ROYAL SOCIETY OPEN SCIENCE

royalsocietypublishing.org/journal/rsos

Research



Cite this article: Martinet B, Przybyla K, Decroo C, Wattiez R, Aron S. 2023 Proteomic differences in seminal fluid of social insects whose sperm differ in heat tolerance. *R. Soc. Open Sci.* **10**: 231389. https://doi.org/10.1098/rsos.231389

Received: 14 September 2023 Accepted: 17 October 2023

Subject Category: Ecology, conservation and global change biology

Subject Areas: ecology/molecular biology/physiology

Keywords:

bumblebees, global decline, thermal tolerance, heat exposure, seminal fluid, proteomics

Author for correspondence:

Baptiste Martinet e-mail: baptiste.martinet@ulb.be

[†]These authors have contributed equally to this work and are co-first authors.

Electronic supplementary material is available online at https://doi.org/10.6084/m9.figshare.c. 6914075.

THE ROYAL SOCIETY PUBLISHING

Proteomic differences in seminal fluid of social insects whose sperm differ in heat tolerance

Baptiste	Martinet	^{1,†} , Kim	berly Prz	ybyla	2,† ,	
Corentin	Decroo ³ ,	Ruddy	Wattiez ³	and	Serge	Aron ¹

¹Evolutionary Biology & Ecology, Université Libre de Bruxelles, Avenue Paul Héger - CP 160/ 12, 1000 Bruxelles, Belgium

 $^2 \rm Department$ of Zoology, and $^3 \rm Department$ of Proteomics and Microbiology, Université de Mons, 7000 Mons, Belgium

BM, 0000-0003-4369-8552; KP, 0000-0001-9663-4179; CD, 0000-0001-7931-7120; RW, 0000-0003-2071-4310

In the coming years, climate change is likely to increase the frequency and intensity of heatwaves. In many organisms, heat stress provokes physiological perturbations and can lead to decreased male fertility. Bumblebees are endo-heterothermic but display interspecific differences in thermotolerance that could have conservation implications. For the species of concern Bombus magnus, exposure to high temperatures can severely reduce sperm quality and, consequently, reproductive success. Such is not the case for *B. terrestris*, a ubiquitous species. To decipher the mechanisms at play, we characterized the seminal fluid proteomes of the two species. We quantified 1121 proteins, of which 522 were differentially expressed between B. terrestris and B. magnus. Several proteins with protective functions, such as proteases, antioxidant proteins and various heat-shock proteins, were present at higher levels in B. terrestris than in B. magnus under both control and heat-stress conditions. The same was true for proteins involved in cellular homeostasis, immunity, lipid/sugar metabolism and thermotolerance. Furthermore, proteins involved in the capture and elimination of reactive oxygen species also occurred at much high levels in B. terrestris. Overall, these results clearly indicate differences in the seminal proteome of the more thermotolerant B. terrestris versus B. magnus. The differences may contribute to explaining interspecific differences in sperm survival.

1. Introduction

Worldwide, biodiversity is in steep decline. The chief driver is anthropogenic climate change [1], which impacts ecosystems by

© 2023 The Authors. Published by the Royal Society under the terms of the Creative Commons Attribution License http://creativecommons.org/licenses/by/4.0/, which permits unrestricted use, provided the original author and source are credited.

modifying the geographical ranges of species [2,3] and by causing local extinctions or biological invasions [4]. Models predict the planet will experience more frequent extreme climatic events, including heatwaves [5,6]. Heatwaves can dramatically affect biodiversity because (i) their swiftness may not allow organisms to adapt [7] and (ii) their brief, stochastic, and unusually extreme thermal conditions negatively impact biological functions [8]. Over the last decade, increasing attention has been paid to the consequences of heat exposure for biodiversity in terrestrial, marine and freshwater ecosystems [9,10]. Yet, knowledge remains scarce on the proximate drivers behind population declines in diverse taxa such as insects [11].

As heterotherms, insects are particularly sensitive to extreme temperature variation, which can result in major physiological perturbations (e.g. decreased fertility) and, in some cases, death [12,13]. At present, little research has been dedicated to understanding the consequences of heatwaves on reproduction in insects. High temperatures can negatively affect male courtship behaviour in solitary bees in the genus *Osmia* and in bumblebees [14,15]. Moreover, exposure to a heat shock can decrease sperm quality in flies (*Drosophila*), beetles (*Tribolium castaneum*), parasitic wasps (*Anisopteromalus calandrae*), domesticated bees (*Apis mellifera*) and bumblebees (*Bombus jonellus*, *B. magnus*) [15–19].

Sperm vulnerability to heat presents a particular risk in social hymenopterans (i.e. ants, bees and wasps). This large group of insects comprises more than 18 000 living species, including many that provide key ecosystem services, such as pollinating plants, controlling other insects and dispersing seeds [20]. All male hymenopterans are sperm limited—they start life with the only sperm reserves they will ever have. Typically, sperm production occurs during the nymphal/pupal stage and ends shortly after emergence, as the testes degenerate [21]. The resulting sperm are then stored in the accessory testes until mating, which happens in early adulthood for both males and females. Males die shortly after copulation, from exhaustion and/or predation, but persist posthumously in their spermatozoa, which females store in their spermathecae. These reproductive females, also known as queens in social hymenopterans, mate with one or several males and garner a lifetime supply of sperm. They never mate again, even though they may live and reproduce for decades [22]. Thus, low sperm quality and limited sperm production may have dramatic consequences for both male and female reproductive success.

As keystone pollinators, bumblebees are essential to human populations. They ensure the reproduction of many flowering plants in regions with temperate and cold climates, and their global decline could cause major economic issues [23]. In most species, queens have a single mate. Therefore, the quality of the sperm they receive plays a determinant role in colony growth and fitness. Recently, heat stress was found to severely affect sperm quality in *B. magnus* by increasing DNA fragmentation and decreasing viability; however, no such effects were seen in *B. terrestris*, a sister species [15] (figure 1). The underlying causes of this difference remain unidentified.

Seminal fluid could help ensure that sperm survive thermal stress by positively affecting sperm functioning and providing a safe environment [24–26]. It contains high concentrations of sugars, a major energy source for sperm cells [27]. In addition, it contains proteins that influence a wide range of reproductive processes, including fertilization, sperm storage, immune responses, and, in some insect species, female physiology and behaviour [28].

Here, we investigated whether heat stress modified the seminal fluid proteomes of two bumblebee species. By characterizing interspecific differences in protein expression, we wished to mechanistically clarify how some species manage to keep their sperm alive in the face of extreme high temperatures.

