

# Multi-tiered Analyses of Honey Bees That Resist or Succumb to Parasitic Mites and Viruses

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## Research Article

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**Multi-tiered analyses of honey bees that resist or succumb to parasitic mites and viruses**

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Key words: RNA sequencing, host-pathogen interactions, iflavirus, *Apis mellifera*, varroa, pollination, innate immunity

1 **Abstract**

2

3 *Background*

4 *Varroa destructor* mites, and the numerous viruses they vector to their honey bee hosts,  
5 are among the most serious threats to honey bee populations, causing mortality and  
6 morbidity to both the individual honey bee and colony, the negative effects of which  
7 convey to the pollination services provided by honey bees worldwide. Here we use a  
8 combination of targeted assays and deep RNA sequencing to determine host and microbial  
9 changes in resistant and susceptible honey bee lineages. We focus on three study sets. The  
10 first involves field sampling of sympatric western bees, some derived from resistant stock  
11 and some from stock susceptible to mites. The second experiment contrasts three colonies  
12 more deeply, two from susceptible stock from the southeastern U.S. and one from mite-  
13 resistant bee stock from Eastern Texas. Finally, to decouple the effects of mites from those  
14 of the viruses they vector, we experimentally expose honey bees to DWV in the laboratory,  
15 measuring viral growth and host responses.

16

17 *Results*

18 We find strong differences between resistant and susceptible bees in terms of both viral  
19 loads and bee gene expression. Interestingly, lineages of bees with naturally low levels of  
20 the mite-vectored Deformed wing virus, also carried lower levels of viruses not vectored  
21 by mites. By mapping gene expression results against current ontologies and other studies,  
22 we describe the impacts of mite parasitism, as well as viruses on bee health against two  
23 genetic backgrounds. We identify numerous genes and processes seen in other studies of

24 stress and disease in honey bee colonies, though we find novel genes and new patterns of  
25 expression too.

26

### 27 *Conclusions*

28 We provide evidence that honey bees surviving in the face of parasitic mites do so through  
29 their abilities to resist the presence of devastating viruses vectored by these mites. By  
30 revealing responses to viral infection and mite parasitism in different lineages, our data  
31 identify candidate proteins for the evolution of mite tolerance and virus resistance.

32

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34

35

## 36 **Background**

37 Parasitic mites present the single greatest threat to managed and wild honey bee (*Apis*  
38 *mellifera*) colonies in much of the world. The mite *Varroa destructor* strongly impacts  
39 honey bee colonies on all continents except Australia and Antarctica [1]. These mites  
40 directly impact honey bee health [2] and transmit a range of devastating RNA viruses  
41 within and across colonies. Among the mite-vectored viruses, the Deformed wing viruses  
42 (DWVs) are implicated in bee colony losses in Europe [3] and North America [4].  
43 Understanding the genetic patterns behind resistance and tolerance to parasitic mites and  
44 the viruses they transmit is key for effective breeding programs aimed at reducing the risks  
45 and management costs of these threats.

46 We conducted three experiments to examine differences in gene expression patterns  
47 and virus infection levels in populations of honey bees with distinct genetic backgrounds  
48 and phenotypes - those tolerant of *Varroa* and resistant to honey bee viruses (R), and those  
49 susceptible to *Varroa* and/or viruses (S). Experiment 1 assessed natural virus infection  
50 loads and immune gene expression in 30 colonies in the field, using quantitative PCR to  
51 characterize differences between 15 R colonies, and 15 S colonies. Experiment 2 explored  
52 RNA sequencing data for gene-expression differences and pathogen levels distinguishing  
53 mite-infested bees of the R and S genetic backgrounds from sister bees that were verified  
54 to be mite-free. RNA sequencing data revealed notable transcriptional differences between  
55 mite-infested and un-infested honey bees, and between Resistant and Sensitive phenotypes.  
56 Reasoning that laboratory injections of bees with viruses would allow us to decouple gene

57 expression patterns attributable to mite infestation from differences resulting from viral  
58 infection in field colonies, we conducted Experiment 3: injecting *Varroa*-free bee pupae in  
59 the laboratory with Deformed wing virus (DWV) or a phosphate buffer solution, and  
60 subsequently collecting RNA for sequencing. DWV injection evoked gene expression  
61 patterns that differed from bees injected with only PBS. Transcriptional profiles of virus-  
62 resistant bees injected with DWV were markedly different from virus-sensitive bees, while  
63 other gene expression contrasts emerged with buffer injection. The salient gene expression  
64 patterns that distinguish R and S bees in the field and laboratory, under a variety of  
65 experimental conditions, demonstrate important differences between the two genetic  
66 backgrounds in their response to *Varroa destructor* parasitism (mite-infested or un-  
67 infested) and Deformed wing virus infection. Equally important, our results allow  
68 differentiation of honey bee gene expression signals associated with viral infection in the  
69 presence and absence of mite parasites. These results have bearing on programs to  
70 understand host-parasite coevolution in a social insect and might be applied toward more  
71 sustainable strategies for reducing the impacts of parasitic mites on bees.

72

## 73 **Methods**

### 74 *Experiment 1: Natural responses in susceptible and resistant lineages*

75 To assess the impacts of mite parasitism on gene expression and virus loads, 30 colonies  
76 were used. These colonies were on a migratory beekeeping path, spending fall, winter, and  
77 spring in Texas, and late spring through summer in Montana (where they were sampled)..  
78 A total of 15 mite-resistant (R) and 15 mite-susceptible (S) cohorts were sampled. R  
79 colonies were headed by queens bred from resistant stock in Texas while queens heading

80 the S colonies were originally from California. Colonies of both R and S bees were  
81 managed without application of acaricides or utilization of other beekeeping practices for  
82 Varroa control and mite resistance was established based on long-term survivorship and  
83 the absence of viral pathologies. Sections of capped honey bee brood were cut from these  
84 30 colonies. Worker honey bees were collected as they emerged from brood cells and these  
85 cells were simultaneously screened for the presence of *Varroa destructor* mites. Only bees  
86 from mite-free cells were utilized. Total RNA was extracted from individual bees using  
87 TRIzol® (ThermoFisher) following manufacturers' protocol, generating *ca.* 50 µg total  
88 RNA per bee at 1 µg/µl . First-strand cDNA was generated from 1µl of this RNA using  
89 random hexamer primers and Superscript II (ThermoFisher) following manufacturers'  
90 protocol. Targets were screened using quantitative real-time PCR and appropriate primers  
91 for honey bee immune genes Hymenoptaecin and Eater, for viral pathogens Deformed  
92 wing virus, Black queen cell virus, and Kashmir bee virus, and for an endogenous control  
93 gene (*b-Actin*) as described in [5].

94

95 *Experiment 2: Impacts of Varroa mites and natural DWV infection in susceptible and*  
96 *resistant bees*

97 Sets of 30 parasitized and 30 mite-free bees were collected from two mite-susceptible  
98 honey bee colonies maintained at the USDA-ARS BRL, Maryland, and from a single  
99 colony from a mite-resistant population (Navasota, TX). Total RNA was extracted from  
100 individual bees, as above. Pools of RNA were generated using equimolar extracted RNA  
101 from the bees of each colony and approximately 8µg total RNA was used directly to

102 generate libraries for ILLUMINA paired-end 150 base-pair sequencing at the University  
103 of Maryland Institute for Genome Sciences.

104

105 *Experiment 3: Impacts of Deformed wing virus on Resistant and Susceptible Bees*

106 Intact honey bee brood frames were collected from each of 10 colonies maintained in  
107 apiaries near Navasota, Texas. 30 white-eyed pupae were removed from mite-free brood  
108 cells in brood comb. Bees were injected with 1µl of PBS alone, or PBS containing ca. 10<sup>7</sup>  
109 DWV viral copies. DWV suspensions for injection were prepared by extracting  
110 hemolymph from adult worker honey bees from the USDA-ARS Bee Research Laboratory  
111 apiaries (Beltsville, MD) showing the pathology of DWV infection, deformed wings. After  
112 virus injection, pupae were allowed to develop on folded Whatman paper in petri dishes  
113 incubating at 34°C with controlled relative humidity. Total RNA was extracted from 15  
114 bees either injected with PBS or DWV. Quantitative PCR was performed on aliquots of  
115 RNA from individual bees using primers for Hymenoptaecin, Eater and DWV, as above.  
116 RNA from bees of two colonies showing higher mean DWV levels after injection, and  
117 RNA from bees of two colonies with stable mean DWV levels after injection were pooled  
118 for RNA sequencing. Pools of RNA were generated using equimolar extracted RNA from  
119 the bees of each colony, and approximately 8µg total RNA was used directly to generate  
120 libraries for ILLUMINA sequencing, as above.

