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Posted Date: 6 October 2023

doi: 10.20944/preprints202310.0295.v1

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Article

Oxidative Stress as a Simple Tool to Measure Environmental Pollution Impact on Honeybee

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Abstract: Bees have long been used as a bioindicator of environmental quality. They have the capacity to bio-accumulate various pollutants in cities such as PAHs and heavy metals, but they are also very sensitive to other pollutants in rural areas such as pesticides. The lethal and sub-lethal impacts of pesticides on bees have been extensively studied. However, studies often focus on a single molecule at a same time and rarely on a cocktail of pesticides. The oxidant stress in response to metals and NOx was also measured, but no studies were engaged on the impact of PAHs on honeybees. The aim of this study was to measure the oxidative stress in bees in response to the chronic ingestion of a mixture of pesticides (representative of pollutants in rural areas) on the first hand and a mixture of PAHs (representative of pollutants in urban areas) on the other hand, compared to a control group. We also wanted to determine whether this tool is effective in detecting environmental measures aimed at reducing pollution in urban and rural areas.

Keywords. Pollution; Honeybee; Oxidative stress biomarkers; Pesticides; PAHs

1. Introduction

The study of sublethal effects of pollutants on wildlife, and specially on pollinators is essential. Honeybees face various pollutants, whatever their environment: we found pesticides especially in agricultural landscapes (Botias et al. 2017), and PAHs / heavy metals are more concentrated in urban areas (Cochard et al. 2020; Gizaw et al. 2020).

Many studies have shown that pesticides greatly impact behaviorally and physiologically honeybees (feeding and activity: Azpiazu et al., 2019, Almasri et al., 2020, Lupi et al., 2020; learning: Gonalons and Farina, 2018, Williamson et al., 2013; pathogen infection: Pettis et al., 2012). Toxicity of pesticides seems to be correlated to enzymes activities used as biomarkers (Badawy et al., 2015). But only 7% of the 142 scientific experimentations published between 2005 and 2016 investigated the impact of the interaction between different insecticides and 6.3% between insecticides and fungicides (detailed in Benuszak et al., 2017). However, the effects are often synergistic and not simply additive (Almasri et al., 2020).

Other pollutants mainly found in urban areas as heavy metals have been reported to be accumulated in bees (Leita et al., 1996; Conti et al., 2001; Perugini et al., 2011; Lambert et al., 2012; Goretti et al., 2020) and act as environmental stressors on honeybees, thus increasing the expression levels of various genes involved in the detoxification metabolism in urban bees (Gizaw et al. 2020).

To our knowledge, oxidative stress response to PAHs was studied in various organisms like *Arabidopsis thaliana*, *Mya arenaria* [soft shell clam], *Chlorella sp.*, fish (Liu et al., 2009; Pichaud et al., 2008; Santana et al., 2018; Subashchandrabose et al., 2017), but not in honeybees while we know that bees bio-accumulate PAHs (Cochard et al., 2020). However, a recent study of Nicewicz et al. (2020) has shown that the Hsp70 and defensin level were significantly higher in urban bees than in bees collected in rural apiary. High level of these two biomarkers indicate that urban insects are under greater stress factors that affect cells repair and immunity than rural insects. Moreover, the oxidative potential of urban PM are threefold-higher than rural PM according to the study of Daellenbach et al (2020).

There is therefore a real need to find a global marker of the impact of the cocktail of pollutants found in various environment on the health of pollinators. Questions remaining are: can we measure

early sublethal effects of pesticides and PAH using oxidative stress? Can we use oxidative stress of honeybees to measure the impact of the actions put in place by cities to reduce pollution (PAHs/pesticides)?

Thus, the main objectives of this study were to measure the impact of the consumption of 1) a cocktail of pesticides (insecticides and fungicides) and 2) a mixture of PAHs, on the survival and oxidative stress of bees in lab experiment. We also conducted field case study where we measured oxidative stress of honeybees collected according to an increasing level of anthropization (semi-natural land, agricultural land and urban land). Based on literature, we expected a greater but slower impact of PAHs on honeybee's oxidative stress than pesticides.

