Title: Water quality thresholds for coastal contaminant impacts on corals: A systematic review and meta-analysis

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1 **ABSTRACT**

2 Reduced water quality degrades coral reefs, resulting in compromised ecosystem function and 3 services to coastal communities. Increasing management capacity on reefs requires prioritization 4 of the development of data-based water-quality thresholds and tipping points. To meet this 5 urgent need of marine resource managers, we conducted a systematic review and meta-analysis 6 that quantified the effects on scleractinian corals of chemical pollutants from land-based and 7 atmospheric sources. We compiled a global dataset addressing the effects of these pollutants on 8 coral growth, mortality, reproduction, physiology, and behavior. The resulting quantitative 9 review of 55 articles includes information about industrial sources, modes of action, 10 experimentally tested concentrations, and previously identified tolerance thresholds of corals to 11 13 metals, 18 pesticides, 5 polycyclic aromatic hydrocarbons (PAHs), a polychlorinated biphenyl 12 (PCB), and a pharmaceutical. For data-rich contaminants, we make more robust threshold 13 estimates by adapting models for Bayesian hierarchical meta-analysis that were originally 14 developed for biopharmaceutical application. These models use information from multiple 15 studies to characterize the dose-response relationships (i.e., E_{max} curves) between a pollutant's 16 concentration and various measures of coral health. Metals used in antifouling paints, especially 17 copper, have received a great deal of attention to-date, thus enabling us to estimate the 18 cumulative impact of copper across coral's early life-history. The effects of other land-based 19 pollutants on corals are comparatively understudied, which precludes more quantitative analysis. 20 We discuss opportunities to improve future research so that it can be better integrated into 21 quantitative assessments of the effects of more pollutant types on sublethal coral stress-22 responses. We also recommend that managers use this information to establish more 23 conservative water quality thresholds that account for the synergistic effects of multiple

24 pollutants on coral reefs. Ultimately, active remediation of local stressors will improve the 25 resistance, resilience, and recovery of individual reefs and reef ecosystems facing the global 26 threat of climate change.

27

28 **KEY WORDS**

29 Pollutant, management, coral reef, Scleractinia, dose-response, Bayesian model, data synthesis 30

31 **1. INTRODUCTION**

32 Coral reefs are some of the most diverse and productive ecosystems on the planet (Reaka-33 Kudla, 1997). They provide coastal protection, tourism, and ecological benefits for communities 34 in over 100 countries globally, but despite their importance, coral reefs are threatened by the 35 compound effects of anthropogenic disturbances on global and local scales (Bishop et al., 2011; 36 Bryant et al., 1998; Spalding et al., 2001). Over 60% of coral reefs are threatened by local 37 stressors, which can include pollutants from terrestrial runoff (e.g., sedimentation, increased 38 nutrients, pathogens, and toxins) and overfishing (Burke et al., 2011; Richmond and Wolanski, 39 2011). The impacts of local stressors can be exacerbated by global stressors such as ocean 40 warming and acidification (Hughes et al., 2010). Though mitigating global stressors remains a 41 priority for resource managers nationally and internationally, coral-reef managers often seek to 42 control local stressors to increase reef resilience and recovery. Runoff and groundwater 43 collectively transport nutrients, sediment, and pollutants onto reefs (Fabricius, 2005; Silbiger et 44 al., 2020; Tuttle and Donahue, 2020; Zhao et al., 2021), but the impacts of pollutant transport 45 have received less attention and are consequently less understood (van Dam et al., 2011). As 46 such, we present a systematic, quantitative review and meta-analysis that addresses this

47 knowledge gap and focuses on studies that have examined the physiological responses of 48 scleractinian corals following direct exposure to chemical toxicants.

49 Coral reefs near the shoreline are more vulnerable to land-based runoff and submarine 50 groundwater discharge, and they degrade faster than reefs farther offshore (Rodgers et al., 2015; 51 Silbiger et al., 2020; Wenger et al., 2016). The persistence and dispersion of pollutants depend 52 on their chemical composition and environmental conditions, such as water residence time and 53 flushing rate, so corals downstream of watersheds in high retention bays are also more likely to 54 be impacted by runoff from land-based activities (Wolanski et al., 2009). This gradient of 55 decreasing water quality closer to land can lead to lasting changes at reefs closer to the shoreline, 56 such as reduced coral genetic diversity (Tisthammer et al., 2020). Anthropogenic pollutants, such 57 as pesticides, metals, pharmaceuticals, and sewage, can enter reef ecosystems through point 58 sources (e.g., sewage outfall) or nonpoint sources. In many places, onsite waste disposal, leaking 59 septic tanks, and other improper sewage disposal techniques also pose a risk to coastal reefs 60 (Abaya et al., 2018). In areas with harbors, the surrounding reef may be additionally exposed to 61 pollutants associated with boats, such as anti-fouling paints and polycyclic aromatic 62 hydrocarbons (PAHs) (Sheikh et al., 2009).

