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Chronic exposure to glyphosate induces transcriptional changes in honey bee larva:  
A toxicogenomic study

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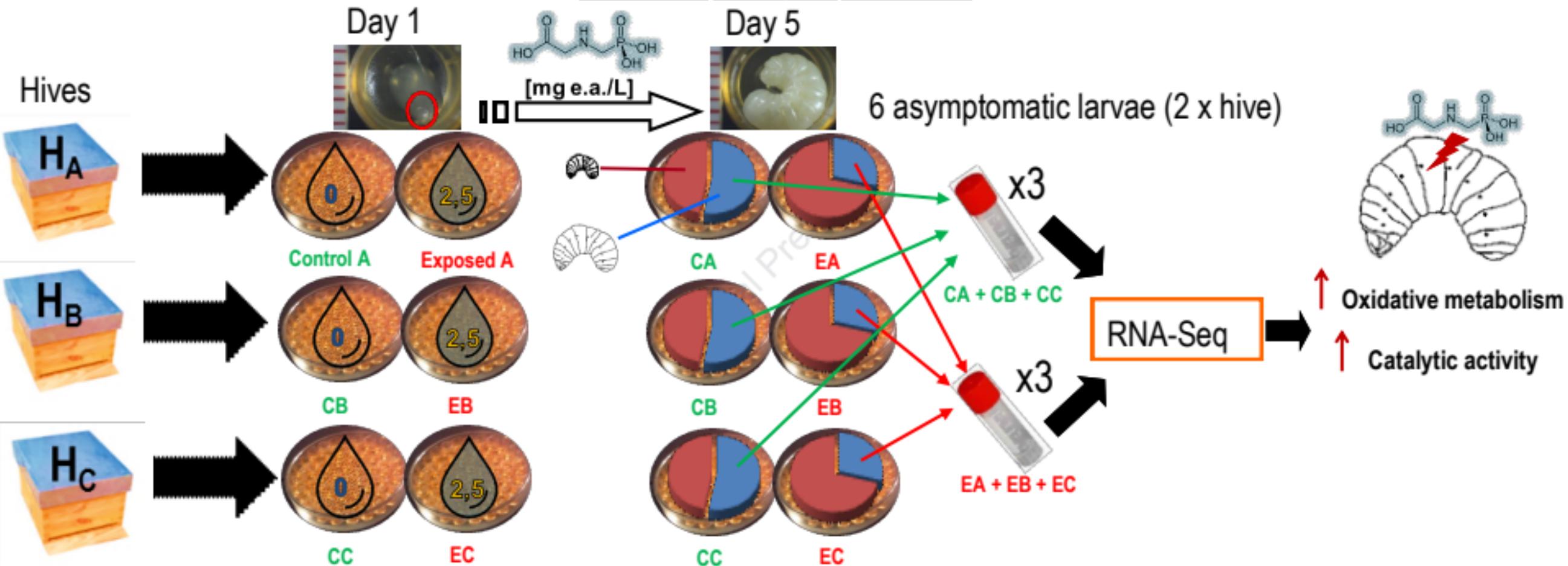
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# **Chronic exposure to glyphosate induces transcriptional changes in honey bee larva: a toxicogenomic study**

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**21 Abstract**

22 The honey bee *Apis mellifera* is the most abundant managed pollinator in diverse crops  
23 worldwide. Consequently, it is exposed to a plethora of environmental stressors, among  
24 which are the agrochemicals. In agroecosystems, the herbicide glyphosate (GLY) is one of  
25 the most applied. In laboratory assessments, GLY affects the honey bee larval development  
26 by delaying its moulting, among other negative effects. However, it is still unknown how  
27 GLY affects larval physiology when there are no observable signs of toxicity. We carried  
28 out a longitudinal experimental design using the *in vitro* rearing procedure. Larvae were fed  
29 with food containing or not a sub-lethal dose of GLY in chronic exposure (120 h).  
30 Individuals without observable signs of toxicity were sampled and their gene expression  
31 profile was analyzed with a transcriptomic approach to compare between treatments. Even  
32 though 29% of larvae were asymptomatic in the exposed group, they showed  
33 transcriptional changes in several genes after the GLY chronic intake. A total of 19  
34 transcripts were found to be differentially expressed in the RNA-Seq experiment, mainly  
35 linked with defensive response and intermediary metabolism processes. Furthermore, the  
36 enriched functional categories in the transcriptome of the exposed asymptomatic larvae  
37 were linked with enzymes with catalytic and redox activity. Our results suggest an  
38 enhanced catabolism and oxidative metabolism in honey bee larvae as a consequence of the  
39 sub-lethal exposure to GLY, even in the absence of observable symptoms.

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43 **Keywords:** *Apis mellifera*, RNA-Seq, *in vitro* rearing, transcriptomic, energy  
44 metabolism

45 **1. Introduction**

46 Animal pollination is a crucial ecosystem service for biosphere provided mainly by  
 47 different species of bees and other insects. Nevertheless, in most crops worldwide, the  
 48 honey bee *Apis mellifera* is the most used pollen vector (IPBES 2016). This generalist  
 49 pollinator is managed by pollination services placing beehives in agricultural settings.  
 50 Consequently, honey bees are exposed to different environmental stressors such as  
 51 landscape fragmentation, large-scale monocultures, extreme climate conditions, pathogens,  
 52 parasites and especially exposure to agrochemicals (Foley et al. 2005; Potts et al. 2010). In  
 53 croplands and surroundings, several routes of acute or chronic exposure to agrochemicals  
 54 occur, including the contact with spray drift, residues in vegetation and dust (IPBES 2016,  
 55 Krupke et al. 2012, Peruzzo et al. 2008). Once the food incomes into the beehive, there is a  
 56 rapid distribution of contaminated pollen, nectar and water among nestmates (Thompson et  
 57 al. 2014, Orantes-Bermejo et al. 2010, Blasco et al. 2003). All these concomitant factors in  
 58 sublethal exposure and in addition to their cumulative biological response make the honey  
 59 bee exposome (Traynor et al. 2016, Miller and Jones 2013). This concept places the toxic  
 60 exogenous agents in a broader context in which they interact with the inner physiology of  
 61 each animal, including its diet, behaviour and endogenous agents (e.g., metabolites and  
 62 microbiota). A maladaptive biological response of some individuals could affect the colony  
 63 survival. In this context, the honey bee becomes a suitable sentinel species for pollinator  
 64 community (Gerhardt 2002, Pham-Delegue et al. 2002, Bromenshenk et al. 1985),  
 65 especially those individuals under development within beehives, given that they are much  
 66 more vulnerable to environmental challenges (Wu et al. 2011). The interaction between  
 67 environment and individual's physiology in chronic adaptation can lead to a high allostatic  
 68 load and subclinical diseases (Juster et al. 2010). Therefore, the disturbed development of  
 69 honey bees could cause a long-term negative effect on the pollination service in  
 70 commercial crops.

71 One of the most applied agrochemicals in agriculture landscapes worldwide is the  
 72 active ingredient so-called glyphosate [N-(phosphonomethyl)glycine], henceforth: GLY  
 73 (Benbrook 2016, Duke and Powles 2008, Giesy et al. 2000). This biocide chemical takes  
 74 part in a wide range of herbicide formulations with broad-spectrum action. GLY became

extensively and intensively applied since the late 1990s due to the technological advances in genetically modified crops and no-till farming (Benbrook 2016, Duke and Powles 2008). This molecule inhibits the enzyme 5-enolpyruvylshikimate-3-phosphate synthase (EPSPS), part of the shikimate pathway, which exists only in higher plants, algae and bacteria (Duke and Powles 2008). The disruption of the aromatic amino acid biosynthesis is the main mechanism for toxicity of GLY. However, different studies have shown detrimental effects of GLY on the development and growth in a wide variety of animals (Seide *et al.* 2018, Dutra *et al.* 2011, Paganelli *et al.* 2010, Cauble and Wagner 2005, Marc *et al.* 2004, Tate *et al.* 1997). Indeed, a previous work reported an increased prevalence of delayed moulting in honey bee larvae exposed to GLY (Vázquez *et al.* 2018). This effect was observed mainly as reduced growth and prolonged duration of early larval stadia. In addition, other studies showed that GLY acts as a stressor during the larval development of *A. mellifera* under *in vitro* rearing by modulating some immune/detoxifying genes (e.g., antibacterial proteins and some cytochrome P450 monooxygenases) and inducing high levels of cell apoptosis in the gut epithelium (Gregorc *et al.* 2012, Gregorc and Ellis 2011). Although there is no a clear molecular mechanism of action, recent researches proved the disruption of gut microbiota in honey bees after GLY ingestion (Blot *et al.* 2019, Dai *et al.* 2018, Motta *et al.* 2018). This result is consistent with the biocide action of GLY in bacteria, but its direct or indirect connection with delayed growth or the occurrence of other harmful effects in bees is still unknown (Farina *et al.* 2019). After chronic exposure to GLY, young worker honey bees reared in the laboratory showed impaired associative learning, reduced sucrose sensitivity and depleted antioxidants associated with carotenoid–retinoid system (Goñalons and Farina 2018, Helmer *et al.* 2015, Herbert *et al.* 2014). The accumulated evidence suggests that chronic exposure to GLY is not harmless for bees; however, little is known about its consequences on brood physiology after the intake of contaminated food (El Agrebi *et al.* 2019, Berg *et al.* 2018, Chamkasem and Vargo 2017, Rubio *et al.* 2014). Thus, a toxicogenomic approach could provide a better understanding of the internal state of larvae exposed to this herbicide, even in the absence of external symptoms.