2. Material & Methods

2.1. Pesticides and PAHs diet solutions

Two fungicides, one insecticide and one chemical used to enhance the insecticidal properties were chosen to compose pesticides diet: dimoxystrobin, spiroxamine, phosmet and piperonylbutoxide ($\geq 98\%$ purity, Pestanal, Sigma-Aldrich, Darmstadt, Germany). They are frequently detected in beebread samples (many years of collected samples, data not shown).

All pesticides were dissolved in a small volume of acetone before preparation of 1mM stock solutions by adding water. Pesticides were then dissolved in Apistar[®] sugar syrup (Sucrose: 34%, Fructose: 33%, Glucose: 33%; ICKO Apiculture, France) following **Table 1**, trying to follow field realistic concentration detected in nectar. Hayat et al. (2018) and Azpiazu et al. (2019) found pesticides residues in nectar of different flower of the same order of magnitude than our study.

Table 1. Concentrations of pesticides (mg/L of syrup), their contact / oral acute LD50 ($\mu\text{g}/\text{bee}$) and PAHs concentrations ($\mu\text{g}/\text{L}$ of syrup) used in the experiment.

Treatments	LD50 (contact / oral)	Substance group	Low concentration C1	Medium concentration C2	High concentration C3
Pesticides					
Phosmet	0.22 / 0.37	Organophosphat e	0.01	0.1	0.4
Spiroxamine	4.2 / > 100	Morpholine	0.01	0.1	0.4
Dimoxystrobin	> 100 / > 79.4	Strobilurine	0.01	0.1	0.4
PiperonylButoxi de	- / -	Benzodioxole	0.01	0.1	0.4
PAHs	-	-	0.214	21.4	214

20 PAHs were dissolved in sugar syrup by an external lab (Oniris, Laberca, Nantes – France, see **Table S1** for compounds) using native compounds and isotopic-labelled internal standard compounds (13C-PAHs) from Promochem. PAHs were chosen as being part of the lists recommended by the EU Scientific Committee for Food (SCF), the European Union (EU) and United States Environmental Protection Agency (US EPA).

2.2. Experimental protocol

We used 9 boxes randomly assigned in one of the 3 following treatments: control, pesticides diet or PAHs diet. Twenty young honeybees (< 3 days) were placed in each box (**Figure 1**). Every day, mortality was registered, and each dead bee was replaced by a marked honeybee, to exclude it from the next collected bee and maintain the same number of bees per box. The syrup container was mixed

every day and filled every 7 days, noting the syrup consumption per box. Three honeybees were randomly sampled at Day 0 (control, beginning of the experiment), Day 7, Day 14, and Day 21 to measure oxidative stress. All sampled bees were immediately frozen until oxidative stress measurements.

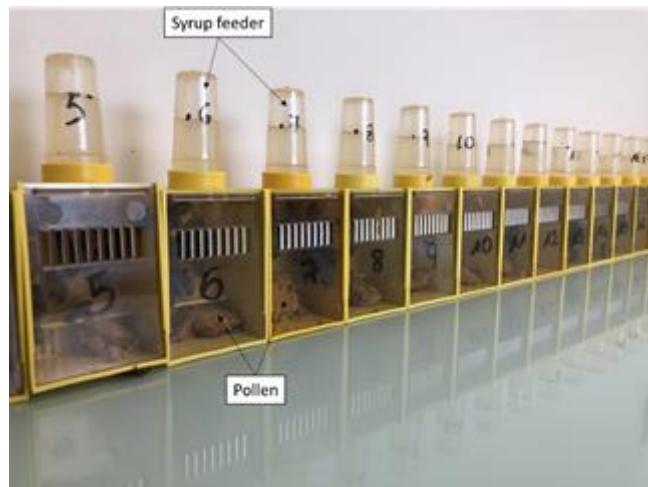


Figure 1. Experimental boxes, each containing 20 honeybees and randomly assigned to one treatment (control diet, pesticides diet or PAHs diet).