121 Raw sequence reads in FastQ format were trimmed using Trim Galore. Remaining  
122 adapter sequences were removed and sequences with quality scores < 25, as well as reads  
123 < 35bp, were also removed. Trimmed FastQ files were aligned to the Honey Bee (*Apis*  
124 *mellifera*) Genome Amel HAv3.1 using HiSAT2 [6] or STAR [7]. Features (genes,

125 transcripts and exons) were counted using featureCounts [8] and StringTie [9] using the  
126 GCF\_003254395.2\_Amel\_HAv3.1 gene annotations [10]. Reads not aligning to the honey  
127 bee genome were subsequently aligned to the HolobeeBar microbial database  
128 (<https://data.nal.usda.gov/dataset/holobee-database-v20161>) using Bowtie 2 [11]. Basic  
129 pairwise differential expression analysis was performed using EdgeR [12] and DESeq2  
130 [13].

131 Differential gene expression patterns were derived from RNA sequencing data  
132 using read alignments and read counts from the DESeq2 package. Genes showing up-  
133 regulation or down-regulation were compiled for all pairwise comparisons of genetic  
134 background (R v. S) and biological condition, mite-infested or mite-free and virus-injected  
135 or buffer-injected. Results were filtered for all evaluated contrasts by excluding any gene  
136 that had a False Discovery Rate (FDR) greater than or equal to 0.05. Increased gene  
137 expression levels (UP) or decreased gene expression levels (DOWN) compared to an  
138 expression standard (*b-Actin*) are limited to those genes with a FDR<0.05 and that have a  
139 log2 Fold Change (logFC) of > +1.5, or <-1.5 for UP-regulated expression and DOWN-  
140 regulated expression, respectively.

141 Unfortunately, many honey bee genes remain poorly characterized, and while gene  
142 expression responses to the environmental and experimental conditions examined here are  
143 inevitably complex, these factors impede interpretation of our differential gene expression  
144 results. Thus, to enrich insights gleaned from our differential gene expression results, we  
145 employed HymenopteraMine [14], a sophisticated genomic data analysis environment.  
146 HymenopteraMine facilitated exploitation of gene annotation information, simplified  
147 comparison of genes sets differentially expressed in the many combinations of genetic

148 lineage and experimental conditions, and enabled easy gene ontology enrichment (GO  
149 enrichment) analyses.

150 We engaged gene ontology (GO) annotations and the GO biological process,  
151 molecular function and cellular compartment enrichment widgets (GO BP, GO MF and  
152 GO CC) available at HymenopteraMine to analyze the genes UP and DOWN in S\_mite v.  
153 R\_mite, genes UP or DOWN in S\_virus v. R\_virus, and genes differentially expressed in  
154 other sample comparisons. When GO enrichment results were available, they were used to  
155 provide insights into the gene expression patterns that distinguished resistant and  
156 susceptible bees under the biological conditions we evaluated using RNA sequencing data  
157 - natural mite infestation and latent viral infection, and laboratory injection of DWV virus  
158 or a phosphate buffer solution. We displayed results using available tools (e.g., ReviGO  
159 for visualizing Gene Ontology patterns, <http://revigo.irb.hr/>) and custom developed scripts.

160

161

## 162 **Results**

163 *Experiment 1: Evaluation of Susceptible (S) and Resistant (R) colonies for virus loads and*  
164 *immune gene expression levels*

165 Colonies from both R and S stock both lacked pathologies typical of heavily  
166 infected honey bees. To determine whether these lineages differed in gene expression and  
167 viral loads, colonies were screened using quantitative-PCR (qPCR). Comparing qPCR data  
168 of bees from R colonies to data of bees from S colonies, we observed that R bees exhibited  
169 much lower natural levels of Deformed wing virus (DWV), as expected (Figure 1). These  
170 bees also showed decreased levels of Black queen cell virus (BQCV), a virus not

171 transmitted by mites, and Kashmir bee virus (KBV) than did S bees. S bees also expressed  
172 much higher levels of the cellular immunity genes Eater and Nim2C than did R bees.  
173 Strikingly, resistant bees showed higher levels of the gene encoding the antimicrobial  
174 peptide Hymenoptaecin and this was a major driving force in separating the two sample  
175 classes by cluster analysis (Figure 2).

176

177 *Experiment 2: Gene expression in R and S genetic backgrounds, with and without Varroa*  
178 *mites.*

179 We used RNA sequencing to compare gene expression levels between R and S bees  
180 collected from field colonies under natural conditions, comparing transcriptional profiles  
181 of R bees with and without Varroa mites to S bees with and without mites. Gene-expression  
182 signals were analyzed for statistically meaningful differential expression using DESeq2.  
183 Increased gene expression levels (UP) or decreased gene expression levels (DOWN)  
184 compared to an expression standard (*b-Actin*) are limited to those genes with a FDR<0.05  
185 and that have a log2 Fold Change (logFC) of > +1.5, or <-1.5 for UP-regulated expression  
186 and DOWN-regulated expression, respectively. We sequenced RNA of bees from R and S  
187 colonies, both from bees with mites present (R\_mites; S\_mites), and from bees without  
188 mite infestation (R\_control; S\_control). Strikingly, 89% of the variance in differential gene  
189 expression among bees from S and R colonies, under the two biological conditions of  
190 Experiment 2 (with and without mites), was explained by Principal Component 1 (74%)  
191 and Principal Component 2 (15%) in a Principal Component Analysis. See Figure 3 below.  
192 Transcriptome-wide analyses tend to cluster both mite and control samples from resistant  
193 bees, while showing a sharp disparity in gene expression between the two conditions for

194 the susceptible colonies, highlighting the impacts of mite presence on those lines (Figure  
195 S1).

196 In total, 699 honey bee genes were expressed at higher levels in S bees with mites  
197 than in R bees with mites (UP in S\_mite v. R\_mite), including miR-3726 and miR3729  
198 with 9.51 and 13.87 log fold elevation in S\_mite over R\_mite, respectively. Several  
199 immune effectors were among those overexpressed genes in S\_mite v. R\_mite samples,  
200 including the effectors Apidaecin, Defensin-1, Defensin-2, and Hymenoptaecin, and two  
201 peptidoglycan recognition proteins (GB47805 and GB47804). Differentially expressed  
202 genes up-regulated in S bees exposed to mites compared to R bees exposed to mite have  
203 GO enrichment results for the Gene Ontology biological processes *cell adhesion*, *cell*  
204 *surface receptor signaling* and *biological adhesion*, as well as *aminoglycan metabolism*  
205 and *glucosamine compound metabolism*. Cell adhesion molecules and other cellular  
206 membrane components are widely implicated as receptors for viral entry into host cells,  
207 and subsequent cell receptor signaling aids viral internalization and hijacking of cellular  
208 machinery for virus replication [15, 16]. Some aminoglycan derivatives can serve as  
209 receptors for virus entry as well as cell and membrane adhesion molecules. Chitin, a  
210 principal component of the exoskeleton, is a structural aminoglycan, and Varroa mites must  
211 penetrate chitin with their mouthparts to feed on honey bees, and bees must repair that  
212 damage to avoid desiccation, infection by microbial species and death. The increased  
213 expression of genes involved in these biological processes in mite-susceptible and virus-  
214 sensitive S bees have obvious implications in promoting vulnerability to virus infection  
215 and compensating for damage inflicted by mite parasitism.

216           The 699 genes DOWN in R\_mite v. S\_mite depicted in Figure 5(a) above  
217 (equivalent to genes UP in S\_mite v. R\_mite) have GO enrichments for cell adhesion,  
218 aminoglycan, chitin and glucosamine metabolic processes and cell surface receptor  
219 signaling pathways, as well as chitin binding, extracellular matrix constituents and  
220 structural cytoskeleton functionalities. The complete list of GO enrichments is found in  
221 Additional File 1, sheet 1, Excel workbook “GO enrichments for genes UP & DOWN in  
222 R\_mite v. S\_mite”; Sheet 2 “GO DOWN in R\_mite v. S\_mite”.

223           The 832 genes UP-regulated in R\_mite v. S\_mite depicted in Figure 5(b) above  
224 (equivalent to genes DOWN in S\_mite v. R\_mite) have GO BP enrichments for nucleic  
225 acid metabolism, RNA processing, non-coding RNA metabolism, gene expression, DNA  
226 metabolism, DNA repair and cellular response to DNA damage stimulus, mitochondrial  
227 gene expression, peptide metabolism and peptide biosynthesis, translation, methylation and  
228 cellular response to stress. 24 genes related to cellular response to DNA damage and DNA  
229 repair that are elevated in R\_mite v. S\_mite are apparent homologs or orthologs of dipteran  
230 and mammalian genes involved in all distinct DNA repair mechanisms: mismatch base  
231 repair, nucleotide and base excision repair, interstrand crosslink repair, non-homologous  
232 end-joining and homologous recombination; as well as genes affecting cell cycle arrest and  
233 DNA damage checkpoints. 10 of these 24 genes are also UP in R\_mite over R\_control  
234 expression levels. This suggests that DWV and Varroa radically disrupt normal gene  
235 expression activity and may inflict substantial damage to host DNA. At least one positive-  
236 strand RNA virus in humans - Hepatitis C virus - causes significant DNA lesions in  
237 hepatocytes, and there are many more examples of viruses generally with  
238 oncogenic/mutagenic activity. Fundamental metabolic changes differentiating R and S

239 bees affected by Varroa and DWV, especially gene expression program alterations, nucleic  
240 acid synthesis, and DNA repair processes, that could compensate for the various  
241 pathogenic disruptions of DWV and Varroa, may be key to the enhanced viral and Varroa  
242 resistance of R bees. The complete list of GO BP enrichments from genes UP in R\_mite v.  
243 S\_mite is given in Additional File 1, Sheet 2: “GO from genes UP and DOWN in R\_mite  
244 v. S\_mite”, Sheet 1: “GO UP R\_mite v. S\_mite”.