The aim of the present work has been to measure how GLY affects honey bee larva when there are no observable signs of toxicity. For this purpose, we carried out a

105 longitudinal randomized experiment in brood fed with food containing or not GLY, and  
106 assessed a transcriptomic analysis to compare gene expression between groups.

107

## 108 **2. Materials and Methods**

### 109 **2.1. Study site and animals**

110 The rearing experiment was performed in January 2018 (summer season in the  
111 southern hemisphere). Female honey bee larvae were sampled from brood frames from  
112 three healthy colonies (henceforth: A, B and C) and reared *in vitro* (see section 2.2). The  
113 colonies were housed in Langstroth hives at the experimental apiary of the Universidad de  
114 Buenos Aires, Argentina (34° 32' S, 58° 26' W). The queens from the three colonies are  
115 not genetically related and they had been naturally inseminated by multiple mates during  
116 free flights in the field (i.e., inter and intra-colony genetic diversity).

117

### 118 **2.2. *In vitro* rearing**

119 An empty frame was introduced into each colony (A-C) and monitored for 8 hours  
120 until the queen laid enough eggs. Three days later the brood frames were withdraw and  
121 carried to a room with suitable environmental conditions for grafting. Around 60 first  
122 stadium larvae were grafted (0-8 hour old post-hatching) from the brood frame to plastic  
123 cups and placed in Petri dishes (Crailsheim *et al.* 2013). This number of larvae represents  
124 around 5 % of a cohort (eggs laid in one day by the queen) and up to 0.5 % of colony in an  
125 average hive. The same person carried out this procedure to avoid variability in grafting  
126 effect. Larvae were reared inside an incubator with constant temperature and relative  
127 humidity (34.5 °C and 95%, respectively) during five days. To standardize larval food  
128 administration and GLY exposure, 110 µL of food spread in five aliquots of increasing  
129 volume were provided to each larva during the 5 days of the feeding period: 10 µL during  
130 grafting, 10 µL at 24 h, 20 µL at 48 h, 30 µL at 72 h and 40 µL at 96 h (Aupinel *et al.*  
131 2005). A previously established diet was used: 6% D-glucose, 6% D-fructose, 1% yeast  
132 extract (Sigma-Aldrich) and 50% commercial royal jelly (Kaftanoglu *et al.* 2011,  
133 Vandenberg and Shimanuki 1987). In order to prevent bacterial or fungal contamination  
134 dead larvae were removed every day.

135

136 **2.3. Exposure to GLY**

137 The accurate concentration of GLY in brood food (bee bread or royal/worker jelly)  
138 offered to larvae inside the hive during field exposure have not yet been determined, but the  
139 herbicide is actually ingested by larvae (Farina *et al.* 2019, Thompson *et al.* 2014, USEPA  
140 2012, Raina-Fulton 2014). Therefore, the worst-case exposure scenario was assumed, and a  
141 chronic exposure (0-120 h post-hatching) was chosen, considering the highest  
142 concentration of GLY reported in agricultural landscapes and its median expected  
143 environmental concentration (Farina *et al.* 2019). Two treatments for larva reared *in vitro*  
144 were defined: control group (food without herbicide) and exposed group, food with 2.5 mg  
145 a.e. (acid equivalent) of GLY (analytical standard provided by Sigma-Aldrich, purity of  
146 99.2 %) per litre of food. For this, a GLY stock solution of 100 mg a.e. L<sup>-1</sup> (bi-distilled  
147 water as solvent) was diluted in food solution. Food was renewed once a week due to the  
148 slight photodegradation of GLY (Duke and Powles 2008).

149

150 **2.4. Endpoints**

151 The status of each larva during the 120 h of exposure was daily checked. Each  
152 larval stadium can be identified by its morphological traits (Human *et al.* 2013). Whenever  
153 a larva had a smaller size or different characteristics from the stadium in that is expected to  
154 be, it was classified as “in delay” and separated from the remainders with an optimal  
155 growth (Vázquez *et al.* 2018; Wu *et al.* 2011). Besides, larvae were classified as dead when  
156 their colour changed to brownish, they developed oedema or remained immobile  
157 (Crailsheim *et al.* 2012). The “relative risk ratio” and its confidence interval (Katz *et al.*  
158 1978) were calculated when significant differences in either survival or successful moulting  
159 proportions were observed.

160

161 **2.5. Biological samples and RNA isolation**

162 After the chronic *in vitro* exposure, larvae with optimal growth (i.e., with a success  
163 moult in each moulting event and similar size) represented the asymptomatic  
164 subpopulation, regardless if they belonged to GLY exposed or control groups. The

165 biological replicates for the gene expression experiments were pools of 6 asymptomatic  
 166 larvae (2 larvae from each colony A-C) per treatment. Larvae were sampled in TRIzol®  
 167 reagent (Sigma-Aldrich) and temporally stored in liquid nitrogen. We sampled only 5-day  
 168 old larvae with complete intake to homogenize nutritional state. Each larva was weighed  
 169 with a precision balance (Mettler Toledo AG285,  $\pm 0.1$  mg). Therefore, the 110  $\mu$ L of  
 170 ingested food was equivalent to a dose of 0 in the control group or 275 ng a.e. of GLY in  
 171 exposed group. Pooled larvae were homogenized using sterilized pestles in cold and total  
 172 RNA was extracted using TRIzol® according to the supplier's protocol and resuspended in  
 173 90  $\mu$ L of DEPC-treated water. RNA integrity and quality were assessed by means of a 1%  
 174 agarose electrophoresis gel and in Agilent 2100 Bioanalyzer (Agilent Technologies).

175

## 176 **2.6. RNA sequencing**

177 The gene expression profiling of pooled larvae (section 2.5) was carried out with 3  
 178 biological replicates per treatment (control vs. GLY exposed). Library construction and  
 179 high-throughput sequencing services were hired at Novogene Corporation Inc.  
 180 (Sacramento, USA). A total of 6 cDNA libraries were constructed using the NEB Next®  
 181 Ultra™ RNA Library Prep Kit (New England Biolabs) with an insert length of 250-300  
 182 base pairs (bp). The libraries were sequenced using Illumina HiSeq2000 equipment (paired-  
 183 end 150 bp) with a sequencing depth of at least 21 million paired-end reads per library  
 184 (Conesa *et al.* 2016, Rajkumar *et al.* 2015, Fang and Cui 2011). The raw sequence dataset  
 185 is available at the NCBI BioProject database with the accession number PRJNA587756  
 186 (Table S1 and S2).

187

## 188 **2.7. Bioinformatic analysis**

189 Differential expression analysis was performed with an empirical Bayes approach  
 190 for small samples based on a negative binomial distribution using the edgeR package  
 191 (Robinson *et al.* 2010) (for details in the bioinformatic procedure and cites see  
 192 Supplementary information). Those genes with a false discovery rate (FDR)  $< 0.1$  were  
 193 considered as differentially expressed between control and exposed groups and genes with  
 194 logarithm2-fold-change more than  $\pm 0.5$  were considered with relevant biological signal.

195 Enrichment analysis of all genes of the transcriptomic result was carried out with the  
 196 ermineR package using the Gene Score Resampling method (Gillis *et al.* 2010). The  
 197 functional categories were determined using Gene Ontology (GO) terms from BeeBase  
 198 (Gene Ontology Consortium 2018, Elsik *et al.* 2016, Honey Bee Genome Sequencing  
 199 Consortium 2014).