2. Material and methods

2.1. Study species

Bombus (B. sensu stricto) terrestris (the buff-tailed bumblebee; figure 1*a*) is a Euro-Mediterranean species that has been spreading northward in Europe [29]. It is invasive in many parts of the world [30,31]. *Bombus (B. sensu stricto) magnus* (the northern white-tailed bumblebee; figure 1*b*) is a species found in regions with temperate or cold climates, and its populations are declining across most of its distribution range [32,33]. The two are sister species that occur sympatrically in some areas and that face the same ecoclimatic constraints. In 2021, we collected males of both species during their nuptial flights (patrolling) at two locations in Belgium (Kalmthout, 51° 22′ N, 04° 28′ E, elevation of 21 m; Maasmechelen, 50° 57′ N, 05° 41′ E, elevation of 39 m). Males take part in mating flights when they are 7–10 days old, the age at which sexual pheromone production peaks [34]. Consequently, all the



Figure 1. Heat tolerance in the bumblebees *Bombus terrestris* and *B. magnus* (modified from [15]). (*a*) *Bombus terrestris* (\bigcirc M. Folschweiller). (*b*) *Bombus magnus* (\bigcirc P. Rasmont). (*c*) Boxplots of time to heat stupor (THS) in *B. terrestris* and *B. magnus* (*n* = 30 for each species). The brown dots are the individual THS values. The two male *B. terrestris* with the lowest THS values (encircled in red) displayed protein expression profiles similar to those of *B. magnus* (figure 3). (*d*) Rate of sperm mortality and (*e*) relative amount of sperm with degraded DNA in *B. terrestris* and *B. magnus* subject to the control treatment (NHS) and the heat-stress treatment (HS). NHS = 12 h at 24°C, and HS = 40°C until heat stupor reached. The white dots are the median values for the treatment groups.

males sampled were of comparable age. They were returned to the laboratory and maintained under controlled conditions: in constant darkness at 24°C with 50–60% relative humidity. They were fed a BIOGLUC sugar solution (Biobest NV, Westerlo, Belgium) until the experiment began 24 h later. As for species identification, all the samples were double-checked to ascertain their identification.

2.2. Heat-stress treatment

A heat-stress (HS) treatment was used to simulate the conditions that could occur during a heatwave, as described elsewhere [35]. Heatwaves involving temperatures of up to 40°C have occurred in more than 100 countries across the globe [36]. Consequently, male *B. magnus* (n = 20) and *B. terrestris* (n = 20) were individually exposed to a temperature of 40°C (relative humidity: 50–60%) under controlled conditions in an incubator (Herp Nursery II). We measured the time to heat stupor (THS), which served as a proxy for heat tolerance. THS was defined as the time between the bumblebee's placement in the incubator and the moment at which the insect fell on its back and was unable to right itself or express its normal reflexes (critical motor function) [37–39]. After reaching heat stupor, the bumblebees were removed from the

incubator and allowed to recover. In the control treatment (NHS), males were kept at 24° C for 12 h, a period equivalent to the maximum THS seen in the HS treatment (figure 1*c*). All analyses related to the size were performed in R (version 4.0.3). Statistical analyses were conducted using linear models (lme4 package), with parameter significances reported as a t-distribution with estimated degrees of freedom.

2.3. Sperm extraction

Sperm were extracted from males (with similar size) in the HS and NHS groups 1 h after they had recovered from heat stupor. To stimulate the males, thumb pressure was gently applied several times to the entire length of sternite 1. Then, sternites 4 and 5 were pressed harder to fully expel the genitalia, including the sperm-filled endophallus. The base of the genitalia was pinched with forceps and gently pulled out of the abdominal cavity, along with the testes and accessory glands. Next, these organs were directly transferred to a Petri dish and doused with 70 µl of sodium phosphate buffer (PBS solution, pH 7.4). The endophallus was carefully dissected to release the sperm, which was collected and transferred into microtubes. This technique avoids extraction of proteins from the accessory glands that are not part of the contents transmitted to the female during copulation. To obtain the seminal fluid, the microtubes were centrifuged at 1100 r.p.m. and 4°C for 15 min; the resulting supernatant—the seminal fluid—was transferred to new microtubes. This approach minimized the seminal fluid from being contaminated with hemolymph or sperm [25]. The tubes were then immediately flash frozen in liquid nitrogen and stored at -80° C until protein extraction could occur. This procedure was repeated for each male which corresponds to one sample for the following proteomics analysis (n = 40).

2.4. Proteomics analysis of the seminal fluid

We characterized the males' HS responses using differential expression proteomics. Samples were sonicated for 3×10 s (amplitude = 40%; IKA U50 sonicator (Staufen, Germany)) in 70 µl of 6 M guanidinium hydrochloride and 25 mM Tris buffer (pH = 7.4). After centrifugation (15 min at 11 000 r.p.m.), the total amount of protein in a sample of the supernatant was determined using the Bradford protein assay; bovine gamma globulin was employed as a standard. Aliquots of protein (100 µg) were reduced with 0.21 M 1,4-dithioerythritol (5% v/v, 56°C, 20 min); alkylated with 0.5 M iodoacetamide (5% v/v, RT, 30 min); and precipitated with cold acetone (-20° C, overnight). The resulting protein pellets were solubilized using 50 mM ammonium bicarbonate containing 2 µg of trypsin (overnight at 37°C). Digestion was stopped with 0.5% formic acid (25% v/v, 0.1% final concentration). Peptide concentrations were measured using a Pierce Quantitative Colorimetric Peptide Assay (Thermo Fisher Scientific). We carried out mass spectrometry analyses using a concentration level of $0.8 \,\mu g \,\mu l^{-1}$ in 2% acetonitrile and 0.1% formic acid in water. Protein identification and quantification were performed using a label-free strategy and ultra-high-performance liquid chromatography-high resolution mass spectrometry (Eksigent NanoLC 425, AB SCIEX TripleTOF 6600+). Peptides (4 μg) were separated along a 15 cm C18 column (Triart C18, 3 μm, YMC) using a linear acetonitrile (I) gradient (5–35% v/v, 75 min) in water containing 0.1% (v/v) formic acid; the flow rate was 5 μ l min⁻¹. Mass spectra (MS) were acquired in high-resolution mode (>35000) between 400 and 250 m/z; we used a 250 ms accumulation time. The instrument was operated in data-dependent acquisition (DDA) mode, and the MS/MS spectra were acquired between 100 and 1500 m/z. The precursor selection parameters were as follows: intensity threshold = 100 cps; maximum precursors per cycle = 90; accumulation time = 25 ms; and exclusion time after two spectra = 15 s. These parameters led to a 4 s duty cycle, which ensured that we obtained high-quality extracted ion chromatograms (XICs) to use for peptide quantification. ProteinPilot software (v. 5.0.1; ABSciex, USA) was employed to search databases for protein sequences. The query parameters included differential amino acid mass shifts for carbamidomethyl cysteine, biological modifications (i.e. oxidated methionine, N-terminal acetylation and glutamine deamidation) and missed trypsin cleavage sites. To construct the proteome, we performed protein identification runs by mapping identified peptides with different libraries among Hymenoptera in Proteome Discoverer. We downloaded a database of protein sequences from Bombus, Apis and Osmia from Uniprot website.

