

# 1 Antagonistic effects of chemical mixtures on the oxidative stress response are silenced by heat stress and 2 reversed under dietary restriction 3

4 *The oxidative stress response to chemical mixtures*  
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15 exposure  
16

## 17 Abstract 18

19 Chemical agents released into the environment can induce oxidative stress in organisms, which is  
20 detrimental for health. Although environmental exposures typically incorporate multiple chemicals,  
21 organismal studies on oxidative stress derived from chemical agents commonly study exposures to  
22 individual compounds. In this work, we explore how chemical mixtures drive the oxidative stress response  
23 under various conditions in the nematode *C. elegans*, by quantitatively assessing levels of *gst-4* expression.  
24 Our results indicate that naphthoquinone mixtures drive responses differently than individual components,  
25 and that altering environmental conditions, such as increased heat and reduced food availability, result in  
26 dramatically different oxidative stress responses mounted by *C. elegans*. When exposed to heat, the  
27 oxidative stress response is diminished. Notably, when exposed to limited food, the oxidative stress  
28 response specific to juglone is significantly heightened, while identified antagonistic interactions between  
29 some naphthoquinone components in mixtures are abolished. This implies that organismal responses to  
30 xenobiotics is confounded by environment and stressor interactions. Given the high number of variables  
31 under study, and their potential combinations, a simplex centroid design was used to capture such non-  
32 trivial response over the design space. This makes the case for the adoption of Design of Experiments  
33 approaches as they can greatly expand the experimental space probed in noisy biological readouts, and in  
34 combinatorial experiments. Our results also reveal gaps in our current knowledge of the organismal  
35 oxidative stress response, which can be addressed by employing sophisticated design of experiments  
36 approaches to identify significant interactions.

## 37 Introduction

38 Oxidative stress, which has deleterious effects on health<sup>1-3</sup>, can be induced by ROS (Reactive Oxygen  
39 Species) generated from oxidant chemicals. The effects of oxidant exposures on biological systems have  
40 been an important area of study, although these effects have been mostly analyzed by employing chemical  
41 exposures of individual components.<sup>4</sup> However, realistic environmental exposures are mixtures of multiple  
42 components.<sup>5-7</sup> In addition, environmental factors, such as diet and temperature, can modulate the  
43 mechanisms by which chemicals induce toxicity and activate defense responses in living organisms.<sup>7,8</sup> It is  
44 still unclear how chemical mixtures drive oxidative stress and how environmental conditions modify such

45 responses. In this work, we analyze how mixtures of oxidant species, in particular naphthoquinones,  
46 differentially drive the oxidative stress response in the model organism *C. elegans*.

47 Naphthoquinones are strong oxidants. They are used as precursors of toxic industrial chemicals.<sup>9</sup> They are  
48 also a product of fossil fuel combustion and atmospheric photochemical conversions, and are thus found in  
49 ambient particulate matter.<sup>10</sup> Environmental exposures to naphthalene (a precursor for naphthoquinones)  
50 are significant as it is found in the atmosphere and in cigarette smoke.<sup>11-13</sup> Naphthalene toxicity is thought  
51 to occur through the action of naphthoquinones.<sup>14,15</sup> Naphthoquinones have been hypothesized to induce  
52 oxidative stress through two distinct mechanisms<sup>16,17</sup>: depletion of glutathione (an antioxidant that  
53 neutralizes ROS and counteracts xenobiotics by conjugation) through Michael reaction, or production of  
54 ROS through redox cycling.<sup>16</sup> It is unclear if differences in the cytotoxic mechanisms amongst  
55 naphthoquinones could be reflected as differences in organismal responses to naphthoquinone mixtures.  
56 Naphthoquinone exposures at low concentrations can also induce beneficial effects. Simultaneous exposure  
57 to naphthoquinone derivatives such as juglone and plumbagin drive SKN-1/NRF-2 transcription factor-  
58 mediated hormesis in *C. elegans* at low concentrations, but turn toxic at higher concentrations.<sup>18</sup>  
59 Naphthoquinones have also been shown to have anti-inflammatory effects in other model organisms.<sup>19</sup> For  
60 example, allergen induced rats treated with juglone had a reduction in pulmonary eosinophils and  
61 bronchoalveolar lavage fluid.<sup>20</sup> Given their prevalence as derivatives of naphthalene, and the differential  
62 responses to naphthoquinone exposures, it is critical to study the effects of naphthoquinone mixtures on  
63 organismal health.

64 The model system *C. elegans* facilitates studies on toxicity in a live organism with a well characterized  
65 nervous system, cell lineage, and physiology. *C. elegans* has proven to be a powerful model due to its small  
66 size, easy maintenance, and mapped genome and neuronal wiring. It enables *in vivo* studies using  
67 fluorescent markers due to their transparent bodies and ease of genetic manipulation.<sup>21</sup> *C. elegans* has also  
68 been useful to study chemical mixture toxicity through growth and fertility assays.<sup>22-25</sup> *C. elegans* and  
69 humans share concordant pathways, such as the insulin/IGF-1 signaling pathway (IIS), which regulates  
70 lifespan and healthspan extension driven by dietary restriction.<sup>26</sup> Two-thirds of human proteins have  
71 homologs in *C. elegans*.<sup>26</sup> *C. elegans* has been used to study mechanisms of toxicity identification, such as  
72 those produced by phorbol esters.<sup>26</sup> Finally, toxicological studies have shown up to 69% concordance  
73 between *C. elegans* and mammalian toxicological data.<sup>27</sup> Another study identified concordance between *C.*  
74 *elegans* data and that from rabbits and rats to be in the 45-53% range, just slightly lower than the  
75 concordance between rabbit and rat data (58%).<sup>28</sup>

76 Defense mechanisms to metabolize and eliminate xenobiotics are evolutionarily conserved from single cell  
77 organisms to humans.<sup>29</sup> In mammalian cells, NRF-1, NRF-2, NRF-3 are a class of NF-E2-related factor 2  
78 (NRF) transcription regulators employed for such defense mechanisms.<sup>30</sup> In *C. elegans*, the oxidative stress  
79 response pathway is activated to counteract the toxicity caused by oxidative stressors.<sup>31</sup> The SKN-1  
80 transcription factor, the functional ortholog of mammalian NRF-2, is major regulator of the oxidative  
81 stress response in *C. elegans*.<sup>30,32,33</sup> It should be noted that SKN-1 diverges from NRF-2 in the way it binds  
82 to DNA. However, the similarities allow us to study SKN-1 in *C. elegans* as a model for mammalian NRF-  
83 2.<sup>30</sup> SKN-1 has also been linked to other much broader homeostatic functions such as reducing stress,  
84 counteracting lipid accumulation, mitochondrial biogenesis and mitophagy, among others.<sup>30</sup> SKN-1 activity  
85 in response to chemicals and heavy metals has been studied by examining expression of SKN-1-regulated  
86 genes using endogenously expressed fluorescent reporters. SKN-1 driven expression is mostly studied in  
87 the intestine, where digestion and detoxification occur.<sup>4,34-36</sup> Multiple antioxidant response elements  
88 (AREs) containing genes are downstream targets of SKN-1, such as *gst-4* and *gcs-1*, which encode for drug-  
89 metabolizing glutathione S-transferase (GST-4) and gamma-glutamyl cysteine synthetase (GCS-1),  
90 important in glutathione synthesis, respectively. For example, prior work by Crombie et al. focused on  
91 studying the effect of environmental factors on the oxidative stress response to juglone using a two level