200

### 201 **2.8. qRT-PCR**

202 The differential expression results from RNA-Seq were complemented with qRT-  
 203 PCR (Everaert *et al.* 2017). For this purpose, we selected 5 genes from the set of  
 204 differentially expressed genes (DEGs). Their expression level was analysed using 4  
 205 biological replicates per treatment (control and exposed group) independent from those  
 206 used for RNA-Seq and prepared as described above (section 2.5). A total of 1.5 µg of total  
 207 RNA were treated with DNaseI (Promega). cDNA was synthesized with 15.5 µL of treated  
 208 RNA per sample by means of the M-MLV reverse transcriptase system (Promega). qRT-  
 209 PCRs were performed in an AriaMx Real-Time PCR System (Agilent Technologies) using  
 210 6 µL of FastStart Universal Master Mix (Hoffmann-La Roche), 0.5 µL of a 10 µM forward  
 211 and reverse primer solution and 1.5 µL of 4-fold diluted cDNA in final volume of 12 µL.  
 212 Primers were designed using Primer3 v4.0.0 (<http://primer3.wi.mit.edu>) and efficiency was  
 213 calculated for each primer pair (Table S2). Reactions were performed in technical triplicate  
 214 under the following conditions: 10 min at 95 °C; 40 cycles of 20 s at 95 °C; 20 s at 56-58  
 215 °C and 30 s at 72 °C. In all qRT-PCR experiments, no-template controls were included.  
 216 The efficiency and amplification of a single fragment was evaluated for each primer pair  
 217 (Table S3) (Taylor *et al.* 2010). The expression of *GAPDH*, *Rp18S* and *Rp49S* was used to  
 218 normalize target gene expression (Table S4 and Fig S1A). These genes were previously  
 219 described as stable reference genes in *A. mellifera* (Lourenço *et al.* 2008, Scharlaken *et al.*  
 220 2008). Gene expression ratio was calculated by means of the Pfaffl formula (Pfaffl 2001).

221

### 222 **2.9. Statistics**

223 We performed data analysis and graphics in R (for details and cites see  
 224 Supplementary Information). Survival and developmental data were analyzed with Cox

225 Proportional Hazard models (CPH). Weighing data were transformed with Box-Cox  
 226 method to meet the statistical assumptions and analyzed with generalized linear models  
 227 (GLM). Gene expression data from qRT-PCR were analyzed with principal components  
 228 (PCA) and Mann-Whitney *U* test for comparison between treatments for each gene. The  
 229 alpha level was set at 0.1 and p-value corrected for multiple post-hoc comparisons with  
 230 Benjamini-Hochberg procedure.

231

### 232 **3. Results**

#### 233 **3.1. Signs of toxicity in larvae fed with GLY**

234 In order to detect changes in the physiology of honey bee larvae without observable  
 235 signs of disturbed development after ingesting GLY (Table S5), we tracked brood during  
 236 the exposure period (0-120 h) searching for the occurrence of the endpoints (death or delay,  
 237 Figure 1).

238 Thirty percent of the brood in the control group died at the age of  $84 \pm 27$  h, around  
 239 the last larval moult. Those larvae exposed to GLY dead at a similar age ( $80.9 \pm 24$  h) and  
 240 did not differ with the control group in survival proportion (CPH model: survival ~ [GLY]  
 241 + strata(colony),  $\chi^2(1) = 1.74$ ,  $P = 0.187$ ,  $N = 364$ ). However, a significant increase in the  
 242 proportion of larvae with delayed development during the exposure to GLY was observed  
 243 (CPH model: successful moulting ~ [GLY] + strata(colony).  $\chi^2(1) = 10.57$ ,  $P = 0.001$ ,  $N =$   
 244 364). Forty-four percent of the brood in the control group displayed a delay in at least one  
 245 moult with delay of  $55.0 \pm 26$  h. Nevertheless, sixty-two percent of larvae in the group  
 246 exposed to GLY displayed a moulting process with delay of  $60.7 \pm 33$  h. Hence, the  
 247 relative risk ratio associated with the delayed development and the exposure to GLY was  
 248 1.43 (confidence interval of 95%: 1.20-1.69). Therefore, GLY affected the larval  
 249 development of a subpopulation of brood in the longitudinal experiment, increasing the  
 250 incidence of delayed moulting.

251 At the end of the experiment (120 h), 53% of brood in the control group and 29% in  
 252 the exposed group did not show disruptions in the larval development (delay, death or  
 253 both). Thereupon, we sampled from these asymptomatic subpopulations those larvae with  
 254 full intake and similar size ( $89.89 \pm 8.8$  mg in control group and  $89.95 \pm 12.44$  mg in

255 exposed group. GLM model: Box-Cox(weight) ~ [GLY].  $F(1,94) = 0.64$ ,  $P = 0.426$ ,  $N =$   
 256 96).

257

### 258 3.2. Gene expression profiling of asymptomatic larvae

259 The transcriptomes derived from the samples of asymptomatic larvae with or  
 260 without the intake of GLY allowed us to explore differences in gene expression using  
 261 RNA-Seq. Less than 10% of the raw read pairs were eliminated after quality control.  
 262 Between 20 and 24 million of clean reads were obtained per library (biological replicate).  
 263 More than 88% of reads mapped to the honey bee genome (Table S1 and S2).

264 Nineteen coding transcripts (0.22% of protein-coding genes expressed in samples)  
 265 were found to be differentially expressed (7 up and 12 down-regulated in exposed larvae  
 266 relative to control group) (Figure 2 and Table S6). The magnitude of the fold change ranged  
 267 from 0.6 to 0.1 for the genes under-expressed and from 1.7 to 2.7 for the genes over-  
 268 expressed in the exposed group. The DEGs were characterized by information about their  
 269 function and dominant expression in tissues provided by different genome databases (Table  
 270 S7). Moreover, all genes in the transcriptomes were classified according to functional  
 271 categories based on the Gene Ontology classification (Table 1). The most enriched GO  
 272 terms of biological processes and molecular functions in the exposed larvae were lipid  
 273 metabolism (with a high percentage of genes with low FDR) and oxidoreductase activity  
 274 (with a high percentage of genes with large fold-change).

275 Finally, we choose 5 transcripts from the DEG set (*CYP6AS3*, *GB46620*, *SLC1*, *EST*  
 276 and *UGT1-3*) to quantify their expression levels by qRT-PCR in independent biological  
 277 replicates from the same cohort under study (Figure 3). *UGT1-3* showed a significant up-  
 278 regulation between treatments while *SLC1* and *EST* showed a meaningful biological  
 279 modulation on their average expression ratio, 50% of down-regulation and 83% of up-  
 280 regulation respectively (Mann Whitney *U* test: *CYP6AS3*:  $W = 4$ ,  $P = 0.248$ . *GB46620*:  $W$   
 281 = 8,  $P = 1$ . *SLC1*:  $W = 14$ ,  $P = 0.08$ . *EST*:  $W = 2$ ,  $P = 0.08$ . *UGT1-3*:  $W = 1$ ,  $P = 0.04$ ).  
 282 Furthermore, two principal components (PC1 and PC2) achieving 68% of the cumulative  
 283 proportion of deviation were obtained from a PCA with the 5 genes (Table S8). Although  
 284 there was variation in the gene expression ratio among samples in qRT-PCR (Table S9), the

285 PCA showed more similarity among samples from the same treatment in the internal state  
 286 based on those genes (Figure S1B). Lastly, the effect of GLY exposure in the transcript's  
 287 abundance of *UGT1-3* had similar response in direction (over-expression) in both qRT-  
 288 PCR and transcriptomic procedures, with high read counts and moderate variability in the  
 289 latter (Table S6).