For the SWATH analyses, we defined 100 incremental steps using windows of variable values between 400 and 1250 m/z. The MS/MS working time for each window was 50 ms, resulting in a 5 s duty cycle. The ion chromatograms for the top six fragments of each peptide were obtained, and the

areas under the curve (AUCs) were calculated. PeakView software (v. 2.1.0.11041; ABSciex, USA) was used in the SWATH processing of the proteins identified (FDR < 1%; determined by ProteinPilot 5.0.1). The retention time (RT) was recalibrated automatically using a PepCalMix standard (ABSciex, USA); RTs ranged from 20 to 85 min. Only proteins with 2 or more identifiable peptides were considered. A non-supervised principal components analysis (PCA) applying the Pareto principle was carried out to compare AUCs among groups (MarkerViewTM 1.2.1, ABSciex, USA). Comparisons were only conducted when proteins displayed a fold change that was greater than 1.5 or less than 0.66 and for which the *p*-value was <0.05. All statistical analyses on the proteomics data were conducted in Protein Pilot 5.0.1 using simple two-group comparisons and a Benjamini–Hochberg correction. The functions of these proteins were explored by consulting the scientific literature as well as the Uniprot, KEGG and NCBI databases.

Gene ontology (GO) annotations for *Bombus* data [40,41] in the Hymenoptera Genome Database (available at hymenoptera.elsiklab.missouri.edu/hgd-go-annotation) were used for the GO and term enrichment analyses. For functional annotation of the sequences generated from the LC-MS/MS analyses, the GO terms were associated with all the genes based on the gene IDs of significantly upregulated and downregulated proteins. The GO terms for biological processes (BP) enriched were identified using the R package topGO v. 2.50.0 [42]. Terms displaying significant enrichment were identified ('weight01' algorithm, Fisher's exact test and alpha level of 0.05). We then verified the GO terms associated with BP for the genes in each cluster using g:Profiler [43] and including Bonferroni correction for significance threshold ($p_{adj} < 0.05$). We assessed gene involvement in specific biochemical and metabolic pathways using the Kyoto Encyclopedia of Genes and Genomes (KEGG), via the KEGG Automatic Annotation Server (KAAS) [44]. Separate lists of dysregulated proteins of the pairwise comparisons were loaded to investigate the biological pathways and the protein functions following heat exposure of bumblebee species.

3. Results

As already shown with the same methodology [45], we did not find a significant correlation between THS and the size of individuals (with dry weight as a proxy) for B. terrestris and B. magnus (respectively, p = 0.27 and p = 0.39). We identified and quantified 1121 proteins with at least two or more peptides in the seminal fluid of each of the two species (electronic supplementary material, file S2). The number of differentially expressed proteins (DEPs) varied more between species than within species between treatments (figure 2). Seminal fluid protein composition differed significantly between B. terrestris and B. magnus (perMANOVA, p < 0.001): there were 522 DEPs in the control treatment (167 with lower expression, 355 with higher expression) and 628 DEPs in the HS treatment (103 with lower expression, 525 with higher expression) (perMANOVA, p < 0.001). Within species, DEP numbers were much lower. Between treatments, there were 228 DEPs for B. magnus (175 with lower expression, 53 with higher expression) (perMANOVA, p < 0.001) and 168 DEPs for B. terrestris (43 with lower expression, 125 with higher expression) (perMANOVA, p < 0.01). Consequently, in B. terrestris, protein profiles differed by just 10% between the control and HS treatments (figure 2). A PCA of protein expression yielded similar results: there were two distinct clusters corresponding to the two species (figure 3). For B. terrestris, protein expression patterns were not distinct for the two treatment groups. By contrast, a clearer difference was seen for *B. magnus*. It is worth noting that two male *B. terrestris* from the HS group occurred in the *B. magnus* cluster, displaying the lowest THS values for their species (red circles in figure 1c). Males with THS values this small were previously shown to experience increased sperm mortality and DNA fragmentation (figure 1d,e).

The DEPs identified above were associated with the following functions involved in the HS response (table 1): protein folding (e.g. heat-shock proteins (HSPs), peptidylprolyl isomerase); cytoskeleton structure (e.g. myosin heavy-chain muscle, nesprin-1, spectrin, tubulin α -1 chain-like); signalling; antioxidant activity/defence (e.g. glutathione S-transferase, glutathione peroxidase); protein degradation (e.g. proteins involved in the ubiquitin proteasome system); lipid metabolism (e.g. neuroparsin-A isoform X1; short/medium-chain specific acyl-CoA dehydrogenase); mitochondrial respiratory chain complexes and DNA/RNA metabolism (e.g. Y-box factor homologue, DNA-directed RNA polymerase). These functional categories are linked to biological pathways responsible for preserving cellular homeostasis, like safeguarding and restoring the proteome, digesting and eliminating toxic residues, regulating the transcriptional machinery and DNA metabolism, and promoting cellular integrity [46]. The DEPs were expressed at much higher levels under conditions of



Figure 2. Volcano plots of seminal fluid protein expression in *B. terrestris* and *B. magnus*. Relative protein expression in the seminal fluid of male bumblebees experiencing the control treatment (NHS: 12 h at 24°C) versus the heat-stress treatment (HS: 40°C until heat stupor reached). The $-\log_{10}(p$ -value) is plotted against the $\log_2(\text{fold change})$. A significant difference was defined as a protein displaying a ± 1.5 -fold change and p < 0.05 (prior to log transformation). The grey dots represent proteins that were not differentially expressed between groups (p > 0.05); the blue dots represent proteins whose expression significantly increased; and the green dots represent proteins whose expression significantly decreased.

heat stress in *B. terrestris* and, to a lesser extent, in *B. magnus*. Between the two species, the protein that displayed the greatest change was neuroparsin-A isoform X1, with a fold change of 0.997 for *B. terrestris*. Finally, compared to *B. magnus*, *B. terrestris* had much lower levels of proteins involved in mitochondrial respiratory chain complexes, and thus ROS production, in both treatments but had much higher levels of proteins involved in the capture of ROS. These proteins included the cytochrome b and c subunits, NADH dehydrogenase ubiquinone and NADH ubiquinone oxidoreductase.

Functional annotation using GO terms was performed for the different pairwise comparison groups: (i) B. terrestris NHS–B. terrestris HS; (ii) B. magnus NHS–B. magnus HS; (iii) B. magnus NHS–B. terrestris NHS; and (iv) B. magnus HS-B. terrestris HS (figure 4). In total, we identified for each pairwise comparison groups 15, 30, 64 and 91 GO terms, respectively. For intraspecific comparisons the most affected BP for B. terrestris NHS-B. terrestris HS group (figure 4a) were catabolic process (organonitrogen compound, organic substance). For the group B. magnus NHS-B. magnus HS, more GO terms were identified, especially translation, peptide biosynthetic process, amide biosynthetic process, peptide metabolic process, amide metabolic process, organonitrogen compound biosynthetic process, organonitrogen compound metabolic process and protein metabolic process. For interspecific comparisons (B. magnus versus B. terrestris), both NHS and HS comparisons were characterized by many GO terms. For interspecific NHS comparison, small molecule metabolic process, organonitrogen compound biosynthetic process, organonitrogen compound metabolic process, peptide metabolic process, amide metabolic process, carbohydrate derivative metabolic process, biological process, oxoacid metabolic process, carboxylic acid metabolic process and organic acid metabolic process were found as BP. While for interspecific HS comparison, we found the following BP: organonitrogen compound biosynthetic process, amide metabolic process, peptide metabolic process, translation, peptide biosynthetic process, amide biosynthetic process, small molecule metabolic process, organonitrogen compound metabolic process, biological process, biosynthetic process, organic substance biosynthetic process, metabolic process, cellular biosynthetic process, organic substance metabolic process and protein metabolic process. All the BP were cited in order of significance (p_{adj}). The complete lists of GO terms are available in electronic supplementary material, file S2.