2.3. Field case study sampling

The gradient level of anthropization was chosen as in Cochard 2020 and was composed of 20 semi-natural, 37 agricultural and 23 urban apiaries, across metropolitan France (more than 10 French departments). Each apiary was composed of 3 beehives. In each beehive, 5 honeybee workers returning to the hive were randomly sampled, using a non-contaminant tool. Each honeybee was individually placed on dry ice (-80°C) and stored in standard freezer (-20°C) until laboratory analysis. The hives were not smoked during the month preceding sampling to ensure that beekeeping practices would not increase PAHs exposition of honeybees and that only the environment around the apiary had an impact on honeybee oxidative stress.

2.4. Oxidative stress measurements - Carbonylated proteins analysis

Proteins were extracted from pooled honeybee heads (4 heads per replicate; 3 replicates per experimental group) by using OxiProtemicsR extraction buffer optimised for bees, then quantified by the Bradford method (Bradford, 1976). Equal amount of whole protein extracts (20 μ g) for each replicate was then analyzed. Carbonylated proteins were labeled with a specific fluorescence probe ($\lambda_{\text{Ex}}/\lambda_{\text{Em}} = 650/665$ nm) (Baraibar et al., 2013) and resolved by high-resolution electrophoresis onto 4-20% gradient SDS-PAGE. Proteins were fixed to the gel and carbonylation fluorescence signal was evidenced by fluorescence scanning. Total proteins were post-stained with SyproRubyTM protein gel stain (Molecular Probes, Invitrogen). Gel image acquisition for carbonylated and total proteins by differential fluorescence was performed using the iBright Imaging System (Thermo Fisher Scientific). Densitometric analysis of protein bands was performed using Image J analysis software (Schneider et al., 2012). The quantification was obtained from each sample, both for carbonylated and total proteins. Carbonylated proteins fluorescence signal was normalized by total protein signal for each sample in order to obtain the Carbonyl Score by using the following formula:

Carbonyl Score = Carbonylated Proteins fluorescence signal (RFU) / Total Proteins fluorescence signal (RFU).

2.5. Statistical analysis

All statistical analyses were performed using R software (version 1.2.5033). Normality was determined using Shapiro-Wilk test, before using multiple comparisons tests (Mann Whitney U test

for non-parametric data, and One or Two-Ways ANOVA with Tukey's Post Hoc comparisons tests). Survival curves were analyzed using the non-parametric Kaplan-Meier Log Rank Survival test.

3. Results

3.1. Impact of PAH and pesticides diet on survival probability and syrup consumption

Figure 2 presents survival curves associated with each diet treatment (control, pesticides, and PAHs). Results show that the 3 treatment groups significantly differ in survival (Log-rank test, $\chi^2 = 74.2$, $df = 2$, $p < 0.001$), with pesticides diet group having a more pronounced mortality curve from two weeks of experiment. By the end of the 21 days of experiment, we observe about 75% survival in control and PAHs groups whereas there is only 40% survival in pesticides group.