290

## 291 **4. Discussion**

### 292 **4.1. Transcriptional changes in asymptomatic larvae**

293 In agreement with previous results (Vázquez et al 2018), the chronic self-dosing of GLY in  
 294 the honey bee brood has sub-lethal effects in the larval development under *in vitro* rearing  
 295 conditions. GLY acts as a risk factor increasing the incidence of delayed moults. Moreover,  
 296 the gene expression profiling in the asymptomatic subpopulation suggests alterations in  
 297 their physiology after the chronic intake of GLY. A set of 19 coding transcripts was found  
 298 to be differentially expressed in their whole body. This modulation was mainly restricted to  
 299 genes related to the defensive response against environmental stressors (37%) and the  
 300 intermediary metabolism (26%) (Table S7). Furthermore, the most enriched functional  
 301 categories in the whole transcriptome (Table 1) were those associated to enzymes with  
 302 catalytic and redox activities. Most of the DEGs have been reported in *Drosophila*  
 303 *melanogaster* with predominant transcription in the gut epithelium, integument and  
 304 Malpighian tubules (Table S7) (Thurmond et al. 2019). These organs are directly exposed  
 305 to the herbicide which would indicate an inner adjustment of the larval physiology as a  
 306 consequence of the oral and epidermal exposures.

307 A complete correlation between RNA-Seq and RT-qPCR results should be  
 308 expectable for those experiments dealing with an acute treatment with a relative simple  
 309 mode of action and a great modulatory effect on gene expression. In the current study, we  
 310 identified transcriptional changes triggered by chronic exposure to a chemical whose action  
 311 mechanism is unknown in insects and seems to act at different levels, e.g. in gut microbiota  
 312 (Blot et al. 2019, Dai et al. 2018, Motta et al. 2018). Besides, Vázquez and co-workers  
 313 (2018) observed that the impact of GLY among colonies was not homogeneous. Even  
 314 individuals of the same colony could present different response profiles to GLY due to the

315 different self-dosing of each larva and the variation in susceptibility of its microbiota  
 316 (Motta *et al.* 2018, Vázquez *et al.* 2018). Hence, the results presented here are a snapshot of  
 317 a dynamic process and several individuals within the same group could have been caught in  
 318 different points along their toxicological response. We consider both RNA-Seq and RT-  
 319 qPCR as complementary procedures to identify changes, that in our case we expect to be  
 320 subtle. Therefore, the current detection of signs of transcriptional modulation constitutes a  
 321 meaningful piece of information revealing a physiological reaction of the larva against the  
 322 herbicide in an allostatic process (Juster *et al.* 2010), even in the absence of evident  
 323 symptoms of toxicity.

324

#### 325 **4.2. Signs of detoxification and dysbiosis**

326 Phytochemicals and pesticides present in food or nest were shown to modulate similar  
 327 genes during the defensive response in honey bees (Poquet *et al.* 2016, Mao *et al.* 2013,  
 328 James and Xu 2012, Johnson *et al.* 2012). In the current study, genes related to immunity  
 329 (*pacifastin* and *MME*), plant-herbivore interaction (*G12-like protein*), epigenetic  
 330 mechanisms of disrupted microbiota (GB46620) and detoxification were modulated by  
 331 GLY. In the latter process, three genes belong to phase I (*CYP6AS3*) and phase II (a  
 332 sulfotransferase and *UGT1-3*) in the biotransformation of xenobiotics (Timbrell 2008,  
 333 Cladíanos *et al.* 2006). Previous works showed that *CYP6AS3* detoxified xenobiotics  
 334 present in honey and beebread, such as quercetin (Mao *et al.* 2013, Johnson *et al.* 2012).  
 335 Meanwhile, the UDP-glycosyltransferase gene (*UGT1-3*) was related to the glycosylation  
 336 (UDP-glucose as sugar donor) of small hydrophobic molecules (Ahn *et al.* 2012). Many  
 337 endogenous compounds are glycosylated, such as ecdysteroid hormones and cuticle tanning  
 338 precursors (Hu *et al.* 2019, Ahn *et al.* 2012). The xenobiotic metabolism and immunity  
 339 have been consistently modulated by the intake of GLY in honey bee brood in different  
 340 experiments (Vázquez *et al.* 2018, Gregorc *et al.* 2012). Nevertheless, it is currently  
 341 unknown if these enzymes metabolize GLY or other chemical that could be generated  
 342 secondarily, e.g. toxins from the dysbiosis in gut microbiota (Blot *et al.* 2019, Dai *et al.*  
 343 2018, Motta *et al.* 2018). Therefore, the long-term trend in gene modulation does not  
 344 necessarily reflect a specific gene activation or repression capacity of GLY (Samsel and

345 Seneff 2013). Besides that, expression of an apoptotic signalling gene (*SMPDI*) was  
 346 significantly modulated in our experiment. The induction of apoptosis suggested by this  
 347 result is in agreement to a previous study (Gregorc and Ellis 2011). Furthermore, the most  
 348 up-regulated transcript was a metalloprotein related to inflammatory response (*MME*).  
 349 These are toxicity signs frequently associated with dysbiosis (Samsel and Seneff 2013).

350

#### 351 **4.3. Signs of metabolic stress**

352 Triggering of stress compensatory mechanisms induces energy consumption (Wang *et al.*  
 353 2019, Li *et al.* 2017, Avigliano *et al.* 2014), which could disrupt the moulting process in  
 354 honey bees due to a trade-off between growth and defensive response. The herbicide  
 355 showed adverse effects in growth of various invertebrates including honey bees (Vázquez  
 356 *et al.* 2018, Dutra *et al.* 2011, Marc *et al.* 2004, Tate *et al.* 1997). Although more  
 357 physiological experiments should be performed, the functional analysis presented here  
 358 provides evidence of alterations in the energetic metabolism. On one hand, the most down-  
 359 regulated transcripts were a branched-chain-amino-acid transaminase (GB49819) and a  
 360 fatty acid hydroxylase (GB40899) related to protein and lipid catalytic metabolism  
 361 respectively. Lipids and amino acids contribute to energy metabolism by providing carbon  
 362 source into the Krebs cycle, especially when the primary sources of energy (trehalose and  
 363 glycogen) are scarce (Nation 2015) (GO:0006629 and GO:0008610). On the other hand,  
 364 one of the most enriched functional categories was iron-binding proteins (GO:0005506).  
 365 These are important metalloproteins that contribute in solute transport (*SLC1*) and defense  
 366 response, such as *MME* and CYP450s (Dlouhy and Outten 2013, Claudianos *et al.* 2006,  
 367 De Sousa *et al.* 1988). The other most enriched category was alcohol oxidoreductase  
 368 enzymes (GO:0016614 and EC 1.1). These enzymes are mainly dehydrogenases and also  
 369 take part in the energetic metabolism and phase I in xenobiotic metabolism (IUBMB 1992).  
 370 Isocitrate dehydrogenase is the major control point in the Krebs cycle modulated by the  
 371 concentration of ATP and other metabolites (Nation 2015). In addition, cells use the  
 372 coenzyme FAD (Flavin Adenine Dinucleotide) associated with flavoproteins (GO:0050662  
 373 and GO:0050660) in many energetically difficult oxidation reactions such as  
 374 dehydrogenation, because it is a very strong oxidizing agent. Flavoproteins take part in a

375 large variety of energetic metabolic pathways including beta-oxidation of fatty acids and  
376 amino acid catabolism (Nation 2015, Iida *et al.* 2007, Patterson and Bates 1989). All the  
377 mentioned enzymes and biological processes have a crucial role in the redox homeostasis.  
378 Disturbances in the normal redox state of cell can cause toxic effects through the  
379 production of reactive oxygen species. Oxidative stress is associated with increased  
380 production of oxidizing compounds during catabolism and severe oxidation can trigger  
381 apoptosis and energy depletion (Lelli *et al.* 1998). These toxic oxidants are removed by  
382 antioxidant metabolites and different enzymes. In this sense, in a previous laboratory  
383 assessment with adult honey bees exposed chronically to GLY, the authors reported a  
384 decrease in antioxidants (Helmer *et al.* 2015).

385

386 **4.4. Implications in field assessments**

387 The present results suggest that open or semi-field assessments need to consider  
388 measurements of internal state regarding conspicuous endpoints, such as death or delayed  
389 development (Thompson *et al.* 2014). The hazard analysis of stressors, one at a time, in  
390 laboratory gives the advantage to identify useful biomarkers of effect or exposure for  
391 biomonitoring (Gerhardt 2002). Although samples of whole body insects makes more  
392 difficult the detection of organ-specific changes, this kind of sampling allowed us to  
393 describe in a holistic way changes in the transcriptional state of brood and establish a  
394 reference due to the unfeasible dissections of larvae *in situ*. Finally, in open field assays it is  
395 important not to lose sight of the exposome of each honey bee colony that is a result of  
396 different kind of acute or chronic disturbances in brood or adults honey bees (Traynor *et al.*  
397 2016, Miller and Jones 2013). These exposures could affect the biological fitness to cope  
398 with concomitant stressors, as previously demonstrated for GLY and mosquitoes (Riaz *et*  
399 *al.* 2009) even if there are not observable signs of toxicity.