92 full factorial design, by monitoring *gst-4* expression.<sup>37</sup> *gst-4* is commonly used as proxy for SKN-1 activity  
93 and thus activation of the oxidative stress response.<sup>38-40</sup>

94 In this study, we analyzed the effects of naphthoquinone mixtures on the *C. elegans* oxidative stress  
95 response under various environmental conditions, as determined by a *gst-4* translational fluorescent  
96 reporter. We follow a Design of Experiments (DoE) approach that enables systematic examination of the  
97 input factors to determine the individual and combinatorial influence on the measured response,<sup>41,42</sup> while  
98 avoiding the unfeasible number of experiments required for full factorial designs with multi-level factors.  
99 This approach minimizes the number of experimental runs necessary to measure interactions between three  
100 naphthoquinones and two environmental conditions, while enabling comparisons from independent  
101 biological populations. We quantify response surfaces for these ternary mixtures under different conditions.  
102 We find that naphthoquinone mixtures drive antagonistic interactions, but these interactions are drastically  
103 modified by dietary restriction. On the other hand, heat stress abolishes oxidative stress response to both  
104 individual components and mixtures of naphthoquinones. This *gst-4* response is independent of the IIS  
105 factor DAF-16. The ROS levels and resistance to acute oxidative stress that result from exposure to  
106 naphthoquinone mixtures are also modulated by environmental factors, in the opposite direction as *gst-4*  
107 expression.

## 108 **Materials and methods**

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### 110 **Strain maintenance**

111 *C. elegans* was maintained on standard Nematode Growth Medium (NGM) plates seeded with OP50 *E. coli*  
112 bacteria and maintained at 25 °C. Worms at day 1 of adulthood were bleached and age synchronized using  
113 standard protocols,<sup>43</sup> and grown to the young adult stage before application of oxidative stress. The strains  
114 used in the experiments were CL2166: *dvLs19* [pAF15 (*gst-4P::GFP::NLS*)], MAH97 *mulS109* [*daf-*  
115 *16p::GFP::DAF-16* cDNA + *odr-1p::RFP*], and N2 (wild type) which were obtained from the  
116 Caenorhabditis Genetics Center. Animals were exposed to either control (S-Medium) or naphthoquinone  
117 mixtures in liquid culture in the presence of HB101 *E. coli* as a food source, based on established  
118 procedures.<sup>44</sup> *E. coli* was grown in LB media in the presence of 4 mM streptomycin. Bacteria were washed  
119 thrice with SB media, pelletized, and resuspended in S-Medium at a concentration of 100 mg mL<sup>-1</sup>. Bacteria  
120 was then killed by heat treatment at 65 °C for a period of 45 mins,<sup>37</sup> to avoid bacterial metabolism to  
121 confound results.

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### 123 **Chemical preparation**

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125 Juglone, 1, 4-naphthoquinone, and plumbagin (**Figure 1A**) were sourced from Fisher Scientific and stored  
126 according to supplier guidelines. 100 mM stock solutions were prepared for 1, 4-naphthoquinone and  
127 plumbagin by dissolving the powdered compounds in DMSO and stored at -20 °C. Juglone stock was  
128 prepared fresh before the start of each experiment, given its low stability.<sup>4</sup>

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### 130 **Experimental design**

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132 An experimental design was generated to study the effect of oxidant mixtures at *ad libitum* feeding (2 x  
133 10<sup>10</sup> cells mL<sup>-1</sup>) and no heat stress conditions, using a simplex centroid design (7 points in the experimental  
134 space, **Figure 1B**). The simplex centroid design was chosen as it entails a low number of experimental  
135 points, thus facilitating performing more replicates. This design entailed 40 runs split into 10 groups of 4  
136 runs (where each design point had 5 – 7 replicates). To assign simplex centroid points to groups, we started  
137 from an I-optimal design generated in JMP Pro v 14.2 with 21 points in the experimental space, which  
138 already assigns each point to a group. These I-block points were then approximated to the closest point in  
139 the simplex centroid design, and their assignment to a group from the I-block design was maintained. An  
140 additional control run was tested along with each group to account for differences in populations due to any

141 experimental variability (ambient temperature, humidity, etc.). A population of animals from a single NGM  
142 plate was thus divided into 5 runs (4 for design points, and one as a control).

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144 To study the effects of process conditions on responses induced by chemical mixtures, a split plot mixture  
145 experiment was performed. The whole plot factors were the two environmental stressors and the split plot  
146 factors were the naphthoquinone mixtures. Two levels of heat exposures: 20 °C and sublethal 33 °C were  
147 considered as the first environmental stressor. Two levels of HB101 bacterial diet regime - *ad libitum* ( $2 \times$   
148  $10^{10}$  cells  $\text{mL}^{-1}$ ) (AL) and dietary restriction ( $2 \times 10^9$  cells  $\text{mL}^{-1}$ ) (DR) was considered as the second  
149 environmental stressor.<sup>37,45</sup> A total of 28 populations of animals were used for the split plot mixture  
150 experiments. Each population was split into five runs. One run, at process conditions 20 °C and *ad libitum*  
151 diet named “overall control”, was used to compare the 28 populations (7 points of simplex centroid design  
152 \* 4 process conditions). Another run named “experimental control” was reserved for testing the effect of  
153 individual environmental stressor, i.e., a specific heat level and diet combination with no oxidant. Thus,  
154 each of the four process conditions were replicated 7 times across the 28 populations. The remaining three  
155 runs were exposed to the same combination of diet and heat exposure as the experimental control, but each  
156 was exposed to a different chemical mixture. These were assigned to groups similar to the previous  
157 experiment, using experimental points from a simplex centroid design. Hence, a total of 84 runs (7 points  
158 of the simplex centroid design \* 3 replicates \* 4 process conditions) and 56 control runs were used to study  
159 the effects of heat stress and dietary restriction on the naphthoquinone mixtures. The overall controls were  
160 plotted as Xbar and S control chart to ensure that populations were statistically comparable with each other  
161 (Figure S1).