245 Genes up-regulated in S\_control v. R\_control, where mites are absent also produce  
246 many GO BP enrichments, some of the more interesting indicate that energy metabolism,  
247 ribonucleoside and nucleotide synthesis, and translation of mRNA to protein are all  
248 elevated in S over R bees without mites. The GO Biological Process enrichments are listed  
249 in Additional File 1, Sheet 3. For 532 genes UP in R\_control v. R\_mite, GO enrichments  
250 include regulation of transcription, regulation of macromolecule biosynthetic process,  
251 regulation of gene expression, cellular adhesion processes, regulation of RNA metabolic  
252 processes, and transcription factor activity among others, and are described in Additional  
253 File 1, Sheet 4. GO annotations from the 651 genes DOWN in R\_control v. R\_mite  
254 (equivalent to genes up-regulated in R\_mite v. R\_control) reveal enrichment for DNA  
255 biosynthesis, metabolic processes including noncoding RNA processing, peptide  
256 processing, cellular response to stress, DNA repair and response to DNA damage, as more  
257 fully depicted in Additional File 1, Sheet 5.

258 Surprisingly, there are very few genes differentially expressed when comparing  
259 S\_control to S\_mite, and in fact there are none UP in S\_control over S\_mite; so, a general  
260 down-regulation of gene expression by Varroa finds no support in our evidence. There are  
261 only 16 OGSv3.2 genes DOWN in S\_control v. S\_mite, yielding no GO enrichment results

262 for that comparison. The most notable genes down-regulated in S\_control v. S\_mite - that  
263 is, genes with elevated expression in S when Varroa are present are: Cytochrome P450  
264 6A1, Fibroin heavy chain, IL-1 receptor, lactate dehydrogenase, and one of five genes  
265 identified as a homolog or paralog of protein lethal(2) essential for life - GB45910  
266 (724367) , plus Hymenoptaecin, and bone morphogenetic protein 2-B.

267 Another contrast worth consideration is the asymmetric difference of DOWN in  
268 R\_control v. R\_mite MINUS DOWN in S\_control v. S\_mite, potentially focusing on the  
269 differential expression that is unique between R bees with no mites and R bees with mites  
270 and natural DWV loads, eliminating any genes that show expression differences when  
271 comparing mite-free S bees to mite-infested S bees with natural DWV infection levels.  
272 This contrast produces 607 genes with some intriguing GO enrichment results. Among the  
273 more interesting are GO BP enrichment for nucleic acid metabolic processes, noncoding  
274 RNA metabolic process, ncRNA processing, primary metabolic processes, cellular  
275 response to stress, cellular response to DNA damage stimulus, gene expression, response  
276 to stress, cellular biosynthetic processes, macromolecule biosynthetic process and  
277 methylation; and GO MF enrichment for terms as follows: catalytic activity acting on  
278 RNA, nuclease activity, methyltransferase activity, catalytic activity acting on DNA, RNA  
279 methyltransferase activity, ligase activity and DNA polymerase activity.

280

281 *Experiment 3: Differential gene expression of resistant and sensitive bees after injection*  
282 *with DWV or a saline control.*

283 Viral loads and immune gene expression differed significantly across colonies for  
284 bees injected with live DWV and those injected with PBS (Figure 6). Pupae from some

285 colonies showed high viral loads with either condition (e.g., sources B4, G3, G4, and G7),  
286 suggesting high existing levels of viral infections that were arguably amplified regardless  
287 of the addition of new viral copies. Others (B2, B3, B5, G5) showed significant increases  
288 in viral loads primarily in the bees injected with live virus. Two sources (B5 and G2) held  
289 relatively low average viral titers with both control and live virus injections.

290 Samples of pooled half-sisters from colonies that exhibited little or no increase in  
291 mean DWV titers after DWV injection (virus resistant (R)), were compared to samples of  
292 pooled half-sisters that demonstrated increases in mean viral loads after DWV injection,  
293 (virus sensitive (S)). Again, strong contrasts were revealed when examining comparative  
294 responses to virus injection in R and S genetic backgrounds, and other disparate gene  
295 expression differences emerged when comparing the response to PBS injection. Both the  
296 identity of genes exhibiting expression level changes, and the direction of expression level  
297 change (elevated or reduced expression - UP or DOWN) differed among Varroa-free bees  
298 drawn from Resistant and Sensitive colonies, as shown by Principal component analyses  
299 (Figure S2).

300

### 301 *Genes expressed more in R\_virus than in S\_virus*

302 192 genes were UP in R\_virus over S\_virus, and produced GO BP enrichments for defense  
303 response, oxidation-reduction processes, immune response, innate immune response and  
304 immune system process (Figure S3; Additional File 1, Sheet 6). However, 75 of these genes  
305 had no GO BP annotation. The genes producing the GO BP enrichment for immune  
306 response, immune system process and defense response included Defensin-1 (GB41428),  
307 peptidoglycan recognition protein 1 (GB47804), peptidoglycan recognition protein-2

308 (GB47805), leucine-rich repeat-containing protein 26 (GB44192), Hymenoptaecin  
309 (GB51233), and GB54506, an uncharacterized protein having scavenger receptor activity,  
310 binding acetylated and oxidized LDLs, bacteria, apoptotic cells, and advanced glycation  
311 end products, and delivering those ligands into the cell. The genes expressed at higher  
312 levels in R bees injected with virus than S bees injected with virus also yield GO molecular  
313 function enrichment for endopeptidases and other functional enzymes (Additional File 1,  
314 Sheet 7).

315 Many interesting genes were expressed at higher levels in R bees injected with  
316 virus. These genes included Vg or Vitellogenin (GB49544); Pla2 or Phospholipase a-2  
317 (GB48228) a venom component; PGRP-S2 (GB47805) encoding a peptidoglycan  
318 recognition protein; SP34 (GB48510), a venom serine protease; and Est-6 or carboxylic  
319 ester hydrolase (GB53756) - all are expressed at much higher levels in R\_virus than  
320 S\_virus. AGLU2 (GB43248) and Hbg2 (GB54549) two of three honey bee alpha-  
321 glucosidases, Obp-3 (GB53371), and Apid-1 (GB47546), or  
322 Apidaecin, are also among the top 50 more elevated in R\_virus v. S\_virus with log2 Fold  
323 Change greater than 3. Defensin-1 (GB41428) and Ecdysis triggering hormone (GB40094)  
324 were also among the more highly expressed in R bees compared to S bees injected with  
325 virus, both with log FC > 2.9. PPO or Prophenoloxidase (GB43738) and Cyp4g11  
326 (GB51536) a Cytochrome P450 4 g 11 ortholog, and nAChRb2 (GB53428), plus Mcdp  
327 (GB40696) or mast cell degranulating peptide, Odp15 - an odorant binding protein  
328 (GB46224) and CPR16 (GB52920), a cuticular protein, are also among the top 100 most  
329 differentially expressed and elevated in R\_virus over S\_virus. Another Cytochrome P-450  
330 (GB52023), Obp19, and Melittin-2 (GB44112), another key venom protein, were also

331 elevated in R bees injected with virus. GB44367 ([LOC724436](#)) that produces a  
332 phospholipase A 2-like peptide is UP in R\_virus v. S\_virus, and UP in R\_virus v. R\_PBS.  
333 Lastly, Argonaute-2 (GB50995) is UP in R\_virus v. S\_virus, as is GB41545 ([LOC409187](#)),  
334 or MD-2-related lipid recognition protein involved in cholesterol transport, and both have  
335 been implicated in anti-viral defenses in honey bees [17].

336

337 *Genes strongly down-regulated in R\_virus v. S\_virus injected bees*

338 Surprisingly, the majority of the genes DOWN in R\_Virus v. S\_Virus lack GO annotations.  
339 Nevertheless, many of these proteins have been noted as responsive to honey bee  
340 parasitism. Notably, Apidermin-3 like protein has recently been implicated as an outlier  
341 protein suppressed by DWV but induced by Varroa parasitism in a proteome study [18]. In  
342 that report Apidermin appears to be down-regulated by DWV infection, but up-regulated  
343 by Varroa and DWV+Varroa. We find that DWV injection suppresses Apidermin-3 like  
344 protein GB53110 ([409716](#)) in R bees that are mite-free and in S bees that are mite-free.  
345 That is, GB53110 is DOWN in R\_virus v. R\_PBS and DOWN in S\_virus v. S\_Control.  
346 But Apidermin-3 is also DOWN in R\_virus v. S\_virus - in substantial agreement with [18].  
347 In contrast, where mite infestation is a variable condition, GB53110 expression is UP in  
348 S\_mite compared to R\_mite, UP in S\_mite v. R\_control and also UP in S\_control v.  
349 R\_control, and UP in R\_control v. R\_mite, where S\_mite and S\_control have elevated  
350 natural DWV levels compared to R\_control and R\_mite. So Apidermin 3 (GB53110) may  
351 be up-regulated in S bees generally despite mite infestation and/or DWV infection.  
352 Alternatively, Varroa and Varroa+DWV may up-regulate Apidermin-3 only in S bees.