400

401 **Conclusion**

402 Our results suggest an increase of the catabolism and oxidative metabolism in honey bee  
403 asymptomatic larvae chronically exposed to GLY. A maladaptive physiological response in  
404 early stages in life cycle could lead to long-term negative effects on bee populations.

405

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416 W.M.F., S.O. and J.M.L.; Writing - original draft: D.E.V. and W.M.F.; Writing - review &  
417 editing: D.E.V., W.M.F., J.M.L. and S.O.; Supervision: W.M.F. and S.O.; Project  
418 administration: W.M.F.; Funding acquisition: W.M.F and S.O.

419

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421

422 **References**

423 Ahn SJ, Vogel H, Heckel DG (2012). Comparative analysis of the UDP-glycosyltransferase  
424 multigene family in insects. Insect Biochem Molec, 42(2), 133-147.

425

426 Aupinel P, Fortini D, Dufour H, Tasei J, Michaud B, *et al.* (2005). Improvement of  
427 artificial feeding in a standard *in vitro* method for rearing *Apis mellifera* larvae. B Insectol,  
428 58(2): 107-111.

429

430 Avigliano L, Fassiano AV, Medesani DA, De Molina MR, Rodríguez EM (2014). Effects  
431 of glyphosate on growth rate, metabolic rate and energy reserves of early juvenile crayfish,  
432 *Cherax quadricarinatus* M. B Environ Contam Tox, 92(6), 631-635.

433

434 Benbrook CM (2016). Trends in glyphosate herbicide use in the United States and globally.  
435 Environ Sci Eur, 28(1), 3.

436

437 Berg CJ, King HP, Delenstarr G, Kumar R, Rubio F, *et al.* (2018). Glyphosate residue  
438 concentrations in honey attributed through geospatial analysis to proximity of large-scale  
439 agriculture and transfer off-site by bees. PloS one, 13(7), e0198876.

440

441 Blasco C, Fernández M, Pena A, Lino C, Silveira MI, *et al.* (2003). Assessment of pesticide  
442 residues in honey samples from Portugal and Spain. J Agr Food Chem, 51(27), 8132-8138.

443

- 444 Bromenshenk JJ, Carlson SR, Simpson JC, Thomas JM (1985). Pollution monitoring of  
445 Puget Sound with honey bees. *Science*, 227, 632–634.
- 446
- 447 Blot N, Veillat L, Rouzé R, Delatte H (2019). Glyphosate, but not its metabolite AMPA,  
448 alters the honeybee gut microbiota. *PloS one*, 14(4), e0215466.
- 449
- 450 Cauble K, Wagner RS (2005). Sublethal effects of the herbicide glyphosate on amphibian  
451 metamorphosis and development. *B Environ Contam Tox*, 75(3): 429–435.
- 452
- 453 Chamkasem N, Vargo JD (2017). Development and independent laboratory validation of an  
454 analytical method for the direct determination of glyphosate, glufosinate, and  
455 aminomethylphosphonic acid in honey by liquid chromatography/tandem mass  
456 spectrometry. *J Regul Sci*, 5(2), 1-9.
- 457
- 458 Claudianos C, Ranson H, Johnson RM, Biswas S, Schuler MA, et al. (2006). A deficit of  
459 detoxification enzymes: pesticide sensitivity and environmental response in the honeybee.  
460 *Insect Mol Bio*, 15(5), 615-636.
- 461
- 462 Conesa A, Madrigal P, Tarazona S, Gomez-Cabrero D, Cervera A, et al. (2016). A survey  
463 of best practices for RNA-seq data analysis. *Genome Biol*, 17(1), 13.
- 464
- 465 Crailsheim K, Brodschneider R, Aupinel P, Behrens D, Genersch E, et al. (2013). Standard  
466 methods for artificial rearing of *Apis mellifera* larvae. *J Apicul Res*, 52(1): 1-16.
- 467
- 468 Dai P, Yan Z, Ma S, Yang Y, Wang Q, et al. (2018). The herbicide glyphosate negatively  
469 affects midgut bacterial communities and survival of honey bee during larvae reared *in*  
470 *vitro*. *J. Agric. Food Chem*, 66 (29): 7786–7793. <https://doi.org/10.1021/acs.jafc.8b02212>  
471 PMID: 29992812
- 472

- 473 De Sousa M, Breedvelt F, Dynesius-Trentham R, Trentham D, Lum J (1988). Iron,  
 474 Iron-binding Proteins and Immune System Cells. Ann NY Acad Sci, 526(1), 310-322.
- 475
- 476 Dlouhy AC, Outten CE (2013). The Iron Metallome In Eukaryotic Organisms. Metallomics  
 477 And The Cell (pp. 241-278). L. Banci (Ed.). Dordrecht, The Netherlands Springer.
- 478
- 479 Duke SO, Powles SB (2008). Glyphosate: a once in a century herbicide. Pest Manag Sci,  
 480 64(4): 319–325. <https://doi.org/10.1002/ps.1518> PMID: 18273882
- 481
- 482 Dutra BK, Fernandes FA, Failace DM, Oliveira GT (2011). Effect of roundup (glyphosate  
 483 formulation) in the energy metabolism and reproductive traits of *Hyalella castroi*  
 484 (Crustacea, Amphipoda, Dogielinotidae). Ecotoxicology, 20(1): 255–263.  
 485 <https://doi.org/10.1007/s10646-010-0577-x> PMID: 21086158
- 486
- 487 El Agrebi N, Tosi S, Wilmart O, Scippo ML, de Graaf DC, et al. (2019). Honeybee and  
 488 consumer's exposure and risk characterisation to glyphosate-based herbicide (GBH) and its  
 489 degradation product (AMPA): Residues in bee bread, wax, and honey. Sci Total Environ,  
 490 135312. <https://doi.org/10.1016/j.scitotenv.2019.135312>
- 491
- 492 Elsik CG, Tayal A, Diesh CM, Unni DR, Emery ML, et al. (2016). Hymenoptera Genome  
 493 Database: integrating genome annotations in HymenopteraMine. Nucleic Acids Res,  
 494 44(D1):D793-800. doi: 10.1093/nar/gkv1208 10. Epub 2015 Nov 17. PubMed PMID :  
 495 26578564.
- 496
- 497 Everaert C, Luypaert M, Maag JL, Cheng QX, Dinger ME, et al. (2017). Benchmarking of  
 498 RNA-sequencing analysis workflows using whole-transcriptome RT-qPCR expression  
 499 data. Sci Rep, 7(1), 1559.
- 500
- 501 Fang Z, Cui X (2011). Design and validation issues in RNA-seq experiments. Brief  
 502 Bioinform, 12(3), 280-287.

- 503
- 504 Farina WM, Balbuena MS, Herbert LT, Mengoni Goñalons C, Vázquez DE (2019). Effects  
505 of the Herbicide Glyphosate on Honey Bee Sensory and Cognitive Abilities: Individual  
506 Impairments with Implications for the Hive. *Insects*, 10, 354.
- 507
- 508 Gene Ontology Consortium (2018). The gene ontology resource: 20 years and still GOing  
509 strong. *Nucleic Acids Res*, 47(D1), D330-D338.
- 510
- 511 Gerhardt A. (2002). Bioindicator species and their use in biomonitoring. *Environ Monit*, 1,  
512 77-123.
- 513
- 514 Giesy JP, Dobson S, Solomon KR (2000). Ecotoxicological risk assessment for Roundup  
515 herbicide. *Rev Environ Contam T*, 167: 35–120.
- 516
- 517 Gillis J., Mistry M., Pavlidis P. (2010). Gene function analysis in complex data sets using  
518 ErmineJ. *Nat Protoc*, 5: 1148 – 1159.
- 519
- 520 Goñalons CMM, Farina WM (2018). Impaired associative learning after chronic exposure  
521 to pesticides in young adult honey bees. *J Exp Biol*, 221, jeb176644.
- 522
- 523 Gregorc A, Evans JD, Scharf M, Ellis JD (2012). Gene expression in honeybee (*Apis*  
524 *mellifera*) larvae exposed to pesticides and Varroa mites (*Varroa destructor*). *J Insect*  
525 *Physiol*, 58(8): 1042–1049. <https://doi.org/10.1016/j.jinsphys.2012.03.015> PMID:  
526 22497859
- 527
- 528 Gregorc A, Ellis JD (2011). Cell death localization *in situ* in laboratory reared honeybee  
529 (*Apis mellifera* L.) larvae treated with pesticides. *Pestic Biochem Phys*, 99(2): 200–207.
- 530
- 531 Helmer SH, Kerbaol A, Aras P, Jumarie C, Boily M (2015). Effects of realistic doses of  
532 atrazine, metolachlor, and glyphosate on lipid peroxidation and diet-derived antioxidants in