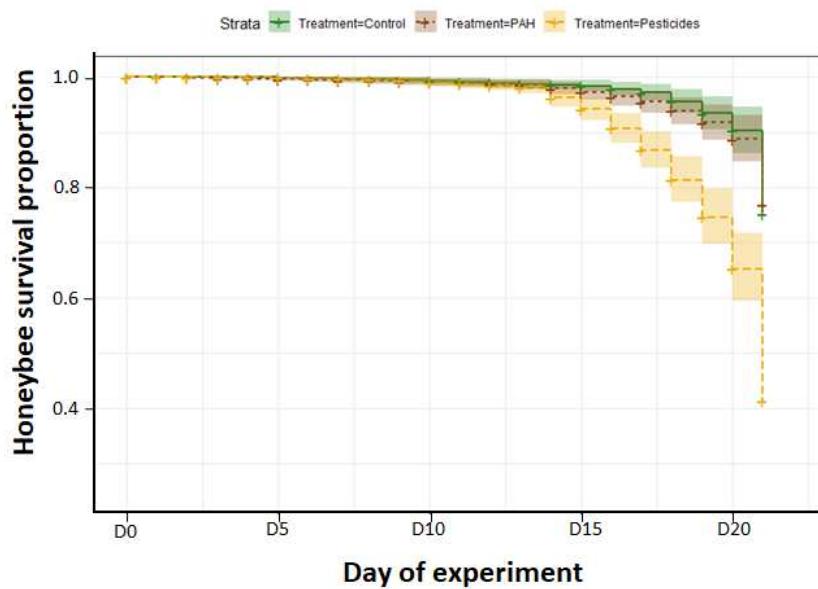


Figure 2. Honeybee survival proportion during the 21 days of pollutants diet. Pollutants were dissolved in sugar syrup. Pesticides group was exposed to a cocktail of four pesticides (phosmet, spiroxamine, dimoxystrobin and piperonylbutoxide). PAHs group was exposed to 20 PAHs (Supplementary Information). Control groups only had access to sugar syrup free of pollutants.

Pollutant diet had no effect on the syrup consumption (ANOVA, $F_{1,48} = 0.167$, $p = 0.685$), neither concentration of the solution (ANOVA, $F_{2,48} = 0.160$, $p = 0.853$), nor the interaction between pollutant diet and concentration (ANOVA, $F_{2,48} = 1.874$, $p = 0.165$). We found no significant difference of consumption between control group and the two pollutant diet groups (ANOVA, $F_{2,60} = 0.218$, $p = 0.805$, **Figure 3**). The mean daily consumption of syrup was $23.5 \pm 1.93 \mu\text{L}/\text{bee}$ and the total consumption of pollutants per bee is presented in **Table 2**.

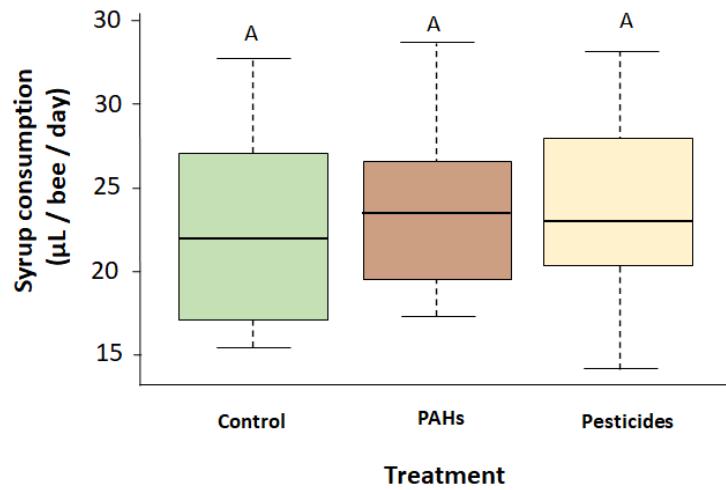


Figure 3. Mean syrup consumptions during the 21 days of experiment of each group (control group, PAHs diet groups and pesticides diet groups). Similar capital letters indicate no significant difference (Tukey's Post Hoc test, $p > 0.05$).

Table 2. Total consumption of pollutants (μg/bee) according to the days of experiment.

Treatments	/ Day	Day 7	Day 14	Day 21
Pesticides (sum of the 4)				
C1	0.001	0.007	0.013	0.020
C2	0.009	0.066	0.132	0.197
C3	0.037	0.263	0.526	0.790
PAHs				
C1	4.29E-06	3.00E-05	6.00E-05	9.00E-05
C2	4.29E-04	0.003	0.006	0.009
C3	0.00429	0.030	0.060	0.09

3.2. Impact of PAH and pesticides diet on oxidative stress of honeybees

Figure 4 shows significant impact of pesticides (high concentration) and PAHs (high concentration) diet on oxidative stress compared to control group. Significant impact for PAHs diet has been detected from 7 days of experiment (ANOVA, $p < 0.001$) whereas significant impact of pesticides diet on oxidative stress has been detected from 14 days of experiment (ANOVA, $p < 0.001$). By the end of the experiment, impact of both pollutant diets was also significant (ANOVA, $p < 0.001$).