353           The MAGE-like protein ([LOC102654246](#)) encoding gene, GB42910, is another  
354 example of one of the most DOWN in the R\_virus v. S\_virus contrast, and is often involved  
355 in stress response in other species. Similarly, the gene encoding the *Ctenidin 1-like* protein  
356 ([LOC102656669](#)) is another gene most DOWN regulated in R\_virus v. S\_virus, and codes  
357 for a glycine-rich protein orthologous to an antimicrobial peptide first described in spiders  
358 and scorpions. Interestingly, *kakusei*, a gene transcribed into a non-coding RNA, known to  
359 be an Immediate Early Gene (IEG) and previously characterized as involved in associative  
360 learning and memory and other neural activity, is also a gene DOWN in R\_virus v. S\_virus.  
361 IEGs are also recognized as one of the key mediators of links between events at the cellular  
362 membrane and the nucleus, presumably related to neural activity.

363           The Hexamerin 110 encoding gene GB44996 is also one of the most DOWN in  
364 R\_virus v. S\_virus. Hex110 is an amino acid storage protein used to fuel the drastic changes  
365 that occur during metamorphosis, and Hexamerin 110 may have a role in regulating the  
366 expression of the ribosomal RNA gene cluster in the nucleolus. Hex70a, Hex70b and  
367 Hex70c are also DOWN in R bees relative to S bees injected with virus, though not so  
368 dramatically as Hex110. Other notable genes DOWN in the R\_virus v. S\_virus contrast  
369 include Kr (GB41483) or Krueppel, and Usp (GB42692) or Ultraspiracle. Krueppel is a  
370 chromatin-associated gap class segmentation protein that is involved in negative regulation  
371 of transcription and developmental processes, including hemocyte proliferation, trunk  
372 segmentation and neurogenesis. Ultraspiracle is a nuclear steroid hormone receptor,  
373 binding ecdysone and ecdysone response elements, and is probably involved in honey bee  
374 metamorphosis. GB50662 (Vhdl), a larval-specific very high-density lipoprotein, is also  
375 Down in R compared to S bees injected with virus.

376

377 *153 Genes DOWN in R\_virus v. R\_PBS*

378 45 genes with lower expression in resistant bees injected with DWV had products that  
379 localized to the cell membrane and produced GO cellular component enrichments for  
380 intrinsic and integral components of the membrane. 10 genes DOWN in DWV injected R  
381 bees compared to Pbs injected R bees produced proteins constituting elements of the cuticle  
382 and generated GO molecular function enrichment for structural constituent of the cuticle  
383 while 13 DOWN genes yielded GO MF enrichment for structural molecule activity.  
384 Another 7 genes DOWN in R\_virus v. R\_PBS had endopeptidase and hydrolase activity  
385 and produced GO enrichment for those molecular functions.

386

387 *33 Genes UP in R\_PBS v. S\_PBS injected bees*

388 GB49544 - or Vitellogenin - is one of the genes up-regulated in R bees compared to S bees  
389 injected with PBS, as is GB50290 - inactive serine protease scarface ([LOC724917](#));  
390 GB49648 codes for a protein with ecdysis-triggering hormone activity and is involved with  
391 ecdysis and chitin cuticle formation is also UP in R relative to S after PBS injection.  
392 Cuticular Protein 2 (GB48823), and GB48342 ([LOC100576193](#)) a keratinocyte proline-  
393 rich protein, plus a second keratinocyte proline-rich protein encoding gene, GB46585  
394 ([LOC100578514](#)) and Cuticular Protein 3 (GB48832), as well as a structural cuticular  
395 protein encoding gene GB46298, and GB41015 (Grp) a glycine-rich cuticle protein, and  
396 yet another cuticular protein, GB46591 ([LOC725089](#)) are UP in R\_PBS relative to S\_PBS  
397 too. GB47383 ([LOC409689](#)) is also UP in R compared to S injected with PBS, and codes  
398 for a U4/U6 small nuclear ribonuclear protein. In addition, GB45986 ([LOC413408](#)) that

399 produces a scavenger receptor protein; a gene producing a pro-resilin-like peptide  
400 (GB43298); and GB40681 (LOC100578829), coding for a protein that elongates very long  
401 chain fatty acids are all UP in R v. S with PBS injection. A gene that produces a circadian  
402 clock-controlled protein GB42702 (LOC727010 is UP, and GB41707, encoding the  
403 Tubulin beta subunit of microtubules, is also elevated in R\_PBS v. S\_PBS.

404

405 *Genes at the Intersection of UP in R\_virus v. S\_virus AND UP in S\_mite v. R\_mite*

406 Examining the *Intersection* of: (1) the set of genes up-regulated in R bees injected with  
407 DWV; and (2) the set of genes upregulated in S bees infested with mites compared to R  
408 bees infested with mites, yields a total of 51 genes (recall that S\_mite bees carried higher  
409 naturally occurring DWV loads than did R\_mite bees). The 51 genes UP-regulated in  
410 R\_virus v. S\_virus and UP in S\_mite over R\_mite (with natural virus infection levels) show  
411 GO BP enrichment for immune response, defense response and innate immune response.  
412 This GO enrichment emerged despite 15 of the 51 genes having no GO BP annotations.  
413 The 51 UP regulated in both R\_virus v. S\_virus and UP in S\_mite v. R\_mite also had GO  
414 MF enrichment for serine endopeptidase, serine hydrolase and peptidoglycan binding, even  
415 with 19 of the 51 genes having no GO MF annotations. Natural, pre-existing DWV virus  
416 infections were present in the S\_mite and R\_mite honey bees studied in Experiment Two,  
417 as in Experiment One. Importantly, we documented higher natural DWV virus levels in  
418 both the S\_mite and S\_control samples than in the R\_mite and R\_control honey bees.  
419 Perhaps more surprising, while virus levels were elevated in S\_mite bees compared to  
420 S\_control bees - as expected and previously reported in several studies - mite infestation

421 had little effect on virus loads in R bees. If anything, mean DWV levels in R\_mite bees  
422 were slightly lower than DWV levels in R\_control bees. See Figure 4, above.

423 Even when GO enrichment results are limited it is possible to glean other distinctive  
424 differences between R and S bees and their respective response to mites and DWV. For  
425 instance, the 51 genes UP in R\_virus v. S\_virus and UP in S\_mite v. R\_mite included not  
426 only Apidaecin GB47546, Defensin-1, GB41428, Hymenoptaecin GB51223 and a gamma  
427 interferon inducible thiol reductase like protein (GILT-1), GB40261, but also genes  
428 encoding Vitellogenin GB49544 and Malvolio GB54097, the venom components Mellitin-  
429 2 GB44112, Phospholipase A-2 GB48228, a venom serine protease GB44120 and Apamin  
430 (GB40697) a neurotoxin. The peptidoglycan recognition proteins GB47805 and GB47804,  
431 a cell matrix adhesion molecule, GB40210, various cellular membrane components and  
432 transmembrane transporters, e.g., GB50447, lipid recognition proteins, e.g., GB41545 a  
433 MD-2-related lipid recognition protein previously implicated in antiviral defenses in honey  
434 bees, and involved in cholesterol transport, a protein with DNA transcription factor activity  
435 GB52620, a protein with scavenger receptor activity GB54506, other cholesterol and lipid  
436 transport proteins, e.g., GB42053, glucose dehydrogenase GB51814, alpha glucosidase  
437 GB54549, alpha amylase GB49854, cytochrome P-450 9e2 GB43713, two trypsins  
438 GB41097, a two chymotrypsin inhibitors GB45614, GB50116, a methyltransferase  
439 GB44871, and a putative multivitamin transporter GB48560 were all elevated in R bees  
440 injected with virus.

441

442

443

444 **Conclusions**

445 Honey bees battle their parasites with both individual and group defenses. Honey bees that  
446 survive long-term exposure to *Varroa* mites without the help of human interventions are  
447 exceedingly rare. These surviving lineages could resist mites themselves or the devastating  
448 viruses that mites vector within the colony. These three experiments focused on signals for  
449 both traits, namely genetic responses by bees that reduce the impacts of mites and mite-  
450 vectored viruses.