- 533 caged honey bees (*Apis mellifera*). Environ Sci Pollut R, 22(11): 8010–8021.  
534 <https://doi.org/10.1007/s11356-014-2879-7> PMID: 24728576  
535
- 536 Herbert LT, Vázquez DE, Arenas A, Farina WM (2014). Effects of field-realistic doses of  
537 glyphosate on honeybee appetitive behaviour. J Exp Biol, 217, 3457–3464.  
538
- 539 Honey Bee Genome Sequencing Consortium (2014). Finding the missing honey bee genes:  
540 lessons learned from a genome upgrade. BMC Genomics, 15:86. PMID:24479613  
541
- 542 Hu B, Zhang SH, Ren MM, Tian XR, Wei Q, et al. (2019). The expression of *Spodoptera*  
543 *exigua* P450 and UGT genes: tissue specificity and response to insecticides. Insect Sci,  
544 26(2), 199-216.  
545
- 546 Human H, Brodschneider R, Dietemann V, Dively G, Ellis J, et al. (2013). Miscellaneous  
547 standard methods for *Apis mellifera* research. J Apicultr Res, 52(4):  
548 <http://dx.doi.org/10.3896/IBRA.1.52.4.10>  
549
- 550 Iida K, Cox-Foster DL, Yang X, Ko WY, Cavener DR (2007). Expansion and evolution of  
551 insect GMC oxidoreductases. BMC Evol Biol, 7(1), 75.  
552
- 553 IPBES (2016). The Assessment Report Of The Intergovernmental Science-Policy Platform  
554 On Biodiversity And Ecosystem Services On Pollinators, Pollination And Food Production.  
555 S.G. Potts, V. L. Imperatriz-Fonseca, and H. T. Ngo, (eds). Secretariat of the IPBES, Bonn,  
556 Germany. 552 pages.  
557
- 558 James RR, Xu J (2012). Mechanisms by which pesticides affect insect immunity. J  
559 Invertebr Pathol, 109(2), 175-182.  
560

- 561 Johnson RM, Mao W, Pollock HS, Niu G, Schuler MA, et al. (2012). Ecologically  
562 appropriate xenobiotics induce cytochrome P450s in *Apis mellifera*. PloS one, 7(2),  
563 e31051.
- 564
- 565 Juster RP, McEwen BS, Lupien SJ (2010). Allostatic load biomarkers of chronic stress and  
566 impact on health and cognition. Neurosci Biobehav R, 35(1), 2-16.
- 567
- 568 Kaftanoglu O, Linksvayer TA, Page Jr RE (2011). Rearing honeybees, *Apis mellifera*, *in*  
569 *vitro* I: Effects of sugar concentrations on survival and development. J Insect Sci, 11(1): 96.
- 570
- 571 Katz D, Baptista J, Azen SP, Pike MC (1978). Obtaining confidence intervals for the risk  
572 ratio in cohort studies. Biometrics, 469-474.
- 573
- 574 Krupke CH, Hunt GJ, Eitzer BD, Andino G, Given K (2012). Multiple routes of pesticide  
575 exposure for honey bees living near agricultural fields. PLoS one, 7(1), e29268.
- 576
- 577 Lelli Jr JL, Becks LL, Dabrowska MI, Hinshaw DB (1998). ATP converts necrosis to  
578 apoptosis in oxidant-injured endothelial cells. Free Radical Bio Med, 25(6), 694-702.
- 579
- 580 Li MH, Ruan LY, Zhou JW, Fu YH, Jiang L, et al. (2017). Metabolic profiling of goldfish  
581 (*Carassius auratus*) after long-term glyphosate-based herbicide exposure. Aquat Toxicol,  
582 188, 159-169.
- 583
- 584 Lourenço AP, Mackert A, dos Santos Cristina A, Simões ZLP (2008). Validation of  
585 reference genes for gene expression studies in the honey bee, *Apis mellifera*, by quantitative  
586 real-time RT-PCR. Apidologie, 39(3), 372-385.
- 587
- 588 Mao W, Schuler MA, Berenbaum MR (2013). Honey constituents up-regulate  
589 detoxification and immunity genes in the western honeybee *Apis mellifera*. P Natl Acad Sci  
590 USA, 110(22): 8842–8846.

- 591
- 592 Marc J, Mulner-Lorillon O, Bellé R (2004). Glyphosate-based pesticides affect cell cycle  
593 regulation. *Biol Cell*, 96(3): 245–249. <https://doi.org/10.1016/j.biocel.2003.11.010> PMID:  
594 15182708
- 595
- 596 Miller GW, Jones DP (2013). The nature of nurture: refining the definition of the  
597 exposome. *Toxicol Sci*, 137(1), 1-2.
- 598
- 599 Motta EV, Raymann K, Moran NA (2018). Glyphosate perturbs the gut microbiota of  
600 honey bees. *P Nat Acad Sci*, 115(41), 10305-10310.
- 601
- 602 Nation JL (2015). Insect Physiology And Biochemistry. CRC press.
- 603
- 604 Nomenclature Committee of the International Union of Biochemistry and Molecular  
605 Biology (IUBMB) (1992). Enzyme Nomenclature. Academic Press, San Diego, California,  
606 ISBN 0-12-227164-5.
- 607
- 608 Orantes-Bermejo FJ, Pajuelo AG, Megías MM, Fernández-Píñar CT (2010). Pesticide  
609 residues in beeswax and bee bread samples collected from honey bee colonies (*Apis*  
610 *mellifera* L.) in Spain. Possible implications for bee losses. *J Apicult Res*, 49(3), 243-250.
- 611
- 612 Paganelli A, Gnazzo V, Acosta H, López SL, Carrasco AE (2010). Glyphosate-based  
613 herbicides produce teratogenic effects on vertebrates by impairing retinoic acid signaling.  
614 *Chem Res Toxicol*, 23(10):1586–1595. <https://doi.org/10.1021/tx1001749> PMID:  
615 20695457
- 616
- 617 Patterson BE, Bates CJ (1989). Riboflavin deficiency, metabolic rate and brown adipose  
618 tissue function in sucking and weanling rats. *Brit J Nutr*, 61(3), 475-483.
- 619