63 In addition, pollutants of concern in developed industrial or residential areas and 64 agricultural chemicals can enter marine ecosystems. Highly soluble contaminants have the 65 potential to be carried far offshore, and some pollutants may also be transported through the 66 atmosphere and redeposited, impacting areas far from the site of application (Nash and Hill, 67 1990). Because many of these compounds, especially herbicides, are designed to inhibit 68 photosynthesis in plants, they can negatively impact the photosynthetic capacity of the algal 69 symbionts in corals that provide up to 90% of coral energy (Muscatine, 1990). Glyphosate,

70 atrazine, diuron, and other active ingredients in herbicides and insecticides have been found in 71 water, sediment, and biological samples from streams that drain to the ocean in Hawaiʻi and in 72 the coastal coral reef ecosystems of the Great Barrier Reef, Hong Kong, and French Polynesia, 73 indicating the widespread presence of these pesticides and their degradates in coral reef 74 ecosystems (Roche et al., 2011; Shaw et al., 2008; Shaw et al., 2010; Hawaiʻi State Dept. of 75 Health & Ag., 2014; Spengler et al., 2019).

76 Sediment and freshwater directly and indirectly impact corals and other reef organisms 77 while transporting chemical pollutants, which also affect corals (Table 1) (Tuttle and Donahue, 78 2020; Rodgers et al., 2018). Biological processes of early life stages of corals, including gamete 79 fertilization, larval settlement, and recruit survival, are chemically mediated and therefore often 80 more sensitive to xenobiotics, or chemicals that are not naturally found within the organism 81 (Richmond et al., 1998; Richmond et al., 2018). Certain pollutants are also known to impact 82 early life stages and processes more than others. For example, copper can reduce fertilization 83 success at lower concentrations than zinc or cadmium and is likely more toxic than these other 84 metals at early life stages (Reichelt-Brushett and Harrison, 1999).

85 Exposure to toxicants can also impact corals at later life stages, causing them to expel 86 their algal symbionts, which are necessary for autotrophic feeding, and in some cases, the corals 87 may also produce increased amounts of mucus, which can affect their ability to feed 88 heterotrophically (Markey et al., 2007; Renegar et al., 2017). While hormone function in corals 89 is still unclear, previous research has shown that corals contain many of the same steroidal 90 hormones involved in reproduction as in other species such as estradiol, estrone, and testosterone 91 (Tarrant et al., 2003). Herbicides that are designed to inhibit photosynthesis, such as atrazine and 92 diuron (Table 1), will impact adult corals that rely on photosynthetic symbionts differently than

93 earlier life stages that do not yet have symbionts. However, pesticides including atrazine and 94 diuron have also been shown to be endocrine disruptors, which can have lasting impacts on 95 organisms and their reproductive capacity (Boscolo et al., 2018; Hayes et al., 2003). Corals also 96 show stress at the molecular level after exposure to chemicals. For example, *Pocillopora* 97 *damicornis* exposed to insecticides and microplastics increased expression of detoxification 98 enzymes and antioxidant enzymes, respectively (Tang et al., 2018; Wecker et al., 2018).

99 With this systematic, quantitative review and meta-analysis, we aimed to determine (1) 100 the scope of existing research on the effects of chemical pollutants on scleractinian corals, (2) the 101 concentrations at which marine pollutants elicit adverse physiological responses in corals, (3) the 102 relative impact of different pollutants on coral health, and (4) the areas in need of additional 103 study. Herein, we systematically review the effects on scleractinian corals of a comprehensive 104 list of marine pollutants grouped into five categories: metals, pesticides (herbicide, insecticide, 105 fungicide), polycyclic aromatic hydrocarbons (PAHs), polychlorinated biphenyls (PCBs), and 106 other. This quantitative review and meta-analysis offers a detailed analytical assessment of 107 stressor thresholds, when possible, and provides insight into the gaps that remain. We conclude 108 with recommendations for future studies to address the current knowledge gaps, including 109 critical data gaps in characterizing stressor-response relationships. This information is essential 110 to managers as they aim to develop guidelines and policies to mitigate the impacts of pollutants 111 on coral reef ecosystems.