451 Experiment One showed that natural viral loads in a genetically distinct population  
452 of honey bees ([19]; 5 TX managed colonies) exhibiting a *Varroa* tolerant phenotype were  
453 markedly lower than natural viral loads in another population of bees susceptible to *Varroa*.  
454 This trend of lower virus levels, including a virus not vectored by *Varroa* mites, suggests  
455 that the results reflect a general resistance to viruses. Expression levels of the cellular  
456 immunity genes *Eater* and *Nim2C* were elevated in susceptible bees compared to resistant  
457 bees. These results led us to more closely examine differences between these two  
458 populations, and their respective responses to *Varroa destructor* parasitism and virus  
459 infection.

460 In Experiment Two, we generated RNA sequencing data from R and S bees kept  
461 under natural conditions for commercial beekeeping and queen-rearing purposes. These  
462 data confirmed the results of Experiment One - that R bees harbor lower covert viral loads,  
463 including DWV, than do S bees. Our results also indicate that mite infestation appears not  
464 to elevate viral titers in R bees, while mite infestation is associated with significantly higher  
465 virus levels in S bees. Previous work has shown that *Varroa* parasitism consistently results  
466 in markedly elevated DWV levels and manifestations of DWV pathology (*See, e.g., [20]*).

467 This suggests that the Varroa tolerance of R bees may be explained at least in part by R  
468 bees suppressing the viral load enhancement that usually follows parasitism by Varroa.  
469 Alternatively, the virus resistance of R bees may be related to their ability to cope with  
470 Varroa infestation without suffering pathological effects, including aberrant immune  
471 system function, and increased mortality usually associated with mite-induced viral load  
472 enhancement. Finally, the Varroa tolerance and lower viral loads in R bees compared to S  
473 bees may be driven by a combination of enhanced resistance of R bees to both Varroa and  
474 viruses, with distinct expression differences conferring resistance both to pathogens and a  
475 pathogen-vectoring parasite.

476       Especially intriguing in Experiment 2 are the GO enrichments for RNA processing,  
477 including transcription and transcriptional regulation, splicing, nuclear and mitochondrial  
478 gene expression, translation and peptide biosynthesis, plus DNA damage repair. The  
479 fundamental metabolic changes that distinguish the response of R and S bees to DWV and  
480 Varroa mites may better enable R bees to cope with the insults of Varroa and viruses and  
481 their deleterious effects on transcription, translation, gene expression programs and nucleic  
482 acid processing. The differential responses to Varroa and DWV also encompass extensive  
483 activation of DNA damage repair pathways by R bees. Overall, R bees have higher levels  
484 of expression for genes implicated in DNA and RNA processing, especially splicing of  
485 RNA, gene expression and nucleobase and ribonucleoprotein metabolic processes. R\_PBS  
486 bees also express Argonaute-2 GB50955 at higher levels than S\_PBS bees (DOWN in  
487 S\_PBS v. R\_PBS). This protein is also up-regulated in R\_virus v. S\_virus samples.  
488 Argonaute-2 is a key component of the RNA interference response, a key antiviral pathway

489 [21], and this pathway has been shown to be responsive to viral infections recently by  
490 Rutter et al. [17].

491 Experiment Three was designed to decouple the direct effects of mite parasitism  
492 from the effects of transmitted viruses. Specifically, we examined differentially expressed  
493 genes from mite-free bees of both R and S phenotypes and from common locales, by  
494 directly injecting DWV or PBS into bees of both genetic backgrounds. When comparing  
495 the changes in gene expression elicited by virus injection, the results clearly differentiate  
496 R and S bees. UP regulation of immune response genes in R\_virus v. S\_virus suggests that  
497 elevated expression levels for genes involved in defense response and immune response  
498 may be an effective response to viral infection, conferring some degree of protection  
499 against DWV, at least in honey bees free of Varroa infestation. Elevated expression of  
500 immune response genes differentiate R bees from S bees in response to direct DWV  
501 injection and may be an important advantage contributing to the relative resistance of R  
502 bees to DWV. However, as Experiment 2 results reveal, when Varroa mites are present,  
503 turning up expression of immune system genes alone may not be sufficient for coping with  
504 Varroa and natural virus infection. Our GO enrichment results show that S bees infested  
505 with mites, and carrying elevated DWV loads compared to R bees with mites, do  
506 upregulate some immune genes. But if up-regulation of immune genes was sufficient to  
507 confer a virus and mite resistant phenotype, then we might expect to see immune gene  
508 expression generally elevated in R\_mite v. S\_mite, while the GO enrichment data show  
509 the opposite. A more complex response to mites + virus, selectively modulating expression  
510 of many genes but enhancing expression of only specific immune genes, may contribute to  
511 increased mite-tolerance and virus resistance in R bees.

512 Many interesting GO terms emerged from genes with elevated expression after  
513 DWV injection, as well as from genes up-regulated in association with natural DWV  
514 infection, contrary to the complete absence of GO enrichment among genes elevated by  
515 pathogen infection in Doublet, et al. [22]. In an especially striking example, our  
516 experiments show that genes involved with immune function were expressed at higher  
517 levels in samples with higher DWV loads - a result at odds with the meta-analysis of  
518 Doublet, et al. [22], where immune genes, metabolic genes and regulatory genes were all  
519 suppressed by pathogen infection. Most notably, we find immune genes and defense  
520 response genes were highly over-represented among genes UP in R bees after virus  
521 injection, and were also UP in S bees with mites. Enhanced expression of immune defense  
522 genes elicited by higher DWV load is one explanation for our results: S bees with mites  
523 harbored higher levels of natural DWV infection than R bees with mites or R bees without  
524 mites. Equally important, R bees expressed immune defense genes at higher levels but  
525 developed lower DWV loads after DWV injection. These results offer intriguing  
526 correlations with the differential response of R and S bees to DWV injection, as well as  
527 their response to natural DWV infection in conjunction with Varroa infestation. Elevated  
528 expression of select immune genes may represent an effective anti-viral response to DWV  
529 infection, albeit one modulated by Varroa or of reduced impact when mites are present.

530

531 *Integrating differential gene expression results of bees with natural DWV infection but*  
532 *variable Varroa infestation from expression differences after DWV injection of mite-free*  
533 *bees.*

534           The disparate patterns of elevated gene expression between R and S bees naturally  
535 infected with DWV and infested by *Varroa* mites, compared to differential expression of  
536 genes in R and S bees infected in the laboratory with DWV, potentially provide clues to  
537 the mechanisms of resistance to virus and tolerance of mites. The totality of the evidence  
538 suggests that R bees devote significant energy to buffering against cellular and metabolic  
539 stress that emanate from concomitant virus and parasite insults, and exhibit differential  
540 gene expression patterns that provide metabolic, oxidative and developmental stress  
541 protections - not simply elevated immune gene expression profiles. While elevated immune  
542 system gene expression may be necessary for successfully resisting viral infections,  
543 increased expression of immune genes alone may be insufficient to provide protection,  
544 especially in bees with both DWV infection and *Varroa destructor* infestation.

545

546 *Genes also differentially expressed in previous studies*

547           We found concordance in differentially expressed genes between our study and  
548 four RNASeq analyses conducted on honey bees and their disease responses, as detailed in  
549 Additional File 2 and Table S1. On the other hand, we find important differences between  
550 our results and prior reports of particular genes being best correlated with DWV infection  
551 or antiviral response. In fact, in several instances genes previously identified as key anti-  
552 virus responses were not differentially expressed in our study [17, 18, 22-28].

553           The salient gene expression patterns that distinguish R and S bees in the field and  
554 laboratory demonstrate important differences between the two genetic backgrounds in their  
555 response to *Varroa destructor* parasitism and DWV infection. The gene expression patterns  
556 associated with mite infestation and DWV infection provide additional insights into

557 important transcriptomic changes elicited either by direct virus injection and infection, or  
558 by Varroa mite parasitism and natural viral infection. Equally important, our results show  
559 different honey bee gene expression signals are elicited by viral infection depending upon  
560 the presence or absence of mite parasites. We recovered a robust signal of differential gene  
561 expression when comparing bees from two genetically distinct populations exposed to  
562 DWV and Varroa mites, despite sampling polyandrous bees with the intra-colony genetic  
563 diversity typical of natural hives. Our data may also reveal responses to viral infection and  
564 mite parasitism that confer selective advantages in bees that exhibit mite-tolerant and virus-  
565 resistant phenotypes, and may suggest mite tolerance or virus-resistance mechanisms. This  
566 work should allow us to begin identification of gene expression patterns associated with  
567 mite tolerance and viral resistance in populations or lineages that exhibit those traits, and  
568 begin to define virus and mite resistance mechanisms at the genomic and transcriptomic  
569 level – all of which merit additional investigation.

570

571

572

573 **Declarations**

574 *Ethics approval and consent to participate*

575 Not Applicable, invertebrate species

576

577 *Consent for publication*

578 All authors have approved the content and plan for publication

579

580 *Availability of data and materials*

581 We have provided all sequences and reagents for the constructs and methods. All RNA

582 sequences are deposited under project PRJNA431793 in the NCBI Sequence Reads

583 Archive.

584

585 *Competing interests*

586 DW carries out genetic research involving honey bees with colleagues at UT-Southwestern

587 and USDA but also owns a family business breeding and selling honey bees and pollinating

588 crops. The described honey bees are not an advertised breed from his company and we are

589 conscious that we cannot advertise this as pitting his bees over other varieties. The

590 remaining authors have no competing interests and no authors have non-financial

591 competing interests.

592

593

594

595

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599 self-funded (DW).

600

601 *Authors' contributions*

602 DW and JDE conceived the project and collected samples, BC and CE helped with  
603 bioinformatic analyses, DL helped with experiments, all authors wrote the manuscript.

604

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607

608 **Figure Legends**

609 Figure 1. Natural virus loads of Deformed wing virus (DWV), Black queen cell virus  
610 (BQCV), Kashmir bee virus (KBV), and expression levels of three immune genes: the  
611 antimicrobial gene, Hymenoptaecin, and the cellular immunity genes, Eater, and Nim2C.  
612 Diamond plots show means, plus one and two standard deviations from the mean for each  
613 virus and gene.

614

615 Figure 2. Clustering Diagram of Susceptible (VS) and Resistant (VR) samples from  
616 Experiment One, showing higher virus loads in VS bees than in VR bees and higher levels

617 of Eater expression in VS bees, contrasted with slightly higher levels of Hymenoptaecin  
618 expression in VR bees.

619

620 Figure 3. Principal Component Analysis of Gene Expression Data produced by DESeq 2  
621 for VS1, VS0, VT1 and VT0 samples. VS1 = S\_mite; VS0 = S\_control; VT1 = R\_mite;  
622 and, VT0 = R\_control. Note that PC1 captures 74% of the total variance between the  
623 samples, and shows the extreme divergence of R\_mite from S\_mite and S\_control. PC2  
624 provides differentiation of R\_control from R\_mite, revealing much of the gene expression  
625 differences attributable to mite infestation of the R genetic background.

626

627 Fig. 4. Quantitative PCR estimates of Deformed wing virus (d-CT) for the R\_control,  
628 R\_mite, S\_control, and S\_mite samples, showing mite-infested Susceptible honey bees  
629 with elevated DWV titers compared to Susceptible bees that were mite-free. Susceptible  
630 bees (two sources) had markedly higher levels of DWV than the Resistant bees, regardless  
631 of Varroa parasitism status; moreover, DWV loads of Resistant bees were not higher when  
632 mites were present.

633

634 Figure 5. Scatterplot of enriched Biological Process Gene Ontology terms (GO BPs). a)  
635 Up-regulated in S bees with mites compared to R bees with mites (UP in S\_mite v. R\_mite),  
636 b) Down-regulated in S bees with mites compared to R bees with mites (DOWN in S\_mite  
637 v. R\_mite). GO enrichments and P-values were calculated using HymenopteraMine GO  
638 enrichment widgets after using HymenopteraMine database cross-references to convert  
639 gene identifiers to OGSv3.2, with the OGSv3.2 gene set as the background population and

640 a Benjamini-Hochberg multiple testing correction. The GO enrichment test dataset is  
641 comprised of genes with  $FDR < 0.05$  and with expression level differences showing a log<sub>10</sub>  
642 fold change greater than 1.5 ( $\log_{10}FC > 1.5$ ). Scatterplot generated by ReviGo [29].

643

644 Figure 6. qPCR relative levels of Deformed wing virus and two immune-related genes,  
645 Eater and Hymenoptaecin. Blue dots reflect bees injected with DWV, red dots reflect bees  
646 given a PBS control injection. ‘B’ colonies were predicted to be more susceptible while  
647 ‘G’ colonies were predicted to be resistant.

648

649 Figure S1. Heatmap of the sample-to-sample distance in R\_mite v. R\_control and S\_mite  
650 v. S\_control samples compiled using the R package DESeq2 with a customized map  
651 function,  
652 ([http://bioconductor.org/packages/release/bioc/vignettes/DESeq2/inst/doc/DESeq2.html#](http://bioconductor.org/packages/release/bioc/vignettes/DESeq2/inst/doc/DESeq2.html#heatmap-of-the-sample-to-sample-distances)  
653 [heatmap-of-the-sample-to-sample-distances](http://bioconductor.org/packages/release/bioc/vignettes/DESeq2/inst/doc/DESeq2.html#heatmap-of-the-sample-to-sample-distances)).

654

655 Figure S2. Principal Component Analysis of Differential Gene Expression data, contrasting  
656 R bees injected with virus, R\_Virus, S bees injected with virus, S\_Virus, and R & S bees  
657 injected only with a phosphate buffer solution, R\_PBS and S\_PBS; R\_Virus and S\_Virus  
658 are divergent in RNA sequencing data that comprise principal component 1; Principal  
659 component 2 captures the different responses to virus versus control injection in the R  
660 samples, and differences between the two S samples in response to buffer injection.

661

662 Figure S3. a) Scatterplot in semantic space of GO BP enrichment for UP in R\_virus v.  
663 S\_virus, FDR<0.05 and logFC>1.5. b) Scatterplot in semantic space of GO MF enrichment  
664 from HymenopteraMine set operation of Asymmetric Difference of UP in R\_virus v.  
665 S\_virus *MINUS* UP in R\_virus v. R\_PBS, genes with FDR < 0.05 and logFC >1.5.

666

667

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757

# Figures

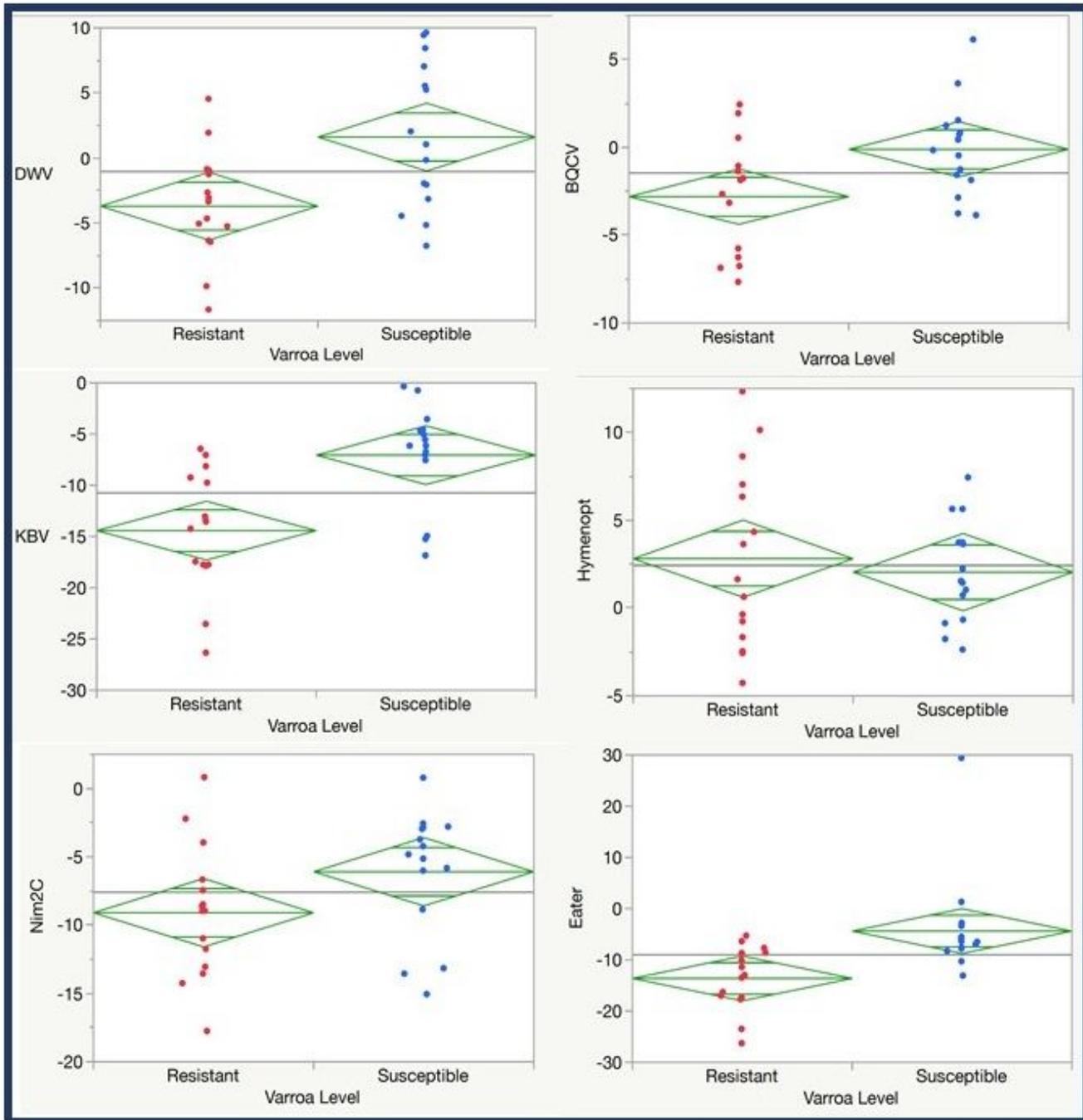


Figure 1

Figure 1

Natural virus loads of Deformed wing virus (DWV), Black queen cell virus (BQCV), Kashmir bee virus (KBV), and expression levels of three immune genes: the antimicrobial gene, Hymenoptaecin, and the

cellular immunity genes, Eater, and Nim2C. Diamond plots show means, plus one and two standard deviations from the mean for each virus and gene.

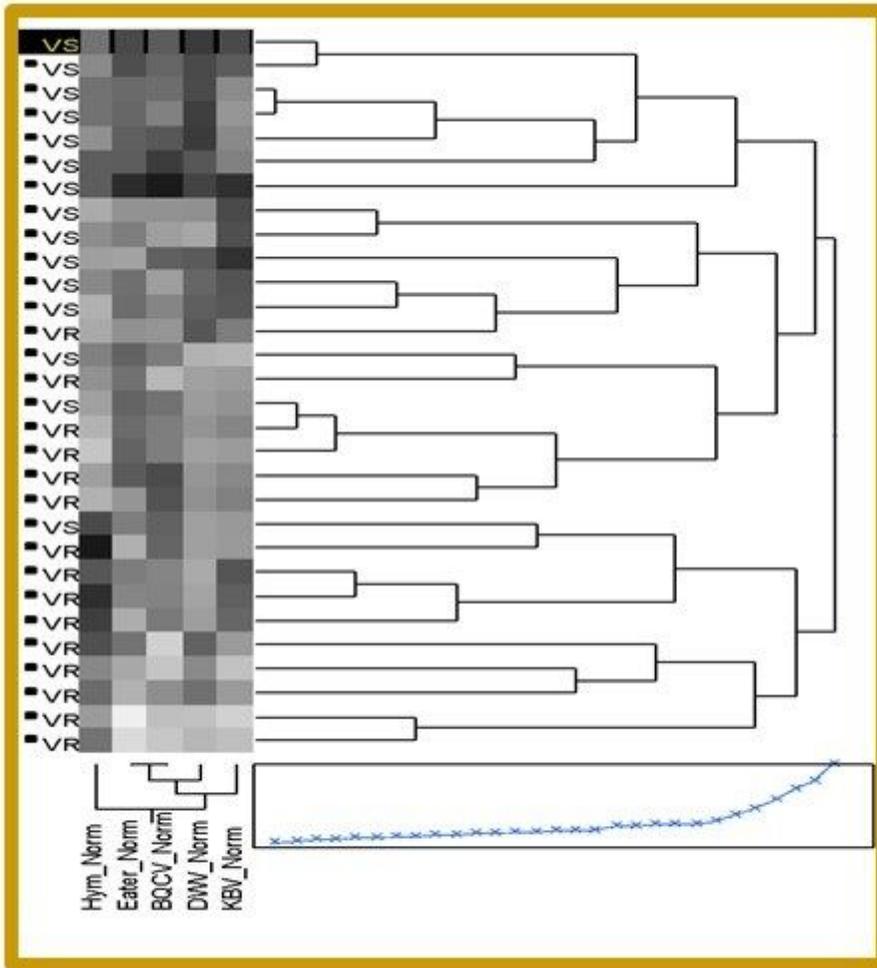
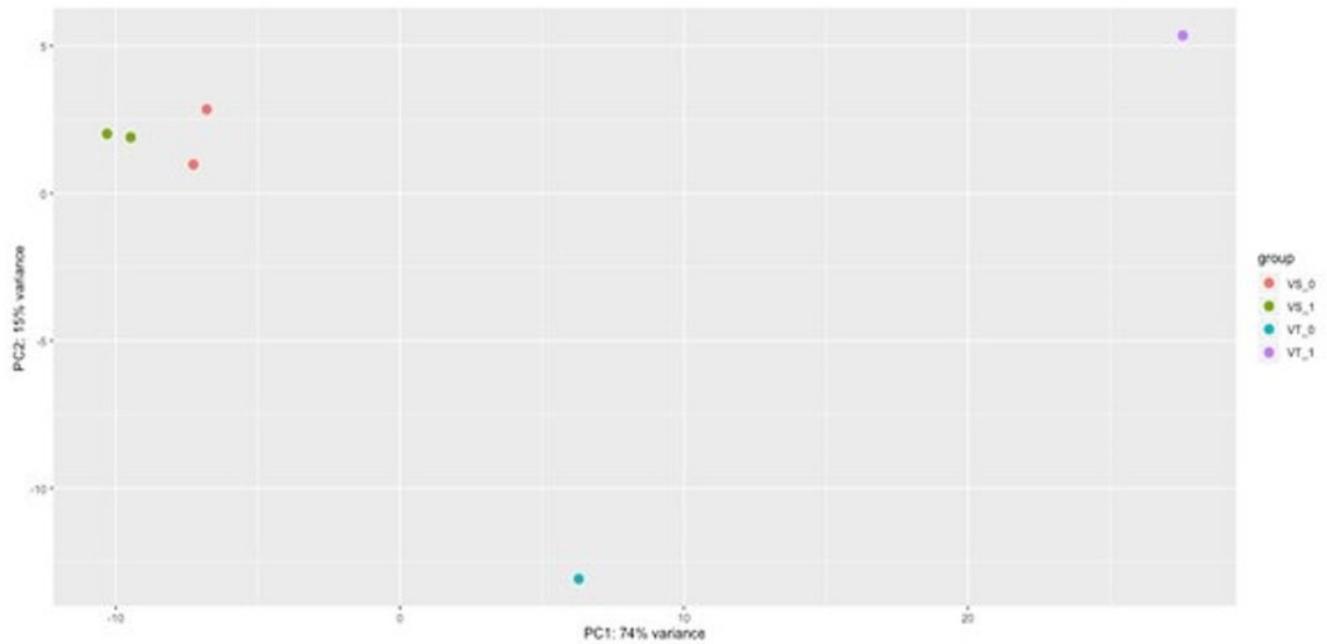


Figure 2

Figure 2

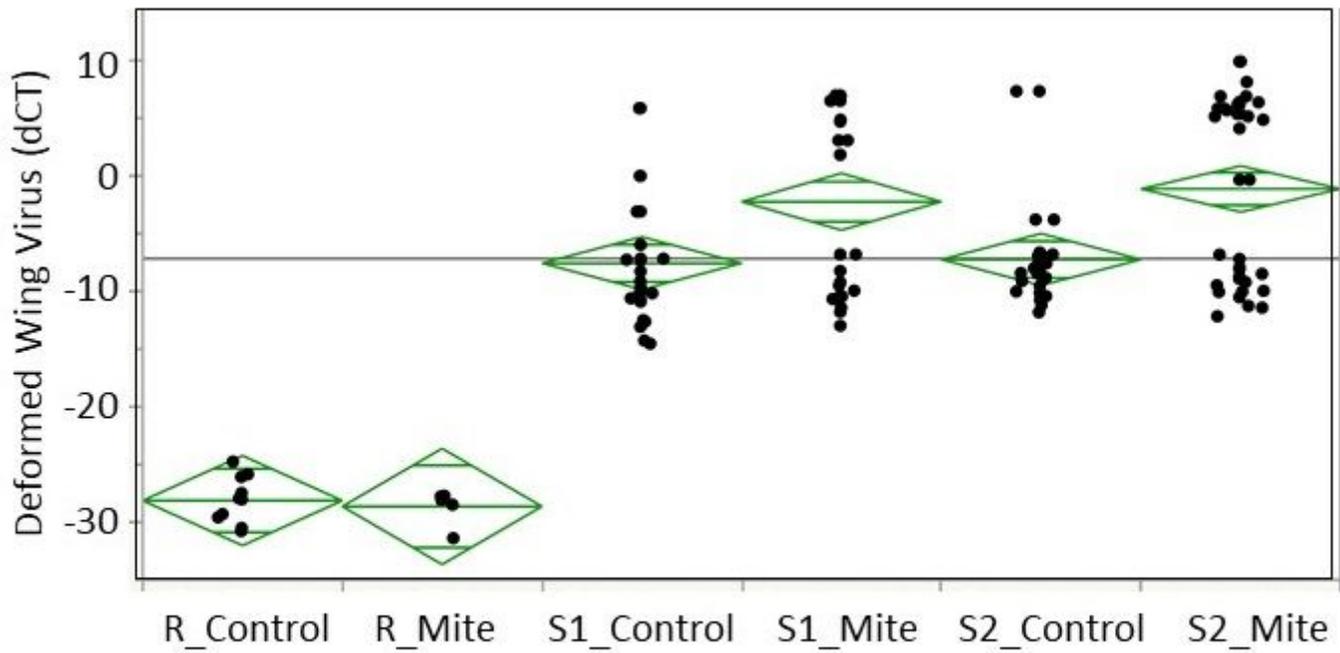
Clustering Diagram of Susceptible (VS) and Resistant (VR) samples from Experiment One, showing higher virus loads in VS bees than in VR bees and higher levels of Eater expression in VS bees, contrasted with slightly higher levels of Hymenoptaecin expression in VR bees.



**Figure 3**

**Figure 3**

Principal Component Analysis of Gene Expression Data produced by DESeq 2 for VS1, VS0, VT1 and VT0 samples. VS1 = S\_mite; VS0 = S\_control; VT1 = R\_mite; and, VT0 = R\_control. Note that PC1 captures 74% of the total variance between the samples, and shows the extreme divergence of R\_mite from S\_mite and S\_control. PC2 provides differentiation of R\_control from R\_mite, revealing much of the gene expression differences attributable to mite infestation of the R genetic background.

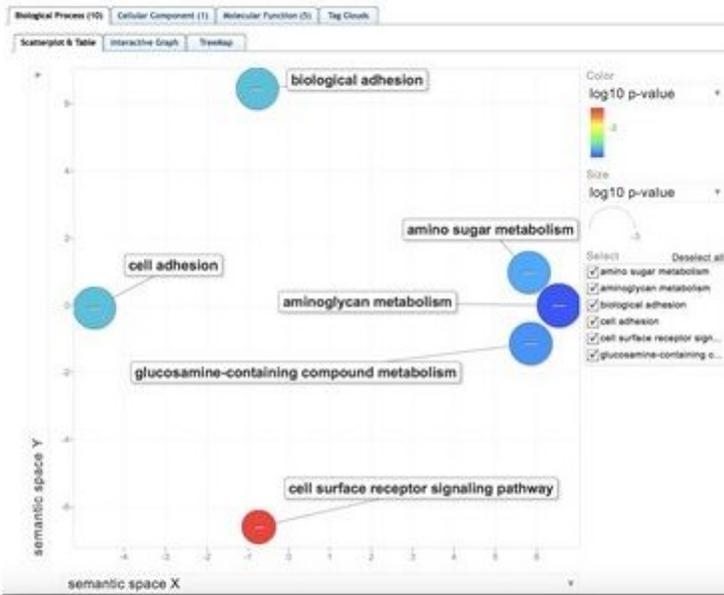


**Figure 4**

**Figure 4**

Quantitative PCR estimates of Deformed wing virus (d-CT) for the R\_control, R\_mite, S\_control, and S\_mite samples, showing mite-infested Susceptible honey bees with elevated DWV titers compared to Susceptible bees that were mite-free. Susceptible bees (two sources) had markedly higher levels of DWV than the Resistant bees, regardless of Varroa parasitism status; moreover, DWV loads of Resistant bees were not higher when mites were present.

a)



b)

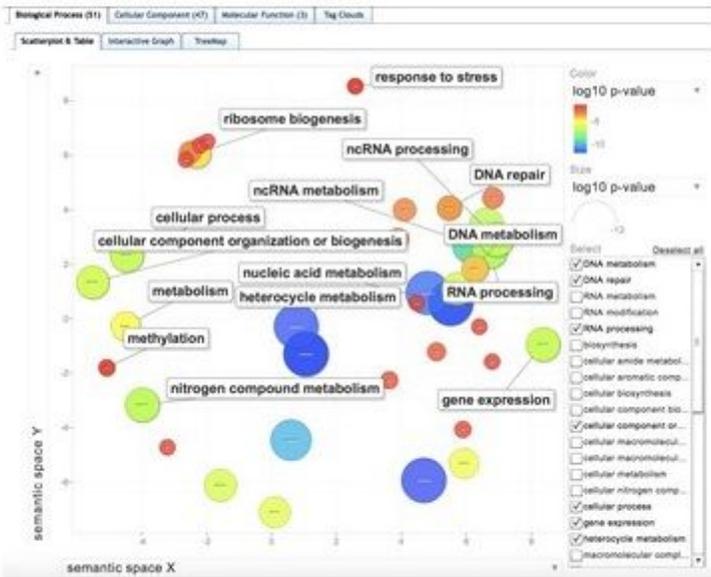


Figure 5

Figure 5

Scatterplot of enriched Biological Process Gene Ontology terms (GO BPs). a) Up-regulated in S bees with mites compared to R bees with mites (UP in S\_mite v. R\_mite), b) Down-regulated in S bees with mites compared to R bees with mites (DOWN in S\_mite v. R\_mite). GO enrichments and P-values were calculated using HymenopteraMine GO enrichment widgets after using HymenopteraMine database cross-references to convert gene identifiers to OGSv3.2, with the OGSv3.2 gene set as the background

population and a Benjamini-Hochberg multiple testing correction. The GO enrichment test dataset is comprised of genes with FDR < 0.05 and with expression level differences showing a log10 fold change greater than 1.5 (logFC>1.5). Scatterplot generated by ReviGo [29].

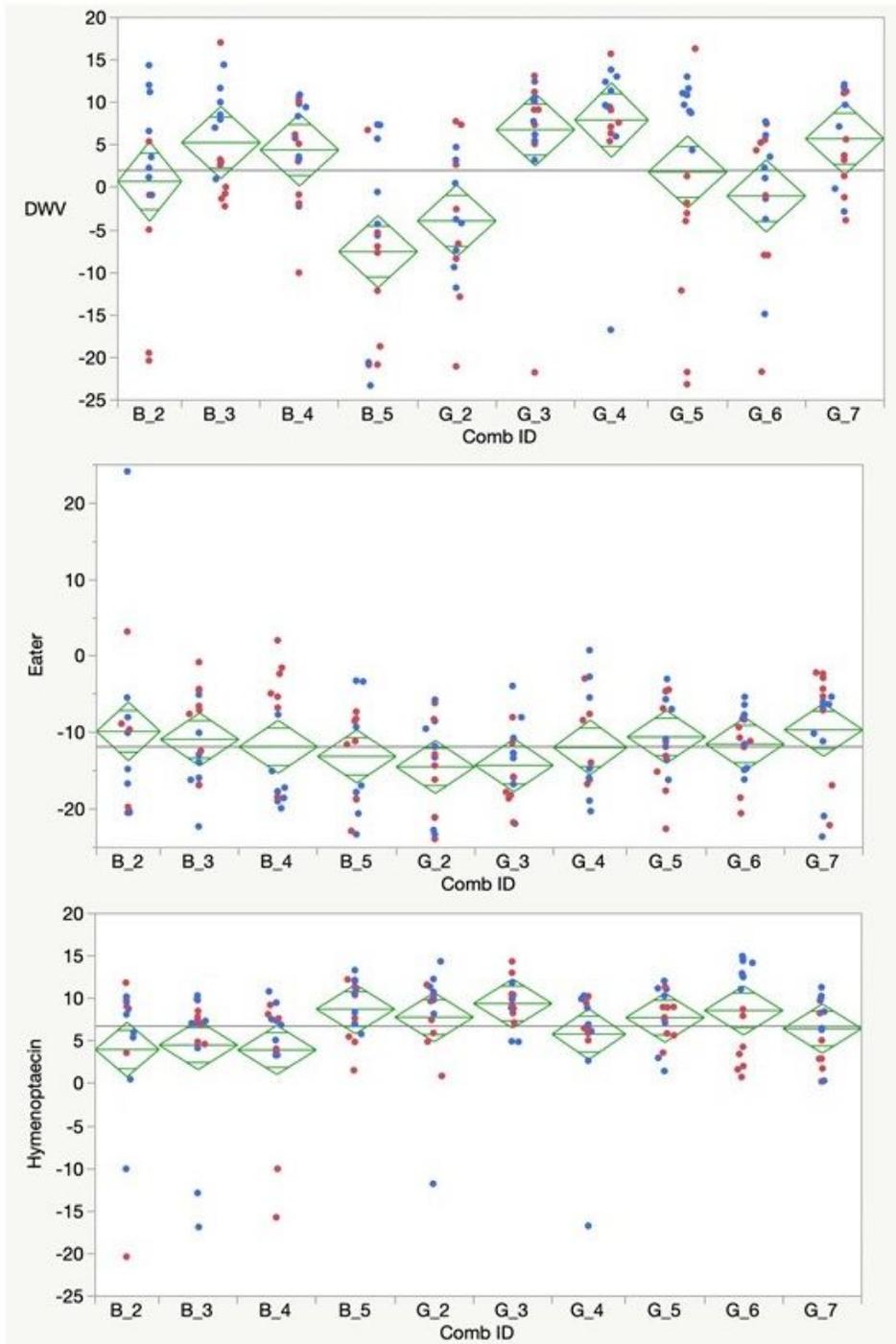


Figure 6

Figure 6

qPCR relative levels of Deformed wing virus and two immune-related genes, Eater and Hymenoptaecin. Blue dots reflect bees injected with DWV, red dots reflect bees given a PBS control injection. 'B' colonies

were predicted to be more susceptible while 'G' colonies were predicted to be resistant.

## Supplementary Files

This is a list of supplementary files associated with this preprint. Click to download.

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- [AdditionalFile2021821.docx](#)
- [AdditionalFile30.pptx](#)
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