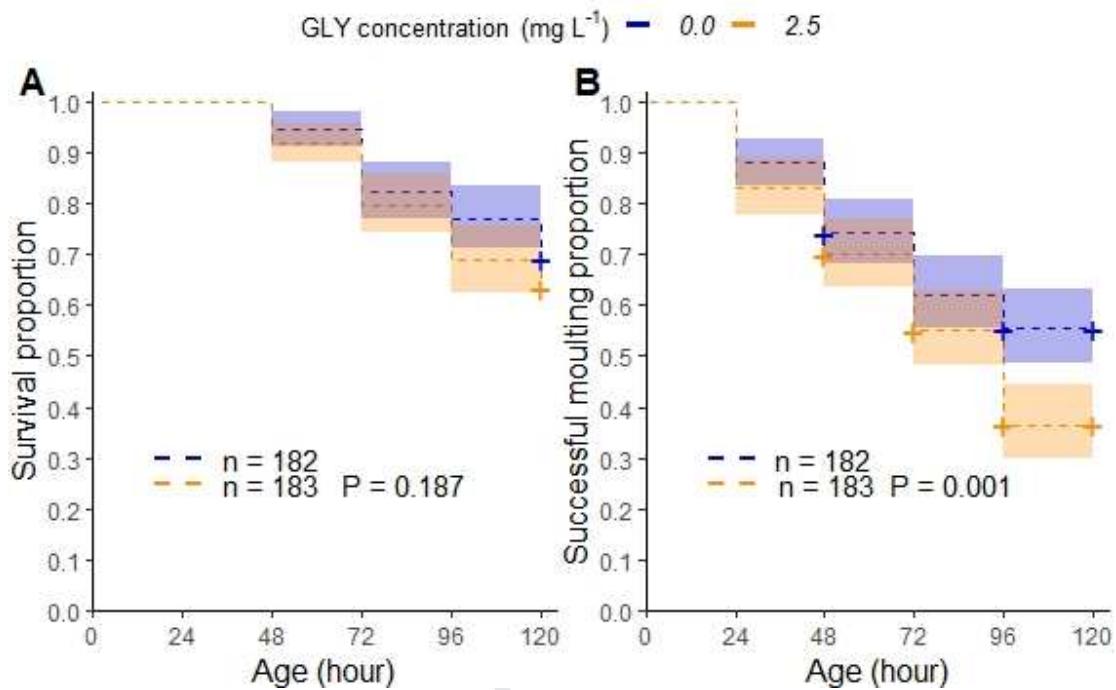
- 620 Peruzzo PJ, Porta AA, Ronco AE (2008). Levels of glyphosate in surface waters, sediments  
621 and soils associated with direct sowing soybean cultivation in north pampasic region of  
622 Argentina. Environ Pollut, 156(1): 61–66. <https://doi.org/10.1016/j.envpol.2008.01.015>  
623 PMID: 18308436
- 624
- 625 Pfaffl MW (2001). A new mathematical model for relative quantification in real-time RT–  
626 PCR. Nucleic Acids Res, 29(9), e45-e45.
- 627
- 628 Pham-Delegue MH, Decourtey A, Kaiser L, Devillers J (2002). Behavioural methods to  
629 assess the effects of pesticides on honey bees. Apidologie, 33, 425–432.
- 630
- 631 Poquet Y, Vidau C, Alaux C (2016). Modulation of pesticide response in honeybees.  
632 Apidologie, 47(3), 412-426.
- 633
- 634 Raina-Fulton R (2014). A review of methods for the analysis of orphan and difficult  
635 pesticides: glyphosate, glufosinate, quaternary ammonium and phenoxy acid herbicides,  
636 and dithiocarbamate and phthalimide fungicides. J AOAC Int, 97(4), 965-977.
- 637
- 638 Rajkumar AP, Qvist P, Lazarus R, Lescai F, Ju J, et al. (2015). Experimental validation of  
639 methods for differential gene expression analysis and sample pooling in RNA-seq. BMC  
640 Genomics, 16(1), 548.
- 641
- 642 Riaz MA, Poupardin R, Reynaud S, Strode C, Ranson H, et al. (2009). Impact of  
643 glyphosate and benzo[a]pyrene on the tolerance of mosquito larvae to chemical  
644 insecticides. Role of detoxification genes in response to xenobiotics. Aquat Toxicol, 93(1),  
645 61-69.
- 646
- 647 Robinson MD, McCarthy DJ, Smyth GK (2010). edgeR: a Bioconductor package for  
648 differential expression analysis of digital gene expression data. Bioinformatics 26: 139-140.
- 649

- 650 Rubio F, Guo E, Kamp L (2014). Survey of glyphosate residues in honey, corn and soy  
651 products. *J Environ Anal Toxicol*, 5: 249.
- 652
- 653 Samsel A, Seneff S (2013). Glyphosate's suppression of cytochrome P450 enzymes and  
654 amino acid biosynthesis by the gut microbiome: pathways to modern diseases. *Entropy*,  
655 15(4), 1416-1463.
- 656
- 657 Scharlaken B, de Graaf DC, Goossens K, Brunain M, Peelman LJ, et al. (2008). Reference  
658 gene selection for insect expression studies using quantitative real-time PCR: The head of  
659 the honeybee, *Apis mellifera*, after a bacterial challenge. *J Insect Sci*, 8(1), 33.
- 660
- 661 Seide VE, Bernardes RC, Pereira EJG, Lima MAP (2018). Glyphosate is lethal and Cry  
662 toxins alter the development of the stingless bee *Melipona quadrifasciata*. *Environ Pollut*,  
663 243, 1854-1860.
- 664
- 665 Tate TM, Spurlock JO, Christian FA (1997). Effect of glyphosate on the development of  
666 *Pseudosuccinea columella* snails. *Arch Environ Con Tox*, 33(3): 286–289.
- 667
- 668 Taylor S, Wakem M, Dijkman G, Alsarraj M, Nguyen M (2010). A practical approach to  
669 RT-qPCR—publishing data that conform to the MIQE guidelines. *Methods*, 50(4), S1-S5.
- 670
- 671 Thompson HM, Levine SL, Doering J, Norman S, Manson P, et al. (2014). Evaluating  
672 exposure and potential effects on honeybee brood (*Apis mellifera*) development using  
673 glyphosate as an example. *Integr Environ Assess Manag*, 10(3): 463–470.  
674 <https://doi.org/10.1002/ieam.1529> PMID:24616275
- 675
- 676 Thurmond J, Goodman JL, Strelets VB, Attrill H, Gramates LS, et al. FlyBase Consortium  
677 (2019). FlyBase 2.0: the next generation. *Nucleic Acids Res*, 47(D1) D759–D765
- 678 Timbrell JA (2008). *Principles Of Biochemical Toxicology*. CRC Press.

- 679 Traynor KS, Pettis JS, Tarpy DR, Mullin CA, Frazier JL, *et al.* (2016). In-hive Pesticide  
680 Exposome: Assessing risks to migratory honey bees from in-hive pesticide contamination  
681 in the Eastern United States. *Sci Rep*, 6, 33207.
- 682 USEPA (2012). White Paper In Support Of The Proposed Risk Assessment Process For  
683 Bees. Chemical Safety And Pollution Prevention. Office Of Pesticides Programs.  
684 Environmental Fate And Effects Division.
- 685 Vandenberg JD, Shimanuki H (1987). Technique for rearing worker honeybees in the  
686 laboratory. *J Apicul Res*, 26: 90-97.
- 687
- 688 [dataset] Vázquez DE, Latorre-Estivalis JM, Ons S, Farina WM. *Apis mellifera* RNAseq.  
689 NCBI BioProject database (2019) PRJNA587756.
- 690
- 691 Vázquez DE, Ilina N, Pagano EA, Zavala JA, Farina WM (2018). Glyphosate affects the  
692 larval development of honey bees depending on the susceptibility of colonies. *PLoS ONE*  
693 13(10):e0205074. <https://doi.org/10.1371/journal.pone.0205074>
- 694
- 695 Wang X, Chang L, Zhao T, Liu L, Zhang M, et al. (2019). Metabolic switch in energy  
696 metabolism mediates the sublethal effects induced by glyphosate-based herbicide on  
697 tadpoles of a farmland frog *Microhyla fissipes*. *Ecotox Environ Safe*, 186, 109794.
- 698
- 699 Wu JY, Anelli CM, Sheppard WS (2011). Sublethal effects of pesticide residues in brood  
700 comb on worker honeybee (*Apis mellifera*) development and longevity. *PLoS one*, 6(2):  
701 e14720. <https://doi.org/10.1371/journal.pone.0014720> PMID: 21373182
- 702
- 703
- 704
- 705
- 706
- 707
- 708

709 **Figures**

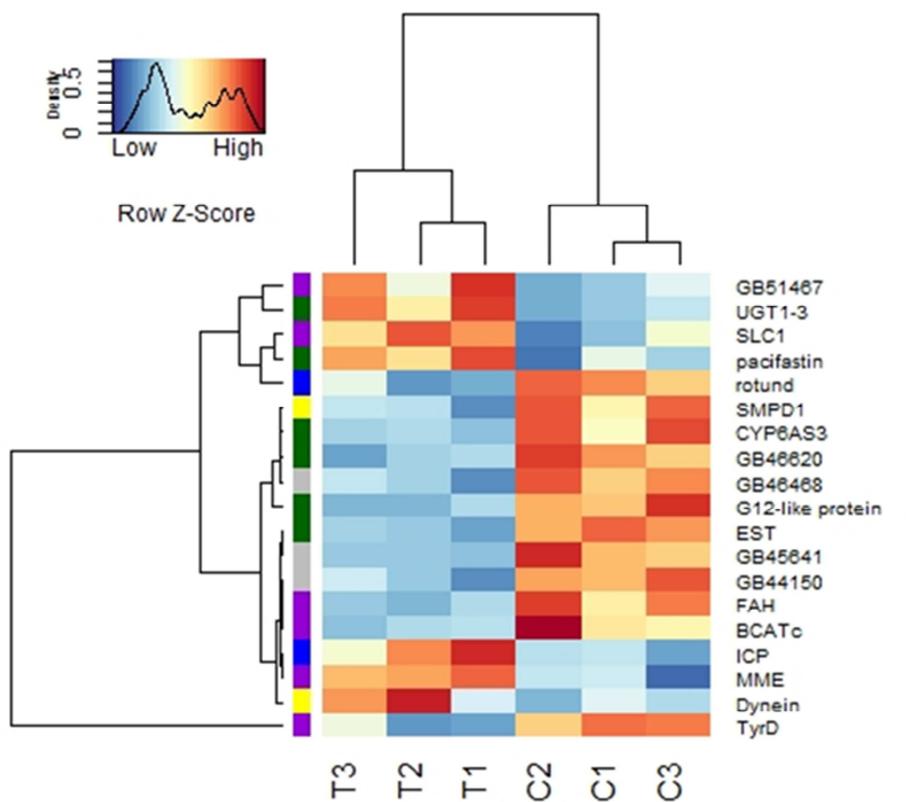
710 Figure 1.