112

113 **2. METHODS**

114 **2.1 Systematic Literature Review**

115 *Article Searches:* The systematic review began with previously published reviews on the 116 effects of various pollutants on stony corals (Johnson and Roberts, 2009; Kroon et al., 2014; 117 Mayer-Pinto et al., 2020; Pastorok and Bilyard, 1985; Richmond et al., 2018; van Dam et al., 118 2011), which were used to develop a list of benchmark studies to be included. The aim of the 119 following literature search was to collect and synthesize all available evidence on the effects of 120 select pollutant classes on hard corals. The search included peer-reviewed, public, and/or 'grey' 121 literature to quantify pollutant-related stress responses in all life stages of all shallow (photic 122 zone, ≤ 80 m depth), scleractinian corals in all warm-water ocean basins (20°–30°C). 123 The search engines and databases described and justified in Tuttle et al. (2020) were used 124 in this study and can be found in the Supplementary Materials (Table S1). An exhaustive list of 125 potential pollutants and additional characteristic terms was compiled through reference to 126 existing reviews and consultation with experts. Search terms were refined by recording the 127 number and accuracy of results produced in Web of Science searches of the format ([search 128 term]* AND coral), where "*" is a wildcard and "AND" is a Boolean operator. Terms that 129 resulted in double counting of results such as pesticid* and *icid* were refined to only include 130 the term which produced the most results and was, therefore, more comprehensive. Focused 131 searches were included for the following genera due to their listing as endangered or threatened 132 under the U.S. Endangered Species Act (ESA): *Acropora, Anacropora, Cantharellus,* 133 *Dendrogyra, Euphyllia, Isopora, Montastraea, Montipora, Mycetophyllia, Orbicella, Pavona,* 134 *Porites, Seriatopora, Siderastrea,* and *Tubastraea*. The genera list was expanded to include those 135 genera of particular importance to the Pacific Island Region: *Alveopora, Astreopora, Favia,* 136 *Favites, Goniastrea, Goniopora, Leptastrea, Leptoria, Lobophyllia, Millepora, Platygyra,* 137 *Pocillopora,* and *Turbinaria.* A full list of search terms can be found in Text S1. Possible

138 limitations of this search include regional or language biases and the exclusion of some journals 139 or conference proceedings from sampled database archives.

140 *Article Screening and Eligibility Criteria:* The search results were evaluated according 141 to the methods and procedures described previously (Tuttle et al., 2020). After searches were 142 completed, the resulting Bibtex and RIS files were imported to Mendeley, an open-source 143 reference manager (Mendeley, 2020). Duplicate files were combined via Mendeley's duplicate 144 merger tool. The unique citations (n = 9,332) were then imported into Abstrackr, a free web-145 based application for screening and organizing literature search results (Abstrackr, 2020), and 146 abstracts were independently screened by at least two reviewers, with each classifying the titles 147 as 'relevant' (n = 315), 'not-relevant' (n = 8,885), or 'maybe-relevant' (n = 132) to the research 148 questions. Discrepancies in the classifications were addressed and resolved by a third reviewer. 149 The full texts for all 'relevant' sources were collected and screened by independent 150 reviewers for each of the pollutant categories based upon the eligibility criteria from the PECO 151 (Population, Exposure, Comparison, Outcome) framework (Morgan et al., 2018), which are 152 described in the Supplementary Materials (Text S2). All sources that passed the full-text 153 screening (n = 140) were appraised for internal and external validity following the detailed 154 criteria within Tuttle et al. (2020). Articles that did not include coral responses that could be

155 compared across studies were omitted at this step, leaving 127 studies that were considered for

156 the quantitative review and meta-analysis. Studies focusing on oil and oil dispersants were

157 excluded because several recent reviews and meta-analyses provide a thorough summary of the

158 effects of oil and dispersants on corals and other marine organisms (Bejarano, 2018; Bejarano et

159 al., 2016; NAS, 2020; Turner and Renegar, 2017). Microplastics were also excluded as a

160 pollutant from this quantitative review because the described response to microplastics was

161 typically related to a reduced capacity for heterotrophic feeding rather than an adverse 162 physiological response to the stressor. A recent review (Huang et al., 2021) describes the impacts 163 of microplastics on corals and notes that associations between microplastics and other toxins 164 may increase the susceptibility of corals to disease, which is a response with physiological 165 complexity that is beyond the scope of this study.