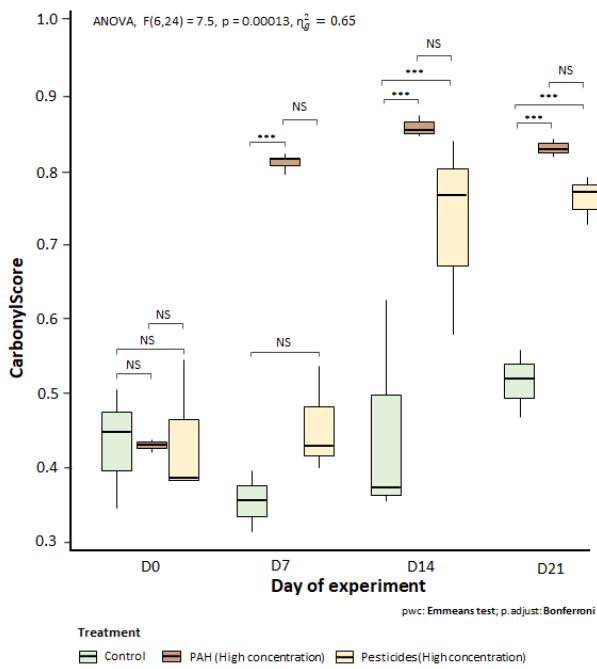


Figure 4. Level of carbonylscore (oxidative stress, arbitrary unit) of honeybees sampled from each group (control group, PAHs groups and pesticides groups), at 0, 7, 14 and 21 days of the experiment. Tukey HSD post-hoc test, $p > 0.05$: NS, $p \leq 0.001$; ***.

3.3. Field case study

We found a significant effect of landscape context on the oxidative stress (ANOVA, $F_{2,77} = 9.577$, $p < 0.001$; **Figure 5B**). Honeybees sampled in semi-natural lands were found to have weaker carbonylscore than those sampled in agricultural or urban lands (natural lands: 0.62 ± 0.18 , agricultural lands: 0.81 ± 0.20 , urban lands: 0.80 ± 0.12).

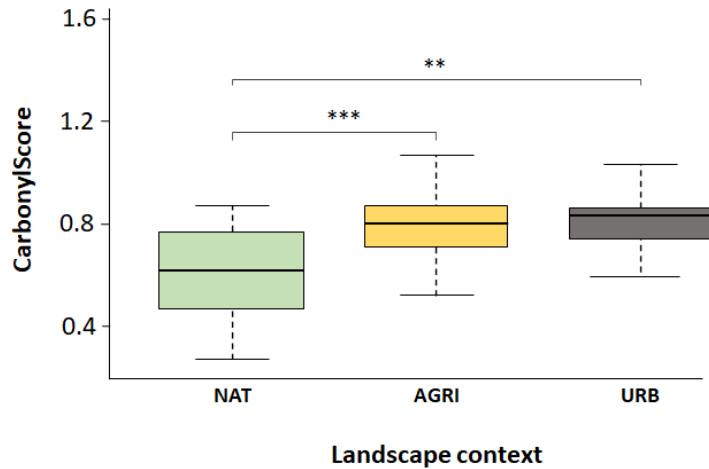


Figure 5. Level of carbonylscore (oxidative stress, arbitrary unit) of honeybees sampled in A) a gradient level of agricultural crops ($n = 8$ honeybees per crop) and B) a gradient level of anthropopization ($n = 20$ samples in natural lands, $n = 37$ samples in agricultural lands and $n = 23$ samples in urban lands). Tukey HSD post-hoc test, $p \leq 0.05$: ** $p \leq 0.001$; *** $p \leq 0.0001$.

The comparison between the mean carbonylscore of honeybees from our control group (lab study) and the mean carbonylscore of honeybees from the semi-natural groups showed a significant difference (Wilcoxon test, $W = 50$, $p = 0.0068$, $n = 32$). Honeybees from the semi-natural group of our

field study had a significantly higher oxidative stress measure than honeybees from the control group of the lab study.

4. Discussion and conclusion

The present work was composed of one lab study and one field study. The first one was designed to investigate the impact of the chronic (long-term) oral consumption of two widespread types of pollutants: pesticides (insecticides + fungicide) and PAHs on honeybee's oxidative stress, in controlled conditions. Bee mortality was also measured in this study. The field case study was used to check whether it was possible, in real conditions, to measure significant differences in oxidative stress according to the environmental landscape context and therefore to measure the impacts of a policy to reduce pollutants in urban and rural areas.