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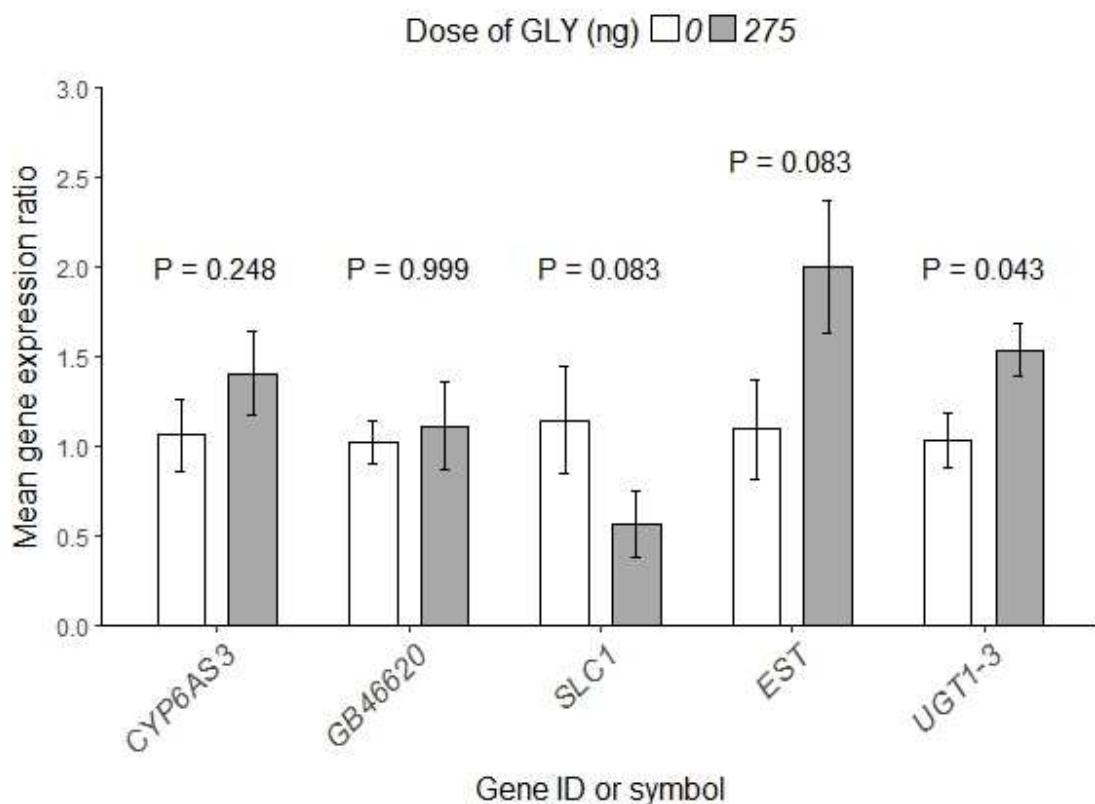
713 Figure 2.



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716 Figure 3.



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719 **Tables**

720 Table 1.

ID	Description	N° genes	P-value	FDR
<b>GO:0016614 §</b>	oxidoreductase activity, acting on CH-OH group of donors	46	1.00E-12	2,48E-10
GO:0005506 *	iron ion binding	66	2.03E-05	2,48E-10
<b>GO:0050660 §</b>	flavin adenine dinucleotide binding	45	1.00E-12	1,24E-10
<b>GO:0050662 §</b>	coenzyme binding	134	7.61E-07	1.22E-06
GO:0008610 *	lipid biosynthetic process	73	0.011	2.94E-06
GO:0006629 *	lipid metabolic process	152	0.022	0.015

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723 **Figures Captions**

724 **Fig 1. Endpoint assessment in honey bee larvae exposed *in vitro* to GLY.** A) The  
 725 proportion of survival and B) the proportion of larvae with successful moulting (without  
 726 delay events) during the chronic exposure (0-120 h post-hatching) to contaminated food  
 727 with GLY (0 or 2.5 mg a.e. of herbicide per litre). The curves are plotted with their  
 728 confidence interval (95%) and with different colours per treatment: control group in blue  
 729 and exposed larvae in orange. The + indicates time points with censoring data. Both  
 730 survival and developmental data were fitted to CPH models (survival or successful  
 731 moulting ~ [GLY] + strata(colony)). The number of assessed larvae and p-values for each  
 732 test are shown in the graph.

733 **Figure 2. Effect of GLY on gene transcription in asymptomatic larvae.** Heatplot of  
 734 differentially expressed genes (FDR < 0.1, Table S6) comparing transcription levels among  
 735 samples of pooled bees (6 asymptomatic larvae, i.e. without signs of toxicity after chronic  
 736 exposure of 120 h to GLY) in both treatments (control: C or exposed: T, total dose of 0 or  
 737 275 a.e. ng of GLY respectively). Transcription levels per gene (fragments per kilobase per  
 738 million, a.k.a. FPKM) were standardized with z-score and represented by means of a color  
 739 scale, in which blue/red represent lowest/highest expression respect to average FPKM  
 740 among all samples per gene. The density subplot allows to identify the trend in  
 741 transcription level. Genes are identified by their symbol or Beebase code (GB-number). A  
 742 bar color code identifies the functional category of genes: violet for intermediary  
 743 metabolism, green for defensive response, yellow for cellular processes, blue for  
 744 development and grey for genes without functional information (Table S7). Dendograms  
 745 were plotted with hierarchical clustering among samples and genes based on Euclidean  
 746 distances and Ward method for clustering.

747 **Figure 3. Gene expression measured with qRT-PCR.** Mean gene expression ratio (Pfaffl  
 748 formula) of 5 genes (differently expressed in RNA-Seq, Table S6) has been performed with  
 749 4 samples of pooled larvae (6) per treatment (control or exposed) using qRT-PCR. The  
 750 samples were different from those in sequencing data. *GAPDH*, *Rp18S* and *Rp49S*  
 751 expression levels (Table S3) has been used to normalize the expression level of every gene.  
 752 Bars indicate means  $\pm$  s.e.m. The *p*-values for each test to compare between treatments  
 753 (Mann-Whitney *U* test) are shown in the graph for each gene.

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758 **Tables Captions**

759 **Table 1. GO enrichment analysis of the RNA-Seq data.** Gene Set Enrichment Analysis  
760 was performed with the list of filtered genes (8567) from the RNA-Seq result (see  
761 Supplementary). Functional gene sets were defined using the Gene Ontology (GO)  
762 annotations (2554) of the *Apis mellifera* genome in BeeBase (93% of the filtered genes).  
763 Gene Score Resampling method (GSR) applied to identify significantly enriched functional  
764 categories with high-scoring genes (§ mean absolute fold-change or \* mean  $-\log_{10}(\text{FDR})$   
765 from the RNASeq result). The reported IDs correspond to the significantly enriched GO  
766 terms (FDR with multifunctionality correction < 0.1).

## Highlights

1. Honey bee larvae were chronically fed *in vitro* with food containing glyphosate.
2. At the end of the cohort study, larvae without signs of toxicity were sampled.
3. Exposed asymptomatic larvae showed differentially expressed genes in RNA-Seq.
4. Enriched functional categories suggested high catalytic and oxidative metabolism.

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**Declaration of interests**

The authors declare that they have no known competing financial interests or personal relationships that could have appeared to influence the work reported in this paper.

The authors declare the following financial interests/personal relationships which may be considered as potential competing interests:

