteases (also

know as serpins) have been shown to be involved in insect immunity in various species including;

the silkworm *Bombyx mori* (Zou et al., 2009), another species of silk producing moth *Antheraea*

pernyi (Yu et al., 2017) and the mosquito *Anopheles gambiae* (Gorman and Paskewitz, 2001). They

also have functions involved with venom production in two parasitoid wasp species; *Pteromalus*

puparum (Yang et al., 2017) and *Nasonia vitripennis* (Qian et al., 2015).

Most recently a kazal-type serine protease inhibitor has been directly linked to oocyte

development in the desert locust *Schistocerca gregaria* (Guo et al., 2019). A knock-down of

the protein producing gene *Greglin* by RNAi caused extreme effects on reproduction, including;

diminished oocyte production and maturation, a decline in the number of eggs produced and hatching

success (Guo et al., 2019). Future work identifying the function of serine protease inhibitors in

social insects is needed to better understand the function of parent-of-origin expression of these

genes in both *B. terrestris* and *A. mellifera*.

As mentioned, only two genes were found in common between those found in Galbraith et al.

(2016a) as showing parent-of-origin gene expression in the honeybee *A. mellifera* and those identified

here in *B. terrestris*. Galbraith et al. (2016a) used ovaries and fat bodies as their tissues samples

whereas we selected to test whole head and whole abdomen samples for strong signals of expression

bias. Some imprinted genes in mammals are known to be tissue specific, such as *GBR10* which has

been found to be maternally expressed in brain and muscle tissue but not in growth plate cartilage

(McCann et al., 2001). Tissue specificity could account for the lack of concordance in parentally

expressed genes found between *B. terrestris* and *A. mellifera*. Additionally 51% of bumblebee genes

and 52% of honeybee genes were not present in the homology database created. This suggests the

function of potentially imprinted genes in Hymenoptera is not strictly conserved.

The lack of conservation between genes showing parent-of-origin expression in *A. mellifera*

and *B. terrestris* suggests imprinted genes have evolved rapidly in Hymenoptera. Imprinted genes in

mammals show much more consistency across species, with mice and humans reportedly sharing

around 50 imprinted genes out of around 150 and 100 characterised in each respectively (Babak

et al., 2015). Additionally, domestic cattle and pigs have been shown to share 14 imprinted genes

out of 26 and 18 respectively (Tian, 2013). However, imprinted genes in plants generally show less

conservation, with one study reporting 14% of maternally expressed genes and 29% of paternally

expressed genes in *Capsella rubella* show the same imprinting status in *Arabidopsis thaliana*, even

though both species belong to the Brassicaceae family (Hatorangan et al., 2016). Hatorangan et al.

(2016) suggest the lack of consistency between species could be the result of a historical shift in

mating-systems. Given the differences in mating-systems between honeybees and bumblebees, and

that variable predictions from the kinship theory apply to each species, rapid evolution of imprinted

genes in Hymenoptera is a feasible explanation for the lack of consistency in potentially imprinted

genes identified here and in Galbraith et al. (2016a).

Whilst we present some correlative evidence for parentally expressed genes being associated

with reproduction, the GO terms associated with both maternally and paternally expressed genes are

diverse. It has been suggested imprinted genes can function as a mechanism for plasticity, allowing

gene regulation to change depending on environmental conditions by activating the silenced allele

and increasing dosage of that gene (Radford et al., 2011). Social insects display, sometimes extreme,

phenotypic plasticity, where multiple discrete phenotypes (castes) can arise from a single genome

within a colony. In some species this is genetically determined (Mott et al., 2015), however there is

growing evidence epigenetic factors may play a role in caste determination in some species (Lyko

et al., 2010; Bonasio et al., 2012; Marshall et al., 2019). Matsuura et al. (2018) modelled a genomic

imprinting mediated caste determination system in the termite *Reticulitermes speratus* and found

this better explained the influence of parental phenotype on offspring than a purely genetic model.

Given the diversity of genes found here showing both maternal and paternal expression bias we

believe, along with Matsuura (2019), that further experimental investigation into the role of genomic

imprinting in caste determination in social insects is needed.

The identification of genes showing parent-of-origin expression in this study lays the ground

work for future research to identify potential epigenetic mechanisms of allele specific expression in

social insects. Genes showing allele specific expression and DNA methylation have been previously

identified in *B. terrestris* (Lonsdale et al., 2017), and genes involved in the reproductive process have

been shown to be differentially methylated between reproductive castes (Amarasinghe et al., 2014;

Marshall et al., 2019). DNA methylation is the mechanism by which some genes are imprinted in

mammals and plants (Scott and Spielman, 2006) and so investigation of parent-of-origin methylation

in *B. terrestris* may be fruitful.

Conclusions

This is the first study to identify parent-of-origin gene expression in a primitively eusocial bumblebee

species. We found the most highly biased genes show maternal expression bias, and parentally biased

genes in general in this species may be involved in worker reproduction, as predicted by Haig's

kinship theory. This discovery is in line with previous work using honeybees and the difference

in parent-of-origin expression profiles highlights the vital importance of using multiple species

to test multiple predictions in the evaluation of evolutionary theories. Additionally, the lack of

consistency between potentially imprinted genes in *B. terrestris* and *A. mellifera* suggests rapid

evolution of imprinted genes in these species. This discovery, along with the diversity of potentially

imprinted genes identified here shows the need to consider additional theories for the evolution of

imprinted genes in social insects. Finally, the results of this study create a base for many future

avenues of research including; gene function analysis of serine protease inhibitors in Hymenoptera,

epigenetic mechanisms of imprinting in insects and imprinted genes as a mechanism for plasticity,

caste determination and social evolution.

Methods

Sample collection

Reciprocal crosses of *B. terrestris dalmatinus* (native to southern Europe) and *B. terrestris audax* (native to the UK) were carried out by Biobest, Leuven. Reciprocal crosses allow subspecies-of-origin effects (i.e. the effect of genotype) to be disentangled from parent-of-origin effects (Kocher et al., 2015; Galbraith et al., 2016a). In order to obtain enough successful colonies multiple males and females for each cross (Fig. 4) were released into cages to mate. Once mating had occurred the male and female were removed. The male was immediately frozen at -80°C and the female was placed in cold conditions for eight weeks to induce diapause. Ten matings were carried out for each cross.

Four successful colonies (one of each cross direction) from two 'families' (Fig.4) were housed at the University of Leuven and kept in 21°C with red light conditions, they were fed *ad libitum* with pollen and a sugar syrup. Callow workers were labelled with numbered disks in order to determine age and allow behaviour to be recorded. Once each colony contained approximately 30 workers the queen was removed. The colonies were then filmed under queen-less conditions for 30mins per day for 14 days in order to score individual behaviour. The following behaviours were used to classify workers: incubating, feeding larvae, inspecting brood cells, building egg cups, ventilation, biting, pushing, egg-laying, egg-eating, foraging, feeding and grooming. Workers were classified based on the frequency of each of the above behaviours as either: sterile foragers, sterile nurses, dominant reproductives or subordinate reproductives (supplementary 1.0.0).

Initial   Reciprocal

Figure 4: Graphic display of the family-wise reciprocal crosses carried out. Each colour refers to related individuals, i.e. the queen from colony 02 is the sister of the male used in colony 12. This design reduces genetic variability between the initial and reciprocal crosses.

Worker reproductive status was confirmed by ovary dissection, ovaries were scored on a 0-4

scale as in Duchateau and Velthuis (1988), entire bodies were then stored at -80°C along with the

original queen mothers and male fathers. Workers were selected for sequencing based on their

behavioural classification and ovary status. Two of each behavioural type per colony were selected

(i.e. two dominant reproductives, two subordinate reproductives, two nurses and two foragers),

with the exception of colony 22 (Fig.4) which contained three subordinate reproductives and one

dominant reproductive. All sterile and reproductive samples were age matched. This gave a total of

32 samples, 8 per colony, four of each reproductive status, reproductive or sterile. See supplementary

1.0.0 for behavioural and ovary scoring per sample.

DNA and RNA extraction and sequencing

DNA was extracted from the mother and father of each colony using the Qiagen DNeasy® Blood & Tissue Kit. Thirty-two workers were selected for RNA sequencing. The head and abdomen were dissected and RNA extracted separately for each, using the Qiagen RNeasy® Lipid Tissue Kit, giving 64 total RNA samples. The quality of the DNA and RNA extraction were measured by Nanodrop and Qubit® fluorometer. Whole genome parental DNA was sequenced using 91bp paired-end reads and worker RNA was sequenced using 90bp paired-end reads on an Illumina HiSeq 2000 by BGI, China. Lane effects were minimised for the RNA samples by spreading colony and tissue samples across five lanes.

Generation of alternative reference genomes

Whole genome sequencing data was checked using Fastqc (v.0.11.05) (www.bioinformatics.ba-braham.ac.uk/projects/fastqc/) and adapters and low quality reads were trimmed using Cutadapt v.1.11 (Martin, 2011). Reads were aligned to the bumblebee reference genome (Bter_1.0, Refseq accession no. GCF_000214255.1 (Sadd et al., 2015)) using BWA-mem v.0.7.15 (Li and Durbin, 2009) with standard parameters. SNPs were then called using freebayes v.1.1.0 (Garrison and Marth, 2012) which can account for the difference in ploidy between males and females, a minimum of five reads per SNP were required. Queen SNPs were then filtered so only the homozygous alternative SNPs remained. The subtractbed command from BEDtools v.2.25.0 (Quinlan and Hall, 2010) was then used to create files containing SNPs unique to either the mother/father of each colony. The individual parental SNP files were then used to create alternate reference genomes for each parent using the 'fasta alternate reference maker' command in GATK v.3.6 (McKenna et al., 2010).

Identification of parent-of-origin expression

RNA-Seq data was quality checked and trimmed as above. STAR v.2.5.2b (Dobin et al., 2016) was used to align worker RNA-seq reads to each of that colony's specific parental genomes with zero mismatches allowed. This ensures any reads containing a SNP will only be matched to the parent that allele was inherited from. Alignment files were then filtered using BEDtools v.2.25.0 (Quinlan and Hall, 2010) so only alignments which contain an informative SNP (a unique SNP from either the mother or father) were kept. Reads were counted for the maternal/paternal alignments, also using BEDtools v.2.25.0 (Quinlan and Hall, 2010) and SNP positions were annotated with a gene ID taken from the Bter_1.0 annotation file (Refseq accession no. GCF_000214255.1) using a custom R script. SNPs which had zero maternal reads in at least one sample were removed completely from the analysis to avoid possible inflation of paternal counts. This would occur if the queen position was mis-called as homozygous with the missing allele matching that of the male (Galbraith et al., 2016a).

Genes showing parent-of-origin expression were determined using a logistic regression model in R v.3.4.0 (https://cran.r-project.org). Only genes occurring in both cross directions and in both family combinations, with a minimum of two SNPs per gene were analysed, this left a total of 7508 genes. If any gene showed zero reads for paternal counts this was changed to 1 to avoid complete separation. A quasibionimal distribution was also used to account for overdispersion within the data. Fixed factors included the direction of the cross, family and reproductive status (reproductive or sterile). Correction for multiple testing was carried out using the Benjamini–Hochberg method (Benjamini and Hochberg, 1995). Genes were determined as showing parent-of-origin expression if the allelic ratio (maternal/paternal) corrected p-value was <0.05 and the parental expression proportion was >0.6.

Differential expression

All RNA-seq samples were aligned to the reference genome (Bter_1.0, Refseq accession no. GCF_000214255.1 (Sadd et al., 2015)) using STAR v.2.5.2b (Dobin et al., 2016) with standard parameters. HTseq v.0.8.0 (Anders et al., 2013) was then used to count the number of reads per gene for each sample. Differential gene expression between reproductive and sterile workers for head and abdomen samples was assessed using the DESeq2 package v.1.16.1 (Love et al., 2014) in R. DESeq2 allows the incorporation of a general linear model (GLM) to identify differential expression; family, age, weight, direction of the cross, tissue type and reproductive status were all factors. P-values were corrected for multiple testing using the the Benjamini–Hochberg method (Benjamini and Hochberg, 1995).

Gene ontology enrichment

GO enrichment analysis was carried out using the hypergeometric test with Benjamini-Hochberg (Benjamini and Hochberg, 1995) multiple-testing correction in a custom R script, (q <0.05). This script utilised a previously made GO database for the *B. terrestris* genome, Bter_1.0 (Bebane et al., 2019). GO terms for differentially expressed genes were tested for enrichment against GO terms associated with all genes identified in either the the RNA-seq data from the abdomen or head. Up-regulated genes in either reproductive or sterile workers were tested for GO term enrichment against all differentially expressed genes from the respective tissue type as a background set.

Genes showing parent-of-origin expression were tested for enrichment against GO terms associated with all genes identified in both abdomen and head RNA-Seq data sets. Genes maternally or paternally biased were checked for GO term enrichment against all genes showing parent-of-origin expression as a background set. REVIGO (Supek et al., 2011) was used to obtain the GO descriptions from the GO identification numbers.

Comparative analyses

A hypergeometric test was applied to gene lists from the differential expression analysis and the parent-of-origin expression analysis to identify potential enrichment. *B. terrestis* and *A. mellifera* orthologous genes were determined as in Marshall et al. (2019) and a custom R script was then used to check for overlap between genes identified as showing parent-of-origin expression here and orthologous *A. mellifera* genes identified in Galbraith et al. (2016a).

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Author Contributions

T.W. and E.B.M. conceived the study. The reciprocal crosses were carried out by Biobest (Westerlo, Belgium) under supervision of F.W. J.S.Z. and K.B. carried out the behavioural observations and lab work. H.M. and T.W. carried out the analyses with input from A.V.G. H.M. and E.B.M. wrote the initial manuscript. All authors contributed to and reviewed the manuscript.

Data Accessibility

All RNA-seq and whole genome sequencing data is available under NCBI BioProject number PRJNA329487. Custom scripts are available at the following DOI: `https://zenodo.org/record/3235636`.

Conflict of Interest

All authors declare no conflict of interests.

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