7

royalsocietypublishing.org/journal/rsos

R.

Soc. Open Sci. 10: 231389

Figure 3. Principal component analysis. Expression of seminal fluid proteins in *B. terrestris* and *B. magnus*. Expression of seminal fluid proteins in male bumblebees experiencing the control treatment (NHS: 12 h at 24°C) versus the heat-stress treatment (HS: 40°C until heat stupor reached). Green: *B. magnus*—HS; red: *B. magnus*—NHS; orange: *B. terrestris*—HS; blue: *B. terrestris*—NHS. n = 10 for each species and treatment. The red circle encompasses the two male *B. terrestris* with the lowest THS values (figure 1c).

Downregulated and upregulated proteins were significantly associated with 6 and 14 GO terms for BP, respectively, for *B. terrestris* NHS–*B. terrestris* HS; while they were significantly associated, respectively, with 28 and 2 GO terms for the comparison *B. magnus* NHS–*B. magnus* HS. For interspecific comparisons, we found 39 GO terms associated with downregulated proteins and 31 GO terms associated with upregulated proteins for *B. magnus* NHS–*B. terrestris* NHS comparison, while we found, respectively, 43 and 78 GO terms for *B. magnus* HS–*B. terrestris* HS comparison.

4. Discussion

Sperm cells are largely unable to maintain their own functionality, and it is likely that seminal fluid helps preserve sperm quality [24,25]. Our results are consistent with this hypothesis. We found that the protein composition of seminal fluid varied significantly between *B. terrestris* and *B. magnus*, two closely related bumblebee species whose sperm differ considerably in their vulnerability to heat stress (figure 1) [15].

Our data highlight the richness of seminal fluid proteins in bumblebees: 1121 proteins were identified in each of the two species, while using older mass spectrometry methods, Baer *et al.* [25] identified 57 proteins in the seminal fluid of honeybee drones. Our detailed analysis of seminal fluid protein expression in *B. terrestris* revealed the presence of numerous proteins that could potentially function to protect sperm against environmental stressors. In *B. magnus*, such proteins were not expressed at detectable levels in the control treatment. Even in the HS group, they were found at relatively low concentrations, compared to what was seen in *B. terrestris*.

Although we identified a similar number of seminal fluid proteins in both species, we found pronounced differences in their expression levels. In both the control and HS treatments, proteins with protective functions, such as HSPs, proteases and antioxidants, were differentially expressed to a greater degree in *B. terrestris* versus *B. magnus*. In the HS treatment, several proteins in different functional categories displayed higher expression in *B. magnus* (e.g. protein folding: T-complex protein

Downloaded from https://royalsocietypublishing.org/ on 08 November 2023

Table 1. Proteins differentially expressed in *B. terrestris* and *B. magnus* in the control and heat-stress treatments and their functional categories. Only differentially expressed proteins (fold change < 0.66 or greater than 1.5 and p < 0.05) are described. Examples for each functional category are provided. Control treatment (NHS) = 12 h at 24°C; heat-stress treatment (HS) = 40°C until heat stupor reached.

Main GO terms terrestris NHS - terrestris HS	no. proteins	p adj	$0 \xrightarrow{-\log_{10}(p_{adj})} \le 16$
organonitrogen compound catabolic process	14	5.181×10^{-7}	
organic substance catabolic process	16	7.244×10^{-6}	
catabolic process	16	3.114×10^{-5}	
isoprenoid biosynthetic process	5	4.222×10^{-5}	
small molecule metabolic process	19	4.803×10^{-5}	
macromolecule catabolic process	12	1.001×10^{-4}	
protein catabolic process	10	2.801×10^{-4}	
isoprenoid metabolic process	5	6.835×10^{-4}	
proteolysis involved in protein catabolic process	9	7.878×10^{-4}	
carbohydrate metabolic process	10	5.927×10^{-3}	
proteolysis	15	1.245×10^{-2}	
carbohydrate derivative metabolic process	10	2.466×10^{-2}	
metabolic process	58	2.604×10^{-2}	
aminoglycan metabolic process	3	3.171×10^{-2}	
organonitrogen compound metabolic process	34	3.207×10^{-2}	

(b)

Main GO terms magnus NHS - magnus HS	no. proteins	p adj	$10^{-\log_{10}(p_{adj})} \le 16$
translation	37	1.217×10^{-22}	
pentide biosynthetic process	37	2.384×10^{-22}	
amide biosynthetic process	37	8.760×10^{-22}	
nantida matabalia process	27	1.027 × 10-21	
peptide metabolic process	37	1.027 × 10	
amide metabolic process	37	1.356 × 10 ⁻²⁵	
organonitrogen compound biosynthetic process	43	2.667×10^{-18}	
organonitrogen compound metabolic process	58	9.720×10^{-9}	
protein metabolic process	51	3.829×10^{-8}	
cellular nitrogen compound biosynthetic process	41	8.236×10^{-7}	
cellular biosynthetic process	43	2.342×10^{-6}	
organic substance biosynthetic process	45	3.001×10^{-6}	
metabolic process	86	3.451×10^{-6}	
organic substance metabolic process	83	4.246×10^{-6}	
macromolecule biosynthetic process	38	4 508 × 10 ⁻⁶	
hissunthatia process	45	5.057 × 10-6	
minute process	45	3.537 × 10	
primary metabolic process	80	8.630 × 10 °	
carbohydrate metabolic process	15	8.984 × 10 ⁻⁶	
glycolytic process	6	1.116×10^{-5}	
carbohydrate catabolic process	6	5.763×10^{-5}	
pyruvate metabolic process	6	2.039×10^{-4}	
small molecule metabolic process	21	2.697×10^{-4}	
monocarboxylic acid metabolic process	8	3.648×10^{-4}	
biological process	115	7.790×10^{-4}	
cellular metabolic process	63	9.352×10^{-4}	
gene expression	38	3.516×10^{-3}	
(<i>d</i>)			
Main GO terms magnus HS - terrestris HS	no. proteins	p adj	$\rho^{-\log_{10}(p_{adj})} \le 16$
organonitrogen compound biosynthetic process	104	2.770×10^{-42}	
amide metabolic process	78	8.180×10^{-38}	
peptide metabolic process	74	2.379×10^{-36}	
translation	69	2.464×10^{-33}	
peptide biosynthetic process	69	9.154×10^{-33}	
amide biosynthetic process	70	1.297 × 10 ⁻³²	
small molecule metabolic process	/8	1.105 × 10 ⁻²⁸	
biological and a second	105	3.308 × 10 ⁻¹⁹	
biological_process	121	9.349 x 10 ···	
organic substance biosynthetic process	110	4.108×10^{-17}	
metabolic process	230	1 551 × 10 ⁻¹⁶	
cellular biosynthetic process	110	1.483×10^{-15}	
organic substance metabolic process	216	2.682×10^{-14}	
protein metabolic process	118	5.727×10^{-14}	
cellular nitrogen compound biosynthetic process	96	1.366×10^{-12}	
cellular process	260	8.419×10^{-12}	
nucleobase-containing small molecule metabolic pro	ocess 30	1.795×10^{-11}	
primary metabolic process	201	2.454×10^{-11}	