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### 163 **Application of oxidative stress and fluorescence imaging**

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165 Approximately 30-40 age-synchronized worms were loaded into a well of a 24-well plate containing the  
166 oxidant and HB101 bacteria in S-Medium. Control experiments were conducted with an empty vector of  
167 1% v/v DMSO. Animals were exposed to the oxidants for a period of 8 hours at a temperature of  $20 \pm 1$  °C.  
168 For Pgst-4::GFP imaging, worms were immobilized using a drop of 4 mM tetramisole on dried 2% agarose  
169 pads. Worms were imaged using a wide field inverted fluorescence microscope Leica DMi8 at 10x  
170 magnification after the exposure period. A Spectra X LED illumination system centered at 470 nm was  
171 used for excitation, and a Hamamatsu Orca Flash 4.0 16-bit digital CMOS camera was used for image  
172 acquisition. A dose response to individual compounds was first quantified by exposing animals in  
173 increasing concentrations from 0  $\mu\text{M}$  to 100  $\mu\text{M}$  for a period of 8 hours. The naphthoquinone mixtures were  
174 applied based on the designs described the previous section.

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### 176 **Quantitative image processing**

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178 GFP driven by the *gst-4* promoter is observed throughout the animal, and its intensity was quantified to  
179 estimate oxidative stress response *in vivo*. Images were analyzed using a MATLAB script that generates a  
180 binary mask to identify a single worm per image. The MATLAB regionprops function was then used to  
181 quantify the mean intensity of the animal by overlapping the binary mask over the original image (Figure  
182 1C).

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### 184 **RNAi by feeding**

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186 To measure the influence of *daf-16* on the *gst-4* response to environmental conditions, age-synchronized  
187 worms were grown from the egg stage to day 1 of adulthood at 20 °C in NGM plates containing HB101  
188 bacteria containing the dsRNA-producing vector from the Ahringer library (acquired from Source  
189 Biosciences).<sup>46,47</sup> Animals were then bleached following standard protocols.<sup>43</sup> The eggs obtained were  
190 deposited in new NGM plates containing HB101 bacteria carrying the *daf-16* RNAi vector. Animals were  
191 grown to young adulthood at 20 °C, and then exposed to oxidative stress as previously described.

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## ROS detection

To measure ROS levels, 30 animals, exposed to oxidants as described above, were washed twice in M9, and then stained for 2 hours in 1 mL of M9 containing 150  $\mu\text{M}$  2',7'-dichlorofluorescein diacetate (DCFDA, Sigma) while rotating in the dark. Worms were then washed twice with M9, and transferred to 2% agarose pads on glass slides, covered, and immediately imaged within 30 minutes of washing out the DCFDA.<sup>48,49</sup> Imaging was performed as previously described. Images were analyzed in ImageJ, where average intensity of the head region was scored.

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## Survival assay and lifespan curves

To measure survival of animals to acute oxidative stress, 50 worms, exposed to oxidants as described above, were washed twice in M9, and then transferred to a 24-well plate containing 1 ml M9 with 250  $\mu\text{M}$  juglone. Animals observed as rigid and immobile after imparting movement to the liquid in the well were scored as dead. Animals were scored for survival every 30 minutes for the first 2 hours and every 1 hour thereafter until all animals were scored as dead.<sup>4,45</sup> Lifespan curves and statistical analysis of mean lifespan were performed using the Online Application for Survival Analysis 2 (OASIS 2).<sup>50</sup>

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## Statistical analysis

Data was compiled and analyzed using JMP Pro v.14.2. The standard least squares second order Scheffe model accounting for the individual components, mixture interactions, and effect of the process variables was used.<sup>51</sup> The block effect in the first design and the split plot in the second design were taken to be random effects. All effects, including interactions between the mixtures and process variables, with p value smaller than 0.05 during statistical testing ( $\alpha < 0.05$ ) were considered as significant. Since this approach means dealing with multiple *C. elegans* populations (a population is considered animals cultured on the same NGM plate), we monitored both the mean and variability of gene expression to ensure that population responses are within statistical limits of each other. To assess whether different populations were comparable, we used control limits. A population plotted within the control limits is equivalent to failing to reject the null hypothesis of statistical control (i.e., all populations have equal means), and a population plotted outside the control limits is equivalent to rejecting the null hypothesis. The process mean was monitored using the X bar chart, while process variability was monitored using the S chart.<sup>52</sup> The responses of the controls were plotted using an Xbar (average) and S (standard deviation) control chart (**Figure S1**).

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## Results

### Dose dependency of *gst-4* response

To identify relevant concentrations of chemical mixtures of plumbagin, 1, 4-naphthoquinone, and juglone, (**Figure 1A, B, C**) we first determined the dose-dependent *gst-4* activity to individual components (**Figure 1D**). Animals were exposed for 8 hours, based on prior studies that suggest this time is sufficient to observe a *gst-4* response.<sup>53,54</sup> *gst-4* belongs to a class of enzymes used to catalyze conjugation of glutathione with xenobiotics. Prior work determined that *gst-4* expression is increased in animals stressed with xenobiotics, while external ROS generated by hypoxanthine/XOD system, UV light, and heat did not elicit a response.<sup>40</sup> As expected, we identified that as the naphthoquinones concentration increases, *gst-4* activity also increases and eventually saturates (**Figure 1D**), as described in previous studies.<sup>53,54</sup> To assess the effect of mixture proportions on oxidative stress response, the total naphthoquinone dosage should remain constant. Based on these results, we fixed a combined total dosage of 30  $\mu\text{M}$  for mixture experiments, which allows studying the interactions of components at different proportions without potential saturation of the *gst-4* response.

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241 Sublethal doses in the range of 20-30  $\mu$ M for the 3 compounds under study are known to drive SKN-1-  
242 dependent expression of *gst-4*, and also induce a hormetic effect driven by SKN-1.<sup>4,18,37</sup>

### 243 **Naphthoquinone mixtures show antagonistic effects under *ad libitum* feeding and physiological** 244 **temperature conditions.**

245 The first mixture experiments were performed under *ad libitum* feeding and no heat stress conditions based  
246 on the simplex centroid design. The average and standard deviations of the baseline *gst-4* responses of  
247 controls run for each of the ten sets of experiments were compared to determine if runs were comparable  
248 to each other. All measurements are within statistical control (**Figure S1A**). We used a Scheffe model fit  
249 to develop a response surface (**Figure 2A**). The block effect added in the model indicates that populations  
250 4, 6, and 10 exhibited a significant effect (**Table S1**), suggesting some experimental variation for these  
251 populations. However, these deviations caused by the block effects are accounted for in the model. The  
252 response surface indicates that the individual naphthoquinones induce a higher *gst-4* response than binary  
253 and ternary mixtures, suggesting an antagonistic interaction (**Figure 2A, Table S1**). Since animals were  
254 maintained at 25 °C and shifted to 20 °C for chemical exposure, a control exposure experiment at 25 °C was  
255 tested to determine if the temperature shift could play a role in the observed responses. The control  
256 experiment maintained at 25 °C shows the same *gst-4* expression trend as those exhibited by animals shifted  
257 to 20 °C for exposure (**Figure S2 and Figure 2A**): naphthoquinone mixtures are antagonistic in driving the  
258 *gst-4* response.

### 259 **Naphthoquinone mixtures induce different *gst-4* responses under different environmental conditions**

260 Temperature and dietary intake have been shown to affect the oxidative stress response in *C. elegans*.<sup>33,37,55</sup>  
261 Thus, we tested how exposure to heat stress and dietary restriction modified the *gst-4* response to  
262 naphthoquinone mixtures by fitting the *gst-4* expression data to a mixed effects model. The overall control  
263 was plotted as Xbar and S chart and indicates that the populations are within statistical limits of each other  
264 (**Figure S1B**). Block effects analysis revealed population 5 exhibited a statistically significant effect  
265 compared to the other 27 populations (**Table S2**). However, the model corrects for the effect caused by the  
266 treatment application process on population 5.

267 Heat stress and dietary restriction (DR) significantly affect the oxidative stress response, inducing a lower  
268 baseline *gst-4* response than a control of 20 °C and *ad libitum* conditions (**Figure 2B**). However, heat and  
269 dietary restriction induce differential responses in *gst-4* in the presence of naphthoquinone mixtures (**Figure**  
270 **3A, B**). The *ad libitum* and 20 °C response surface (**Figure 3B**) is the repetition of the first mixture  
271 experiment and was confirmed to not be statistically different (**Figure 2A**). The experimentally acquired  
272 data is represented as conventional bar plots in **Figure S3**. As the temperature is increased to 33 °C, heat  
273 stress inhibits the *gst-4* response to pure components and mixtures, consistent with prior results.<sup>37</sup> Dietary  
274 restriction reduces the baseline *gst-4* level (**Figure 2B**).<sup>56</sup> In contrast, reduced food concentration did not  
275 affect the *gst-4* response to 1,4-naphthoquinone and plumbagin (**Figure 3B**) and it drastically increased the  
276 response to juglone, as compared to *ad libitum* conditions. Furthermore, exposure to binary or ternary  
277 mixtures under dietary restriction did not result in antagonistic interactions observed in mixtures at *ad*  
278 *libitum* dietary regime (**Figure 3B, C**). These results suggest that dietary restriction can differentially  
279 modulate the oxidative stress response to individual compounds, and significantly modify interactions  
280 amongst naphthoquinones.

281 We next asked whether these environmental modifications of the oxidative stress response to  
282 naphthoquinone mixtures could stem from differences in ROS levels, and if the *gst-4* response exhibiting  
283 differential responses to mixtures and environmental variables would imply differences in organismal  
284 resistance to acute oxidative stress. These questions were addressed by measuring ROS levels through  
285 DCFDA staining of N2 animals (**Figure 3D, E**) and by assessing the survival of worms to acute oxidant

286 exposures after exposure to low-level naphthoquinone mixtures (**Figure 3F, S4**). These experiments show  
287 that the presence of ROS in the worms is highest under conditions of dietary restriction at 33 °C, which are  
288 also conditions with the lowest level of *gst-4* (**Figure 3C**). The differences in ROS levels between the  
289 populations exposed to heat stress could be explained by an increase formation of ROS in animals under  
290 glucose restriction,<sup>57</sup> while high levels of glucose renders *C. elegans* more resilient to oxidative stress.<sup>58</sup> In  
291 this case, a parallel can be drawn between glucose and food availability. Animals exposed to acute juglone  
292 concentrations exhibit the lowest survival under heat stress (**Figure 3F**), which matches with the lowest  
293 observed levels of *gst-4* (**Figure 3C**). These results suggest that environmental conditions that modulate  
294 the *gst-4* responses to naphthoquinone mixtures similarly affect the animal's resistance to oxidants, and that  
295 ROS levels are also increased in conditions that result in minimal *gst-4* expression and highest susceptibility  
296 to acute juglone exposures.

297 Since dietary restriction modifies the *gst-4* responses to naphthoquinones (individually and in mixtures),  
298 we then asked whether this effect could be modulated by the insulin/insulin-like signaling (IIS) pathway  
299 that can be activated with specific dietary restriction regimes.<sup>59</sup> To address this question, we tested a  
300 possible dependence of the *gst-4* response on *daf-16*, the main regulator of the IIS pathway (**Figure 3G,**  
301 **S5**).<sup>60,61</sup> Comparing the *gst-4* responses in the presence (**Figure 3C**) and absence (**Figure 3G**) of DAF-16  
302 shows that the DR-dependent induction of *gst-4* under naphthoquinone exposures is independent of DAF-  
303 16, suggesting an alternative pathway is at play. Likely *skn-1* itself regulates this interaction, since it is  
304 known to play a role in DR-induced lifespan extension.<sup>62</sup> We also measured *daf-16* responses to  
305 naphthoquinones mixture exposure by assessing the levels of a DAF-16::GFP fusion protein within  
306 intestinal cell nuclei. Like *gst-4*, *daf-16* responses are inhibited by heat stress (**Figure 3H**). On the other  
307 hand, ternary naphthoquinone mixtures induced strong *daf-16* responses in both DR and AL conditions. As  
308 mentioned above, under AL conditions, *gst-4* exhibits a reduced signal for ternary mixtures (i.e.,  
309 antagonistic interactions), which is not observed in *daf-16* activity. This result suggests naphthoquinone  
310 mixtures induce strong *daf-16* activity, which is inhibited by heat stress, and the *daf-16* response to oxidants  
311 is not modulated by DR, potentially indicating that oxidative stress is prioritized over food intake for  
312 downstream signaling.

## 313 Discussion

314 In this work, we took advantage of a DoE approach to study the oxidative stress response driven by  
315 combinatorial exposures to naphthoquinones under a variety of environmental conditions. Unlike  
316 traditional full-factorial designs, which would entail an unfeasible number of experiments, using block  
317 effects and a simplex centroid design enabled performing experiments in a non-simultaneous and feasible  
318 manner. Initially, using mixed second order Scheffe model statistical analysis, we built response curve to  
319 ternary naphthoquinone mixtures under controlled environmental factors. The observed antagonistic  
320 interactions in **Figure 2A** could stem from different mechanisms of toxicity elicited by the mixture  
321 components. For instance, there are differences in the chemical reactivity of juglone and plumbagin.<sup>63</sup>  
322 Naphthoquinones have been shown to result in toxicity through ROS generation or glutathione  
323 depletion.<sup>16,18</sup> Juglone has relatively higher chemical activity and could undergo Michael's addition to  
324 glutathione even at lower doses.<sup>63,64</sup> 30 µM of 1, 4-naphthoquinone and plumbagin could cause oxidative  
325 stress through redox cycling at lower doses, and only at higher doses cause Michael's addition to  
326 glutathione.<sup>63,65</sup> Mixtures of these chemicals could thus result in lower *gst-4* activation than individual  
327 mixtures, if *gst-4* induction is more sensitive towards one of these toxicity mechanisms.

328 We further analyze if the response to naphthoquinones would be modified under different environmental  
329 conditions: food availability and temperature, and found drastic changes to response curves. The reduction  
330 in *gst-4* expression levels by heat stress observed in **Figure 2B** could be explained by organismal  
331 prioritization of the heat shock response over the oxidative stress response, as previously suggested by  
332 Crombie et al.<sup>37</sup> The reduction in *gst-4* levels by dietary restriction could be the result of the reduced activity

333 of *cct-4* under dietary restriction, which encodes a chaperonin directly involved in SKN-1–dependent  
334 transcription of *gst-4*.<sup>56</sup> We also built response curves to ternary naphthoquinone mixtures under the four  
335 environmental conditions, which revealed significant interactions between chemicals. Surprisingly, these  
336 interactions were drastically modulated by environmental conditions of temperature and food availability.  
337 The identified *gst-4* responses to naphthoquinones is abolished by heat stress, which could be attributed to  
338 prioritization of proteostasis over detoxification, where the HSF-1 driven heat stress response genes are  
339 upregulated to prevent protein misfolding.<sup>37</sup>

340 Dietary restriction also modulated stress response. Under *ad libitum* condition, individual components  
341 drove *gst-4* expression to similar levels, however, dietary restriction-induced oxidative stress response show  
342 high specificity for juglone, suggesting differences in organismal processing of similar oxidants. Although  
343 there is cross-regulation between the diet regulated DAF-16 and oxidative stress regulated SKN-1  
344 pathways,<sup>66,67</sup> RNAi experiments revealed that *gst-4* responses to mixtures are *daf-16*-independent.  
345 However, SKN-1 is also known to modulate DR-induced modulation of longevity,<sup>62</sup> and is thus likely  
346 integrating signals for DR and oxidative stress and driving the observed interactions. Interestingly, *daf-16*  
347 is activated by naphthoquinone mixtures in the absence of heat stress, recapitulating the *gst-4* inhibition by  
348 heat stress. In contrast, DR did not elicit higher *daf-16* activation than AL conditions, suggesting organismal  
349 responses to oxidants are prioritized over reduced caloric intake. It is still unclear why the DR effects are  
350 specific to the oxidant type. Potentially, these differences could stem from differences in toxicity and  
351 detection mechanisms through chemosensation, as explained before, coupled with multiple transcriptional  
352 pathways interacting at the organismal level.

353 These findings highlight the importance of experimental analysis in realistic settings, where a variety of  
354 chemical components is present, and where environmental conditions vary significantly. In addition, the  
355 identified interactions between naphthoquinone mixtures, heat stress, and dietary restriction, shed light on  
356 organismal integration and processing of stressors and environmental factors. This could stem from  
357 differences in oxidant detection in *C. elegans*. For instance, low levels of H<sub>2</sub>O<sub>2</sub> activate the I2 neuron, while  
358 paraquat only elicits a response at a very high concentration.<sup>68</sup> The difference in the *gst-4* response to  
359 individual compounds and mixtures could stem from the combined effects of differences in xenobiotic  
360 detection and the mechanisms of toxicity by the different naphthoquinones. This result indicates that  
361 individual components do not act through a singular mechanism, and that mixtures can drive significantly  
362 different organismal responses than individual components, even for highly similar chemical species. A  
363 detailed investigation on neuronal SKN-1 could help elucidate whether the interaction mechanisms between  
364 chemical mixtures and environments involve neuronal detection.

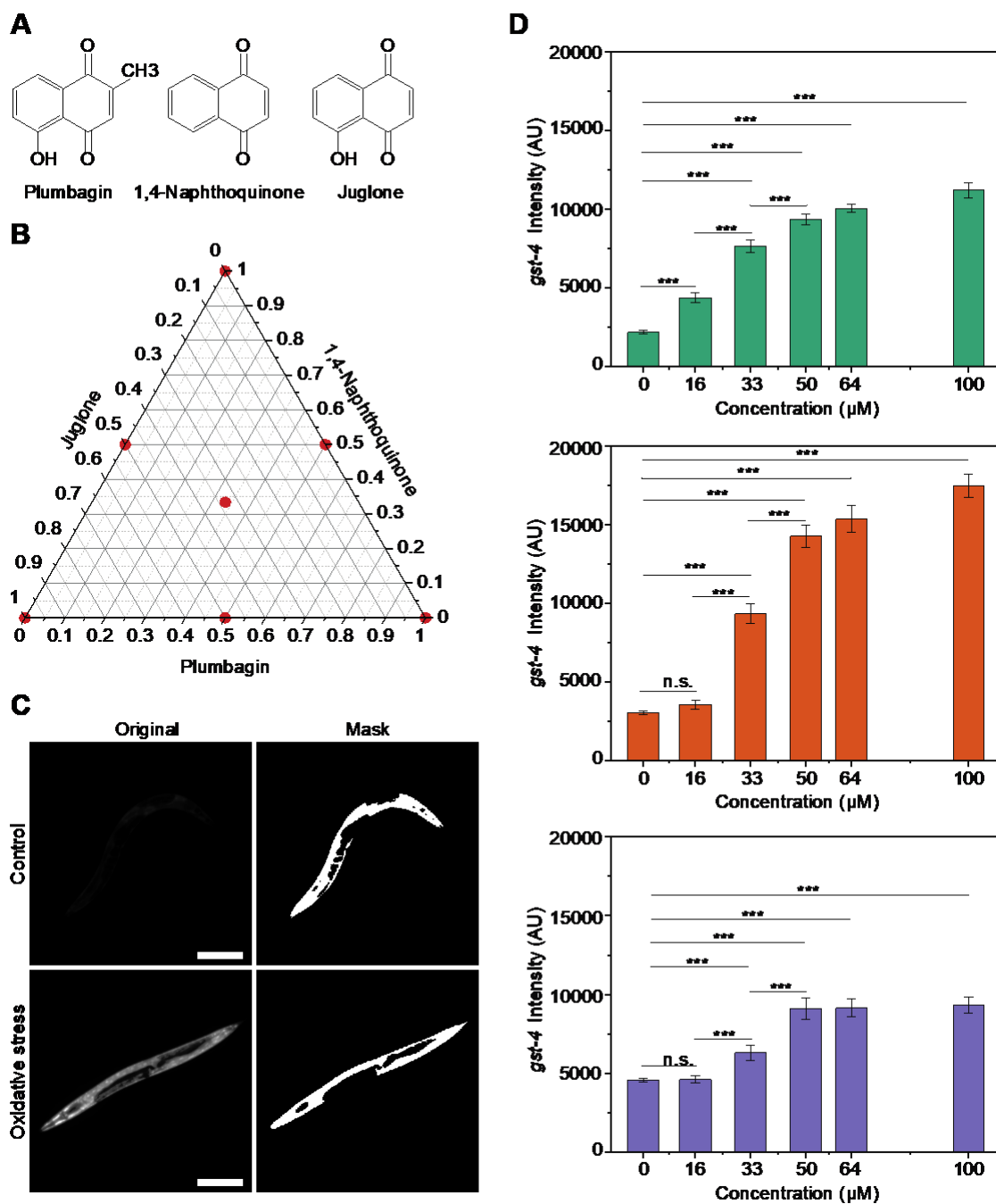
365 *C. elegans* are complex in nature and many factors could affect the response to oxidative stress, such as  
366 variation in developmental period, food availability on plate, temperature, as well as biological  
367 stochasticity. It is necessary to control and account for such effects as combinatorial mixture experiments  
368 cannot be performed using a single population. Control charts have proven to be useful in identifying  
369 potential problematic populations, which might show a different response. Such populations can have  
370 different biological activity and can affect the results of the experiments being performed. Adding block  
371 factors and split plots as random effects to the model also help us compare between populations, even if  
372 these exhibit differences that could come from experimental or biological variation. Thus, using a  
373 combination of mixture experiments and control charts we have highlighted the differential *gst-4* response  
374 by *C. elegans* to oxidative stressor mixtures under different environmental conditions. These results warrant  
375 further investigation of the different transcriptional pathways involved and shed light on how organisms  
376 respond to variable environments and realistic chemical exposures.

377

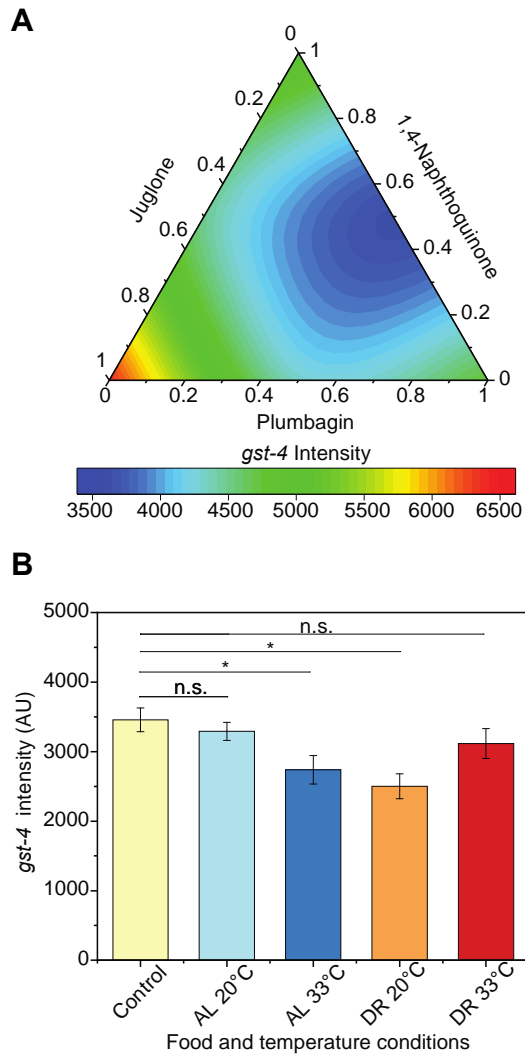
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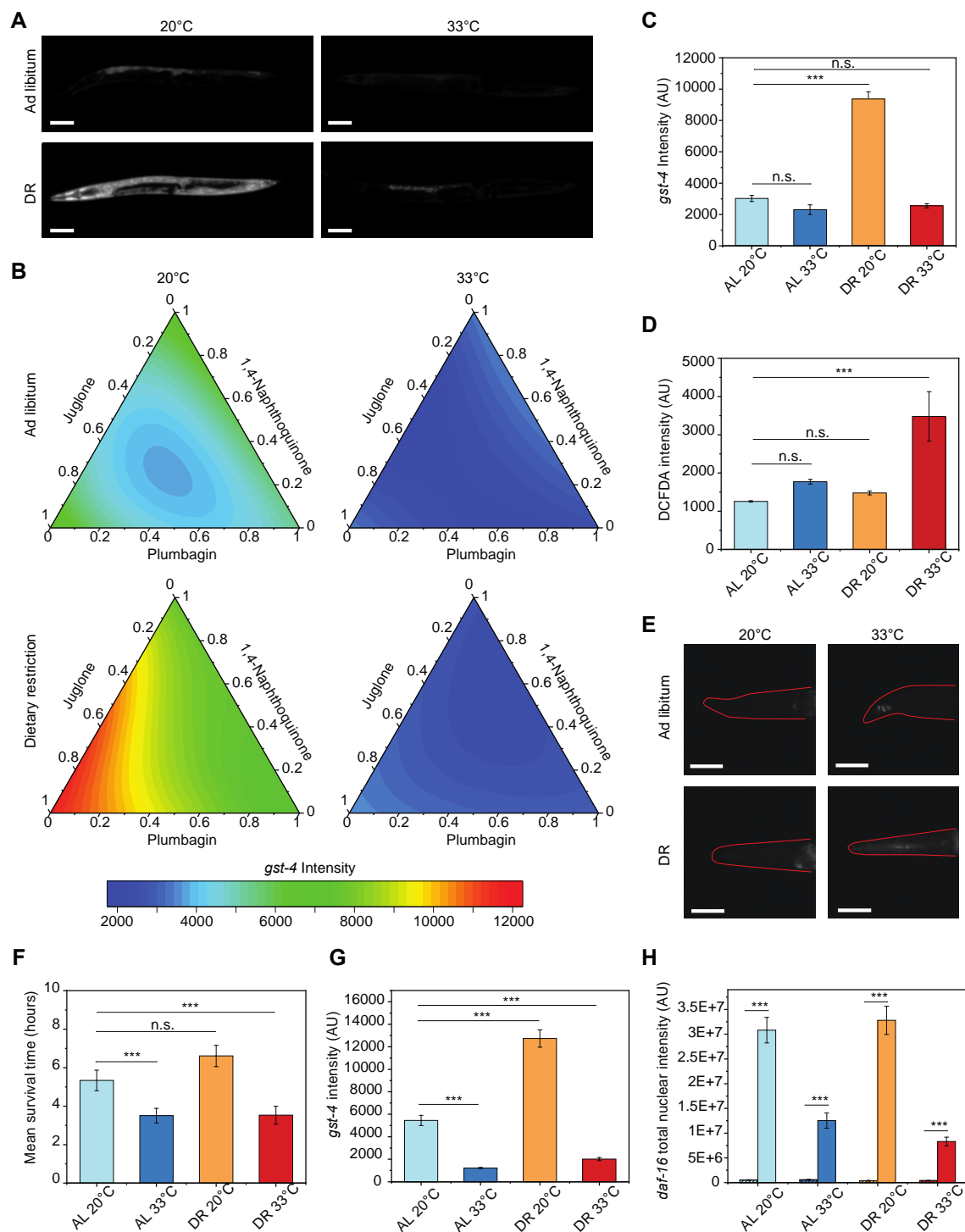
379 **Figures**



380  
 381 **Figure 1: *gst-4* response is dose dependent.** A) Compounds used for oxidative assays. B) Simplex centroid  
 382 design. C) CL2166 worms under control and oxidative stress with corresponding masks for extracting *gst-4*  
 383 expression levels. D) *gst-4* dose-dependent response to Plumbagin, 1, 4-Naphthoquinone, and Juglone  
 384 (top to bottom).  $p > 0.05$  (n.s.),  $p < 0.001$  (\*\*\*). Error bars are SEM. All p-values were calculated using  
 385 Tukey HSD for all pairwise comparisons after one-way ANOVA (Unequal Variances) comparison in JMP  
 386 14.2. Scale bars are 200 µm.



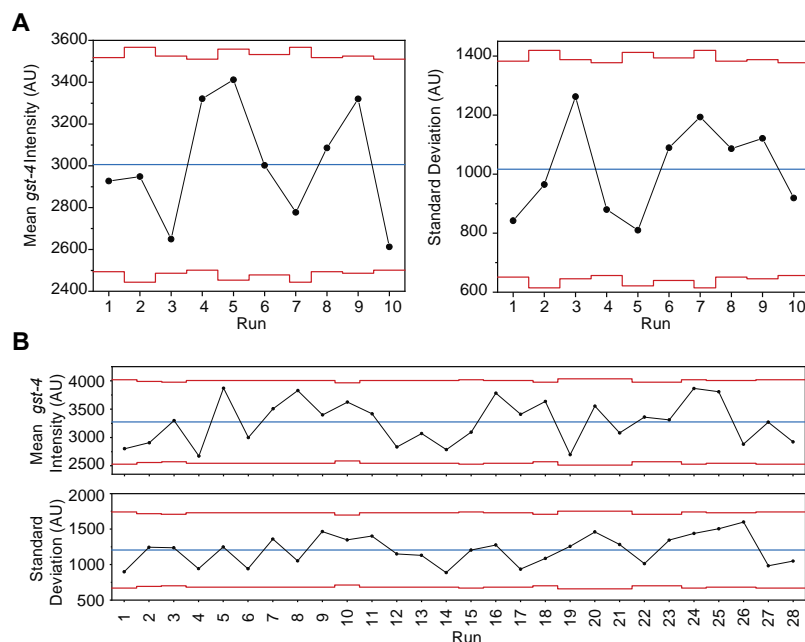
387  
388 **Figure 2: Naphthoquinone mixtures show no synergistic effects under *ad libitum* feeding and no heat**  
389 **stress conditions.** A) Response surface of *gst-4* expression levels in CL2166 animals under oxidative stress,  
390 20°C, and *ad libitum* feeding. Response surface modeled using standard least squares second order Scheffe  
391 model where main effects and interactions were tested for significance (Table S1). B) Testing for main  
392 effect of temperature and food concentration.  $p > 0.05$  (n.s.),  $p < 0.05$  (\*). p-values were calculated using  
393 Dunnett's test with *ad libitum*, overall control as control after two-way ANOVA comparison in JMP 14.2.  
394 Error bars are SEM. A control at 25 °C is represented as a bar plot in Figure S2.



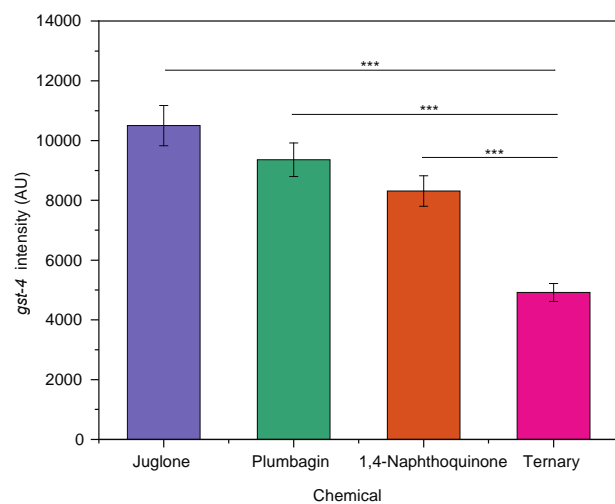
395 **Figure 3: Naphthoquinone mixtures elicit differential response under simultaneous stress exposure.**  
 396

397 A) Representative CL2166 animals exposed to ternary naphthoquinone mixtures (1,4-Naphthoquinone,  
 398 Juglone, Plumbagin) at different environmental conditions. B) Response surface of *gst-4* expression levels  
 399 for CL2166 animals under oxidative stress at different environmental conditions. C) *gst-4* expression levels  
 400 for CL2166 animals under exposure to the ternary naphthoquinone mixture. D) DCFDA intensity levels for  
 401 N2 animals exposed to the ternary naphthoquinone mixture. E) DCFDA staining of representative N2  
 402 animals exposed to the ternary naphthoquinone mixture. F) Average survival time under exposure to 250

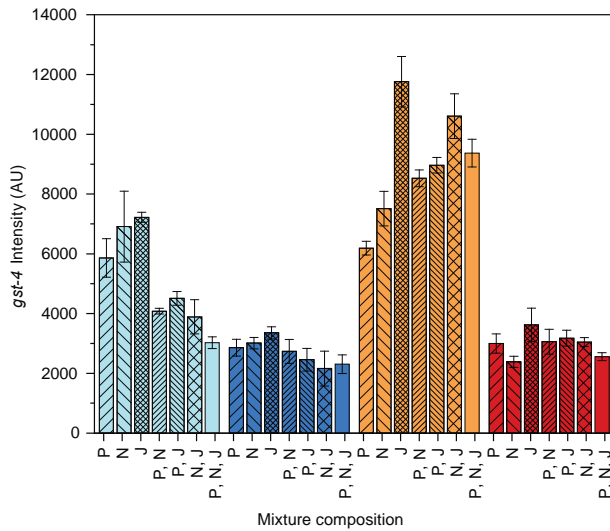
403  $\mu$ M Juglone in CL2166 animals pre-exposed to the ternary naphthoquinone mixture at different  
404 environmental conditions. G) *gst-4* expression levels under *daf-16* RNAi for CL2166 animals exposed to  
405 ternary naphthoquinone mixtures. H) *daf-16* expression levels for MAH97 animals exposed to ternary  
406 naphthoquinone mixtures, measured as total intensity in the nuclei of cells per worm. AL: *ad libitum*. DR:  
407 dietary restriction.  $p > 0.05$  (n.s.),  $p < 0.05$  (\*),  $p < 0.001$  (\*\*\*). p-values were calculated using Dunnett's  
408 test with *ad libitum*, 20 °C as control after one-way ANOVA comparison in JMP 14.2. Response surfaces  
409 modeled using standard least squares second order Scheffe model where main effects and interactions were  
410 tested for significance (Table S2). Scale bars are 100  $\mu$ m. Error bars are SEM. The experimentally acquired  
411 data is represented as conventional bar plots in Figure S5.  
412



413  
 414 **Figure S1: Xbar and S-charts for populations tested.** A) Xbar and S-chart for 10 populations used for  
 415 oxidative stress assays. B) Xbar and S-chart for 28 populations used for oxidative stress assays.  
 416



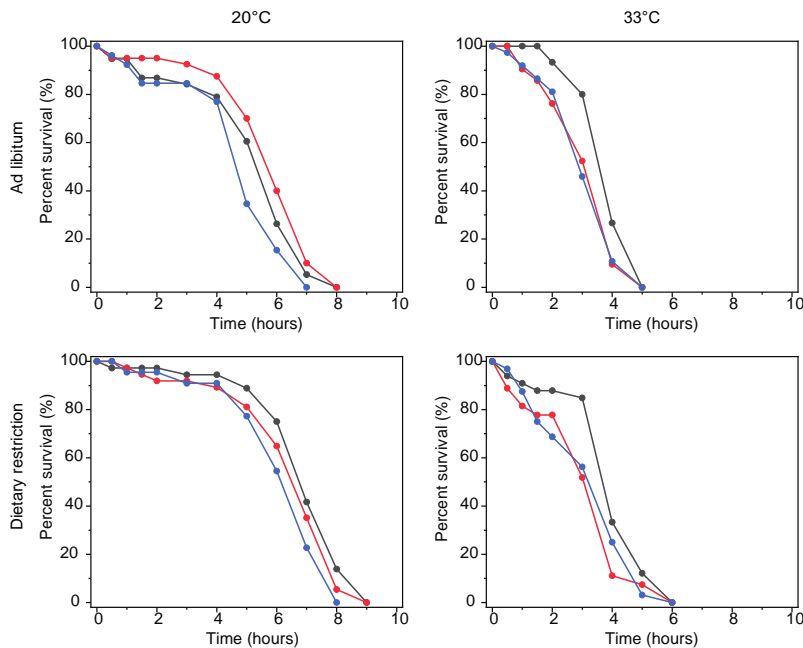
417  
 418 **Figure S2: *gst-4* response at 25 °C.** *gst-4* response to Plumbagin, 1, 4-Naphthoquinone, Juglone, and  
 419 ternary mixture at 25 °C.  $p < 0.001$  (\*\*\*). Values follow the same trend as Figure 2B with a lower value for  
 420 the ternary mixture (middle point of response surface in Figure 2B), and higher values for individual  
 421 naphthoquinones (vertex points of response surface in 2B). Error bars are SEM.



422

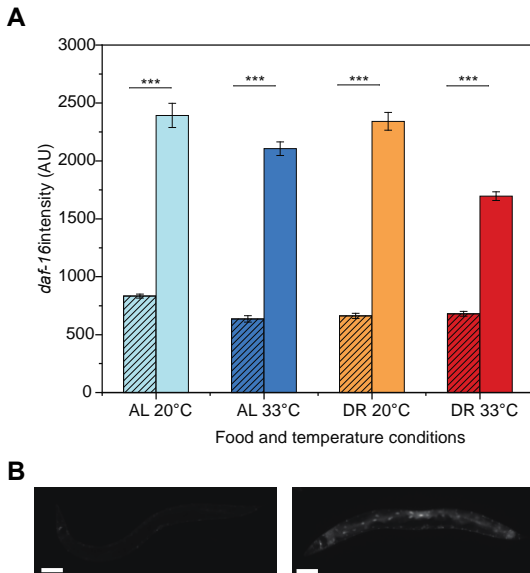
423 **Figure S3: Bar plot representation of experimentally acquired *gst-4* expression level.** *gst-4* expression  
424 levels of animals exposed to naphthoquinone mixtures at different process conditions. From left to right,  
425 AL 20°C (light blue), AL 33°C (blue), DR 20°C (orange), DR 33°C (red). P-Plumbagin, N-1,4-  
426 Naphthoquinone, J-Juglone. Error bars are SEM.

427



428

429 **Figure S4: Lifespan curves for juglone survival assay.** Lifespan curves built with OASIS 2 for CL2166  
430 animals under ternary mixture at different environmental conditions. Each condition was tested three times.



431  
432 **Figure S5: *daf-16* response to ternary naphthoquinone mixture.** A) *daf-16* response to ternary mixture  
433 at different environmental conditions. Striated bars represent MAH97 animals under *daf-16* RNAi, clear  
434 bars are control animals. B) Representative MAH97 animals under *daf-16* RNAi (left) and control (right).  
435  $p < 0.001$  (\*\*\*). Scale bars are 100  $\mu\text{m}$ . Error bars are SEM.

436

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440

#### 441 **Data availability**

442 All data underlying this work can be requested from the authors.

443

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447

#### 448 **Conflict of Interest Statement**

449 The authors declare no conflict of interest.

450

#### 451 **Author contributions**

452 All authors designed the experiments and conceived the work. KSA and JH carried out experiments and  
453 analyzed data. JWS and KSA performed design of experiments and statistical analysis. KSA, JH, and ASM  
454 wrote the manuscript.

455

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457

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