Results of the lab study show that chronic ingestion of pesticides impact significantly more survival than chronic ingestion of PAHs. Some studies have reported an impact of pesticides on carbohydrate regulation and syrup intake (Chakrabarti et al., 2020; Cook SC 2019). In our study, honeybees were provided pollen *ad libitum* and the dissolution of both pollutants in sucrose syrup did not impact syrup consumption (Figure 3). Thus, we can suppose that difference of mortality is not due to feeding suppression (or feeding rate increase) but to the pollutants dissolved in the syrup, although we cannot rule out the impact of containment on survival (Alburaki et al., 2019). Bees have fewer genes encoding detoxifying proteins than other insects, which may explain their sensitivity, to pesticides (Claudianos et al., 2006).

Regarding PAHs groups, although their carbonylscore were high, honeybee survival was about 75% at the end of the experiment and not significantly different from the control group. Thus, oxidative stress linked to PAHs consumption does not directly induce lethal effects. To our knowledge, this is the first study considering the lifespan reduction and the sublethal impacts of PAHs on honeybees. Moreover, a recently published study has shown that the oxidative potential of urban PM are threefold-higher than rural PM (Daellenbach et al 2020). Our results are consistent with this study and show that PAHs alone are 1.5 and 1.15 more oxidant than pesticides (from 7 and 21 days of experiment respectively). Moreover and contrary to what we expected, the negative impact of PAHs on oxidative stress not only was stronger but also faster than that of pesticides.

Our lab experiment only considers the impact of chronic ingestion of pollutants and not the exposure by inhalation or contact. Direct contact exposure to pesticides experiments conducted on newly emerged honeybee are not realistic since foraging behavior do not begin before 18-28 days of life (ref Quigley et al. book chapter). Indirect contact through beebread and oral ingestion seems to be closer to reality, that's why we chose oral ingestion exposure. In our study, we assume constant pesticide consumption, in order to investigate the worst-case scenario. However, we are aware that the concentration of pesticide residues in the nectar decreases over time (Choudhary and Sharma, 2008; Sponsler et Johnson, 2017). Thus, our field study makes it possible to consider all the routes of exposure to pollutants, and to measure their sublethal impacts thanks to the oxidation of proteins.

As stated in the literature, current studies should focus on the impacts of cocktails of pollutants (PAHs, nitrous oxide, ozone, particulate matter, and pesticides) on sublethal effects (Li et al. 2019). Our field study has attempted to provide some answers to this gap in knowledge. Significant differences in oxidative stress level were detected between honeybees sampled in semi-natural landscape and honeybees sampled in more anthropized areas (agricultural and urbanized). A previous study from Cochard et al (2020) has shown that the concentration of PAHs detected in honeybee were significantly impacted by anthropization level: the more landscape was anthropized, the higher the level of PAHs detected in honeybees. Here, oxidative stress of honeybees sampled in agricultural landscape was not significantly different from honeybees sampled in urban landscape. Considering our present study, this result means that honeybees collected from agricultural areas experience a similar oxidative stress than honeybees collected in urban areas. On the contrary, honeybees collected in semi-natural lands seems to experience less oxidative stress compared to the two other environments. However, the level of oxidative stress from semi-natural areas collected bees was still significantly higher than control groups of our lab study.

Our study brought new insights on sublethal effects of two widespread pollutants (pesticides and PAHs), and general environmental pollution on honeybees' health. To our opinion, oxidative stress measurement could be used as a first step to detect environmental stress in honeybees before starting further research on the presence of possible pollutants in the environment of beehives. It will also be possible to determine the impact of reducing pollutant emissions into various environments.

Author Contributions: P.C. and B.P. conceived the study and conducted experiments, A.C. and M.B. carried out oxidative stress measurements, P.C. performed statistical analysis, P.C. wrote the manuscript in consultation with B.P., A.C. and M.B.

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