oyalsocietypublishing.org/journal/rsos. R. Soc. Open Sci. 10: 231389

9

				gene expression	38	3.516×10^{-3}	
(<i>c</i>)				(d)			
Main GO terms magnus NHS - terrestris NHS	no. proteins	p adj	$0^{-\log_{10}(p_{adj})} \le 16$	Main GO terms magnus HS - terrestris HS	no. proteins	p adj	$\rho^{-\log_{10}(p_{adj})} \le 16$
small molecule metabolic process	60	1.693×10^{-19}		organonitrogen compound biosynthetic process	104	2.770×10^{-42}	
organonitrogen compound biosynthetic process	60	1.341×10^{-14}		amide metabolic process	78	8.180×10^{-38}	
organonitrogen compound metabolic process	108	2.292×10^{-10}		peptide metabolic process	74	2.379×10^{-36}	
peptide metabolic process	38	5.245×10^{-10}		translation	69	2.464×10^{-33}	
amide metabolic process	39	1.126×10^{-9}		peptide biosynthetic process	69	9.154×10^{-33}	
carbohydrate derivative metabolic process	30	2.949×10^{-9}		amide biosynthetic process	70	1.297×10^{-32}	
biological_process	260	4.388×10^{-9}		small molecule metabolic process	78	1.105×10^{-28}	
oxoacid metabolic process	29	3.085×10^{-8}		organonitrogen compound metabolic process	163	3.508×10^{-28}	
carboxylic acid metabolic process	29	3.085×10^{-8}		biological_process	337	9.549×10^{-19}	
organic acid metabolic process	29	3.085×10^{-8}		biosynthetic process	121	4.168×10^{-17}	
generation of precursor metabolites and energy	17	1.726×10^{-7}		organic substance biosynthetic process	119	5.630×10^{-17}	and the second second
translation	33	1.743×10^{-7}		metabolic process	230	1.551×10^{-16}	
carbohydrate metabolic process	5	2.706×10^{-7}		cellular biosynthetic process	110	1.483×10^{-15}	
peptide biosynthetic process	33	2.837×10^{-7}		organic substance metabolic process	216	2.682×10^{-14}	
metabolic process	170	6.732×10^{-7}		protein metabolic process	118	5.727×10^{-14}	
amide biosynthetic process	33	7.245×10^{-7}		cellular nitrogen compound biosynthetic process	96	1.366×10^{-12}	
nucleobase-containing small molecule metabolic pro	cess 21	5.242×10^{-6}		cellular process	260	8.419×10^{-12}	
protein folding	14	1.022×10^{-5}		nucleobase-containing small molecule metabolic pro	cess 30	1.795×10^{-11}	
ATP metabolic process	8	1.927×10^{-5}		primary metabolic process	201	2.454×10^{-11}	
nucleotide metabolic process	18	2.035×10^{-5}		carboxylic acid metabolic process	36	3.701×10^{-11}	
nucleoside phosphate metabolic process	18	2.450×10^{-5}		organic acid metabolic process	36	3.701×10^{-11}	
purine nucleotide metabolic process	15	4.324×10^{-5}		oxoacid metabolic process	36	3.701×10^{-11}	
cellular respiration	12	6.491×10^{-5}		carbohydrate derivative metabolic process	35	9.236×10^{-11}	
ATP biosynthetic process	7	1.246×10^{-4}		cellular metabolic process	168	2.291×10^{-10}	
proton motivo forso drivon ATB synthesis	7	1.246×10^{-4}		nurina nucleotida matcholia process	21	2.871×10^{-9}	

Figure 4. Functional distribution of the dysregulated proteins following heat exposure (40°C) according to the main impacted biological processes (BP) for the different pairwise comparison groups. Data for the first 25 gene ontology term enrichment are given. (a) Bombus terrestris NHS–B. terrestris HS; (b) B. magnus NHS–B. magnus HS; (c) B. magnus NHS–B. terrestris NHS; and (d) B. magnus HS-B. terrestris HS. In total, 15, 30, 64 and 91 GO terms were identified respectively for each pairwise comparison groups. Assignments were made with the R package topGO v. 2.50.0 and g:Profiler including Bonferroni correction for significance threshold ($p_{adi} < 0.05$). The complete lists of GO terms are available in electronic supplementary material, file S2. Control treatment (NHS) = 12 h at 24°C; heat-stress treatment (HS) = 40°C until heat stupor.

1 subunit epsilon, delta, zeta; antioxidant activity: hydroxyacylglutathione hydrolase, glutathione S-transferase, cytochrome c oxidase; lipid metabolism: acetyl-CoA acetyltransferase). However, the expression was much lower than seen in B. terrestris, even when compared with B. terrestris in the control treatment (table 1; electronic supplementary material, file S2). This finding suggests that, compared to male B. magnus, male B. terrestris may benefit from a better protection of their sperm cells that are more resistant to environmental stress. Support for this idea comes from previous research [15]: heat stress did not significantly affect sperm viability or DNA fragmentation in B. terrestris but did cause severe damage to sperm in more sensitive species as B. magnus. Furthermore, as shown in our GO term enrichment analyses, the heat exposure (NHS-HS) affected the regulation of fewer proteins associated with heat shock response in B. terrestris than in its sister species B. magnus. The relatively small changes in the protein composition of seminal fluid in B. terrestris suggest that this species is constitutively more capable of coping with thermal stress, thus maintaining sperm integrity and viability with more upregulated proteins associated with GO terms including carbohydrate metabolic process, generation of precursor metabolites and energy, protein folding and ATP biosynthetic process. The enriched GO terms related to proteostasis identified in B. terrestris were mostly trafficking and degradation (proteolysis), which are two key steps in autophagy [47], a cytoprotective process linked to cell viability [48].

There are a few key results to highlight. First, no matter the treatment, male B. terrestris displayed much higher levels of numerous proteins compared to B. magnus. These proteins were involved in maintaining cellular homeostasis, thermotolerance, antioxidant activity, lipid metabolism, sugar metabolism, protein folding (e.g. protein lethal(2)essential for life, HSPs), cytoskeleton structure (e.g. myosin, tubulin, profilin), defence (e.g. antimicrobial activity, antioxidant processes), protein degradation, lipid/sugar metabolism, DNA metabolism and RNA metabolism. These functional categories are known to contribute to the high thermotolerance of Cataglyphis desert ants [49,50], mites [51] and marine organisms [52]. Second, numerous proteins associated with mitochondrial respiratory chain complexes were differentially expressed between B. terrestris and B. magnus. Mitochondrial respiratory proteins are known to produce toxic ROS during heat stress [53]. Several of these proteins (e.g. cytochrome b561 isoform X2, NADH-ubiquinone oxidoreductase) displayed lower levels of expression in B. terrestris, meaning ROS production was constrained. More strikingly, proteins that capture and eliminate any ROS produced via mitochondrial respiration (e.g. cytochrome P450, cytochrome c oxidase, superoxide dismutase) were expressed at much higher levels in B. terrestris (control and HS treatments) than in B. magnus. Thus, seminal fluid proteins likely help balance ROS production and accumulation in sperm cells during and after heat stress [54]. Third, a wide range of HSPs were differentially expressed in the seminal fluid of male B. terrestris experiencing both treatments. These proteins included HSP 70 kDa, 28 kDa heat- and acid-stable phosphoprotein, HSP 83 and protein lethal(2)essential for life. By contrast, such was not the case in B. magnus. As a protein family, HSPs help maintain cell integrity during physiological stress. In insects, the basal levels of HSPs are correlated with environmental factors in a species-specific manner and are synthesized at different threshold temperatures (e.g. ants [55]; honeybees [56]; fruit flies [57]). Taken together, these differences in protein expression patterns may partly explain why high temperatures are much less of a threat to sperm viability and DNA integrity in B. terrestris than in B. magnus (figure 1d,e) [15].

Neuroparsin-A isoform X1 was one of the most overexpressed DEPs in *B. terrestris*: its expression was higher in the control and HS groups compared to *B. magnus* (fold change: 0.997). Neuroparsins are multifunctional neurohormones that inhibit the effects of juvenile hormones, stimulate fluid reabsorption in isolated recta and, more importantly, increase levels of lipids and trehalose in the hemolymph [58]. Since sugar is the main energy source for sperm [27], the higher concentrations of trehalose in the seminal fluid likely help maintain sperm viability under environmental stressors. As for lipids, they release substantial amounts of water when metabolized, which is thought to play a crucial role in both vertebrates and invertebrates facing heat and desiccation stress [59,60]. Unlike in *B. terrestris*, expression of neuroparsin-A did not differ between the two treatments in *B. magnus* and was much lower overall than in *B. terrestris* in general. Moreover, *B. terrestris* (NHS and HS) was characterized by the enrichment in GO terms associated with the metabolism of carbohydrates (e.g. trehalose) making sugar resources more available to spermatozoa, thereby playing a key role in sperm conservation. Future studies should explore this neurohormone's role in maintaining sperm quality in *B. terrestris*.

Little may be known about the molecular underpinnings of interspecific differences of seminal fluid content. While genetic and transcriptomic responses are well documented, much less attention has been paid to the expression of proteins, the actual molecular agents behind phenotypes [61]. Here, we showed that two bumblebees had very different seminal fluid proteomes and that their protein expression profiles fit with their ecological traits. *Bombus terrestris* is more broadly distributed and heat tolerant, while *B. magnus* is a species of concern that is heat sensitive. These differences could be mechanistically explained, at least in part, by differences in the vulnerability of their sperm to heat stress, a trait that could scale up to shape species resilience to global warming and extreme climatic events. However, it is important to note that our conclusions, while consistent with the literature and previous experiments on both species, are correlational. Further experiments based on functional tests to activate/inactivate some genes which could involve maintaining high sperm quality are needed to confirm our hypotheses if seminal proteome differences could cause the difference in heat-sensitivity of sperm between the bumblebee species.

To date, several risk factors have been identified that are contributing to the global decline of bumblebees, including changes in microbiota, diet, temperature and pesticide exposure [62–65]. However, many of these studies have focused on *B. terrestris*, a commercially available and invasive species [31] whose fitness seems to be only marginally affected by thermal stress [45,66]. The consequences of such stress could be far more dramatic in a sensitive species such as *B. magnus*. Thus, we risk obtaining biased results if we only use *B. terrestris* to extrapolate how bumblebees in general may cope with anthropogenic disturbances. Future studies must use a range of model species to explore the potential physiological and transgenerational impacts of environmental stressors on bumblebee reproduction [67]. Finally, bumblebee males live outside the nest and may be exposed to

high temperatures during their courtship behaviour and nectar foraging. Further studies on sperm quality and the protein profile of the queen's spermathecal fluid (also important for fertilization success) after copulation are also needed to improve our overview of the effect of hyperthermal stress on queens, stored sperm and, ultimately, colony fitness.

Ethics. In European juriceprudence, animals intend only vertebrates. From a legal point of view, bumblebees are not considered as laboratory animals.

Data accessibility. Protein data for *B. terrestris* and *B. magnus* are available in electronic supplementary material, files S1 and S2, describing the proteome regulation analyses (electronic supplementary material, file S1) and gene ontology enrichment analyses (electronic supplementary material, file S2) [68].

Declaration of Al use. We have not used AI-assisted technologies in creating this article.

Benefit-Sharing section. Benefits from this research accrue from the sharing of our data and results based on our methodology as described above.

Authors' contributions. B.M.: conceptualization, data curation, formal analysis, investigation, methodology, software, visualization, writing—original draft, writing—review and editing; K.P.: conceptualization, formal analysis, methodology, writing—original draft, writing—review and editing; C.D.: data curation, formal analysis, writing—original draft; R.W.: formal analysis, supervision, validation, writing—original draft; S.A.: conceptualization, funding acquisition, investigation, methodology, resources, supervision, validation, writing—original draft.

All authors gave final approval for publication and agreed to be held accountable for the work performed therein. **Conflict of interest declaration.** The authors declare no conflict of interest.

Funding. This work was supported by the Belgian National Fund for Scientific Research (FRS-FNRS; grant no. J.0004.20F to S.A., PhD fellowship to K.P., and postdoctoral fellowship to B.M.) and the Université Libre de Bruxelles (Fonds d'Encouragement à la Recherche and Actions Blanches to S.A.).

Acknowledgements. We thank the native speaker Jessica Pearce for the proofreading, Dr Alison Mcafee for her advice on the manuscript and the two anonymous reviewers.

References

- Dirzo R, Young HS, Galetti M, Ceballos G, Isaac NJ, Collen B. 2014 Defaunation in the anthropocene. *Science* **345**, 401–406. (doi:10. 1126/science.1251817)
- Parmesan C. 2006 Ecological and evolutionary responses to recent climate change. *Annu. Rev. Ecol. Evol. Syst.* 37, 637–669. (doi:10.1146/ annurev.ecolsys.37.091305.110100)
- Hance T, van Baaren J, Vernon P, Boivin G. 2007 Impact of extreme temperatures on parasitoids in a climate change perspective. *Annu. Rev. Entomol.* 52, 107–126. (doi:10.1146/annurev. ento.52.110405.091333)
- Hoffmann AA, Chown SL, Clusella-trullas S. 2013 Upper thermal limits in terrestrial ectotherms: how constrained are they? *Funct. Ecol.* 27, 934–949. (doi:10.1111/j.1365-2435.2012.02036.x)
- Meehl GA, Tebaldi C. 2004 More intense, more frequent, and longer lasting heat waves in the 21st century. *Science* **305**, 994–998. (doi:10. 1126/science.1098704)
- Ragone F, Wouters J, Bouchet F. 2018 Computation of extreme heat waves in climate models using a large deviation algorithm. *Proc. Natl Acad. Sci. USA* 115, 24–29. (doi:10.1073/ pnas.1712645115)
- Huntley B et al. 2010 Beyond bioclimatic envelopes: dynamic species' range and abundance modelling in the context of climatic change. Ecography 33, 621–626.
- Bridle JR, Vines TH. 2007 Limits to evolution at range margins: when and why does adaptation fail? *Trends Ecol. Evol.* 22, 140–147. (doi:10. 1016/j.tree.2006.11.002)
- Palmer G et al. 2017 Climate change, climatic variation and extreme biological responses. Phil.

Trans. R. Soc. B 372, 20160144. (doi:10.1098/ rstb.2016.0144)

- Harvey JA *et al.* 2022 Scientists' warning on climate change and insects. *Ecol. Monogr.* 93, e1553. (doi:10.1002/ecm.1553)
- Cahill AE *et al.* 2013 How does climate change cause extinction? *Proc. R. Soc. B* 280, 20121890. (doi:10.1098/rspb.2012.1890)
- Kingsolver JG, Diamond SE, Buckley LB. 2013 Heat stress and the fitness consequences of climate change for terrestrial ectotherms. *Funct. Ecol.* 27, 1415–1423. (doi:10.1111/1365-2435.12145)
- Neven LG. 2000 Physiological responses of insects to heat. *Postharvest Biol. Technol.* 21, 103–111. (doi:10.1016/S0925-5214(00)00169-1)
- Conrad T, Stöcker C, Ayasse M. 2017 The effect of temperature on male mating signals and female choice in the red mason bee, *Osmia bicornis* (L.). *Ecol. Evol.* **7**, 8966–8975. (doi:10. 1002/ece3.3331)
- Martinet B, Zambra E, Przybyla K, Lecocq T, Anselmo A, Nonclercq D, Rasmont P, Michez D, Hennebert E. 2021 Mating under climate change: impact of simulated heatwaves on the reproduction of model pollinators. *Funct. Ecol.* 35, 739–752. (doi:10.1111/1365-2435.13738)
- David JR, Araripe LO, Chakir M, Legout H, Lemos B, Petavy G, Rohmer C, Joly D, Moreteau B. 2005 Male sterility at extreme temperatures: a significant but neglected phenomenon for understanding Drosophila climatic adaptations. *J. Evol. Biol.* **18**, 838–846. (doi:10.1111/j.1420-9101.2005.00914.x)
- 17. Nguyen TM, Bressac C, Chevrier C. 2013 Heat stress affects male reproduction in a parasitoid

wasp. J. Insect Physiol. 59, 248–254. (doi:10. 1016/j.jinsphys.2012.12.001)

- Sales K et al. 2018 Experimental heatwaves compromise sperm function and cause transgenerational damage in a model insect. Nat. Commun. 9, 4771. (doi:10.1038/s41467-018-07273-z)
- Stürup M, Baer-imhoof B, Nash DR, Boomsma JJ, Baer B. 2013 When every sperm counts: factors affecting male fertility in the honeybee *Apis mellifera. Behav. Ecol.* 24, 1192–1198. (doi:10.1093/beheco/art049)
- Mayhew PJ. 2007 Why are there so many insect species? Perspectives from fossils and phylogenies. *Biol. Rev.* 82, 425–454. (doi:10. 1111/j.1469-185X.2007.00018.x)
- Boomsma JJ, Baer B, Heinze J. 2005 The evolution of male traits in social insects. Annu. Rev. Entomol. 50, 395–420. (doi:10.1146/ annurev.ento.50.071803.130416)
- Kramer BH, van Doorn GS, Weissing FJ, Pen I. 2016 Lifespan divergence between social insect castes: challenges and opportunities for evolutionary theories of aging. *Curr. Opin. Insect Sci.* 16, 76–80. (doi:10.1016/j.cois.2016.05.012)
- Cameron SA, Sadd BM. 2019 Global trends in bumblebee health. Annu. Rev. Entomol. 65, 209–232. (doi:10.1146/annurev-ento-011118-111847)
- Poiani A. 2006 Complexity of seminal fluid: a review. *Behav. Ecol. Sociobiol.* **60**, 289–310. (doi:10.1007/s00265-006-0178-0)
- Baer B, Heazlewood JL, Taylor NL, Eubel H, Millar AH. 2009 The seminal fluid proteome of the honeybee *Apis mellifera*. *Proteomics* 9, 2085–2097. (doi:10.1002/pmic.200800708)

royalsocietypublishing.org/journal/rsos R. Soc. Open Sci. 10: 231389

- King M, Eubel H, Millar AH, Baer B. 2011 Proteins within the seminal fluid are crucial to keep sperm viable in the honeybee *Apis* mellifera. J. Insect Physiol. 57, 409–414. (doi:10. 1016/j.jinsphys.2010.12.011)
- Pilch B, Mann M. 2006 Large-scale and highconfidence proteomic analysis of human seminal plasma. *Genome Biol.* 7, R40. (doi:10. 1186/gb-2006-7-5-r40)
- Ramm SA. 2020 Seminal fluid and accessory male investment in sperm competition. *Phil. Trans. R. Soc. B* 375, 20200068. (doi:10.1098/ rstb.2020.0068)
- Rasmont P et al. 2015 Climatic risk and distribution Atlas of European bumblebees. BioRisk 10, 1–236. (doi:10.3897/biorisk.10.4749)
- Inari N, Nagamitsu T, Kenta T, Goka K, Hiura T. 2005 Spatial and temporal pattern of introduced *Bombus terrestris* abundance in Hokkaido, Japan, and its potential impact on native bumblebees. *Popul. Ecol.* 47, 77–82. (doi:10. 1007/s10144-004-0205-9)
- Torretta JP, Medan D, Arahamovich AH. 2006 First record of the invasive bumblebee *Bombus terrestris* (L.) (Hymenoptera, Apidae) in Argentina. *Trans. Am. Entomol. Soc.* 132, 285–289. (doi:10.3157/0002-8320(2006) 132[285:FROTIB]2.0.C0;2)
- 32. Nieto A et al. 2017 European red list of bees.
- Soroye P, Newbold T, Kerr J. 2020 Climate change contributes to widespread declines among bumblebees across continents. *Science* 367, 685–688. (doi:10.1126/science.aax8591)
- Ayasse M, Jarau S. 2014 Chemical ecology of bumblebees. Annu. Rev. Entomol. 59, 299–319. (doi:10.1146/annurev-ento-011613-161949)

Downloaded from https://royalsocietypublishing.org/ on 08 November 2023

- Martinet B, Lecocq T, Smet J, Rasmont P. 2015 A protocol to assess insect resistance to heat waves, applied to bumblebees (*Bombus* Latreille, 1802). *PLoS ONE* **10**, e0118591. (doi:10.1371/journal.pone.0118591)
- Herrera M, Ferreira AA, Coley DA, de Aquino RRB. 2016 SAX-quantile based multiresolution approach for finding heatwave events in summer temperature time series. *AI Commun.* 29, 725–732. (doi:10.3233/AIC-160716)
- Huang S-P, Hsu Y, Tu M-C. 2006 Thermal tolerance and altitudinal distribution of two Sphenomorphus lizards in Taiwan.
 J. Therm. Biol 31, 378–385. (doi:10.1016/j. itherbio.2005.11.032)
- Uvarov BP. 1931 Insects and climate. *Trans.* Entomol. Soc. Lond. **79**, 1–232. (doi:10.1111/j. 1365-2311.1931.tb00696.x)
- Bodenheimer FS, Klein HZ. 1930 Über die Temperaturabhängigkeiten von Insekten. J. Comp. Physiol. A 11, 345–385.
- Elsik CG, Tayal A, Unni DR, Burns GW, Hagen DE. 2018 Hymenoptera Genome Database: using HymenopteraMine to enhance genomic studies of hymenopteran insects. In *Eukaryotic genomic databases: methods and protocols* (ed. M Kollmar), pp. 513–556. New York, NY: Humana Press. (doi:10.1007/978-1-4939-7737-6_17)

- Sadd BM *et al.* 2015 The genomes of two key bumblebee species with primitive eusocial organization. *Genome Biol.* **16**, 76. (doi:10. 1186/s13059-015-0623-3)
- Alexa A, Rahnenführer J. 2009 Gene set enrichment analysis with topGO. *Bioconductor Improv.* 27, 1–26.
- Raudvere U, Kolberg L, Kuzmin I, Arak T, Adler P, Peterson H, Vilo J. 2019 g:Profiler: a web server for functional enrichment analysis and conversions of gene lists (2019 update). *Nucleic Acids Res.* 47, W191–W198. (doi:10.1093/nar/qkz369)
- Moriya Y, Itoh M, Okuda S, Yoshizawa AC, Kanehisa M. 2007 KAAS: an automatic genome annotation and pathway reconstruction server. *Nucleic Acids Res.* 35(suppl_2), W182–W185. (doi:10.1093/nar/qkm321)
- Martinet B et al. 2021 Global effects of extreme temperatures on wild bumblebees. Conserv. Biol. 35, 1507–1518. (doi:10.1111/cobi.13685)
- Evgen'ev MB, Garbuz DG, Zatsepina OG. 2014 Heat shock proteins and whole-body adaptation to extreme environments, p. 218. Berlin, Germany: Springer.
- Rubinsztein DC, Mariño G, Kroemer G. 2011 Autophagy and aging. *Cell* **146**, 682–695. (doi:10.1016/j.cell.2011.07.030)
- Hansen M, Rubinsztein DC, Walker DW. 2018 Autophagy as a promoter of longevity: insights from model organisms. *Nat. Rev. Mol. Cell Biol.* 19, 579–593. (doi:10.1038/s41580-018-0033-y)
- Perez R, de Souza Araujo N, Defrance M, Aron S. 2021 Molecular adaptations to heat stress in the thermophilic ant genus Cataglyphis. *Mol. Ecol.* 30, 5503–5516. (doi:10.1111/mec.16134)
- Perez R, Benbachir M, Decroo C, Mascolo C, Wattiez R, Aron S. 2023 *Cataglyphis* desert ants use distinct behavioral and physiological adaptations to cope with extreme thermal conditions. *J. Therm. Biol.* **111**, 103397. (doi:10. 1016/j.jtherbio.2022.103397)
- Tian CB, Li YY, Huang J, Chu WQ, Wang ZY, Liu H. 2020 Comparative transcriptome and proteome analysis of heat acclimation in predatory mite *Neoseiulus barkeri. Front. Physiol.* 11, 426. (doi:10.3389/fphys.2020.00426)
- Tomanek L. 2010 Variation in the heat shock response and its implication for predicting the effect of global climate change on species' biogeographical distribution ranges and metabolic costs. J. Exp. Biol. 213, 971–979. (doi:10.1242/jeb.038034)
- Friesen CR, Noble DWA, Olsson M. 2020 The role of oxidative stress in postcopulatory selection. *Phil. Trans. R. Soc. Lond. B* 375, 20200065. (doi:10.1098/rstb.2020.0065)
- Bui AD, Sharma R, Henkel R, Agarwal A. 2018 Reactive oxygen species impact on sperm DNA and its role in male infertility. *Andrologia* 50, e13012. (doi:10.1111/and.13012)
- Gehring WJ, Wehner R. 1995 Heat shock protein synthesis and thermotolerance in Cataglyphis, an ant from the Sahara desert. *Proc. Natl Acad. Sci.* USA 92, 2994–2998. (doi:10.1073/pnas.92.7.2994)

- Elekonich MM. 2009 Extreme thermotolerance and behavioral induction of 70-kDa heat shock proteins and their encoding genes in honey bees. *Cell Stress Chaperones* 14, 219–226. (doi:10.1007/s12192-008-0063-z)
- Feder ME, Blair N, Figueras H. 1997 Natural thermal stress and heat-shock protein expression in Drosophila larvae and pupae. *Funct. Ecol.* **11**, 90–100. (doi:10.1046/j.1365-2435.1997.00060.x)
- Girardie J, Huet JC, Pernollet JC. 1990 The locust neuroparsin A: sequence and similarities with vertebrate and insect polypeptide hormones. *Insect Biochem.* 20, 659–666. (doi:10.1016/ 0020-1790(90)90079-A)
- Marron MT, Markow TA, Kain KJ, Gibbs AG. 2003 Effects of starvation and desiccation on energy metabolism in desert and mesic *Drosophila*. *J. Insect Physiol.* **49**, 261–270. (doi:10.1016/ S0022-1910(02)00287-1)
- Rutkowska J, Sadowska ET, Cichoń M, Bauchinger U. 2016 Increased fat catabolism sustains water balance during fasting in zebra finches. J. Exp. Biol. 219, 2623–2628. (doi:10. 1242/jeb.138966)
- Baer B, Millar AH. 2016 Proteomics in evolutionary ecology. J. Proteomics 135, 4–11. (doi:10.1016/j.jprot.2015.09.031)
- Gill RJ, Raine NE. 2014 Chronic impairment of bumblebee natural foraging behaviour induced by sublethal pesticide exposure. *Funct. Ecol.* 28, 1459–1471. (doi:10.1111/1365-2435.12292)
- Vanderplanck M, Martinet B, Carvalheiro LG, Rasmont P, Barraud A, Renaudeau C, Michez D. 2019 Ensuring access to high-quality resources reduces the impacts of heat stress on bees. *Sci. Rep.* 9, 12596. (doi:10.1038/s41598-019-49025-z)
- Rothman JA, Russell KA, Leger L, McFrederick QS, Graystock P. 2020 The direct and indirect effects of environmental toxicants on the health of bumblebees and their microbiomes. *Proc. R. Soc. B* 287, 20200980. (doi:10.1098/ rspb.2020.0980)
- Maebe K, Hart AF, Marshall L, Vandamme P, Vereecken NJ, Michez D, Smagghe G. 2021 Bumblebee resilience to climate change, through plastic and adaptive responses. *Glob. Change Biol.* 27, 4223–4237. (doi:10.1111/gcb.15751)
- Przybyla K, Michez D, Zambra E, Anselmo A, Hennebert E, Rasmont P, Martinet B. 2021 Effects of heat stress on mating behavior and colony development in *Bombus terrestris* (Hymenoptera: Apidae). *Front. Ecol. Evol.* 9, 748405. (doi:10.3389/fevo.2021.748405)
- Den Boer SP, Baer B, Boomsma JJ. 2010 Seminal fluid mediates ejaculate competition in social insects. *Science* **327**, 1506–1509. (doi:10. 1126/science.1184709)
- Martinet B, Przybyla K, Decroo C, Wattiez R, Aron S. 2023 Proteomic differences in seminal fluid of social insects whose sperm differ in heat tolerance. Figshare. (doi:10.6084/m9.figshare.c. 6914075)