166 **Data Extraction:** Each article remaining in the "relevant" category that passed the study 167 validity assessment ($n = 55$) had data extracted by a single reviewer. A complete list of studies 168 can be found in the Supplementary Materials (Text S3). All methodology-related information on 169 the study species, location and collection site, pollutant and concentration levels, and additional 170 factors were recorded for each article (Table S2). Coral response data found in article figures 171 (most commonly as treatment means +/- error) were extracted using tools such as Web Plot 172 Digitizer (Rohatgi, 2020). When possible, reported no- and lowest-observed adverse effect levels 173 (NOAEL, LOAEL) and half maximal effective concentrations (EC_{50}) were also extracted from 174 the papers (Table S3). Many pollutant-response combinations did not have sufficient replication 175 to be included in the meta-analysis (at least 3 independent, comparable articles), so they were 176 assessed in the quantitative review only. We define an 'article' as a unique publication, and an 177 'experiment' as a unique set of related treatments, including both control and exposure 178 conditions. Thus, an article could contain the results of multiple experiments.

179 In the extraction of data for meta-analysis of the effects of pollutants on photosynthetic 180 efficiency, we focused on maximum quantum yield (MQY) instead of effective quantum yield 181 (EQY). MQY is represented by F_v (= F_m - F_0) / F_m , where F_m is maximal fluorescence and F_0 is 182 background fluorescence (Osinga et al., 2012). MQY is measured after the coral has been dark-183 adapted, meaning a complete relaxation of photochemical quenching activity (Osinga et al.,

184 2012). EQY is measured under steady but illuminated conditions and can therefore be more 185 variable (Enríquez and Borowitzka, 2010). Measurements can be affected by variable light 186 intensity, driven in some cases by shading, which can be very important in measurements from 187 corals where light is scattered throughout the skeletal matrix (Enríquez et al., 2017; Enríquez and 188 Borowitzka, 2010). MQY was thus considered a more stable measurement of photosynthetic 189 efficiency in response to stressors than EQY.

190

191 **2.2 Meta-analysis**

192 For each stressor-coral response combination that met the standards for inclusion in the 193 meta-analysis, we fit a dose-response curve using a Bayesian, inhibitory log-logistic (E_{max}) 194 model, adapted from models used in biopharmaceutical research (Thomas et al., 2014; Wu et al., 195 2018), with a Gaussian distribution using *brms*, v2.14.0 (Bürkner, 2017; Bürkner, 2018) and 196 *rstan*, v2.21.2 (Stan Development Team, 2020) packages within the *R* statistical software, v4.0.1 197 (R Core Team, 2020). Data were fit to a four-parameter model (Equation 1), with parameters E_0 , 198 E_{max}, EC₅₀ and the Hill coefficient (λ , curve steepness):

Equation 1. 199 Equation 1. (Response Level | Standard Error) ~ $E_0 \times (1 - \frac{E_{max} \times {Concentration}^{\lambda}}{EC_{50}^{\lambda} + {Concentration}^{\lambda}})$

200 Response level was conditioned on standard error because each datapoint represented the 201 mean (+/- standard error) response of an experimental control/treatment group at a corresponding 202 pollutant concentration. Within the hierarchical Bayesian model framework, we allowed random 203 intercepts for the four parameters and compared model fits (using Bayesian \mathbb{R}^2 and posterior 204 distributions) with parameter slopes allowed to vary by experiment or experiment nested within 205 article. The Bayesian priors for the four parameters were normally distributed, with E_{max} 206 constrained between 0 and 1 and the Hill coefficient constrained as non-negative. The model

207 specifications – including hierarchical structure, prior distributions, iterations, and convergence 208 criteria – are described in Table S4.

209 To test specifically for the effect of Diuron exposure duration on adult corals, we 210 conducted a multiple linear regression in the *R* statistical software, v4.0.1 for which we regressed 211 MOY by duration (in days, log_{10} -transformed; continuous variable) and concentration at three 212 levels: 0, 1, and 10 μ g L⁻¹ (categorical variable). We used analysis of variance to choose the best-213 fit of three models: (1) equal slopes and intercepts (simple linear regression), (2) equal slopes 214 and different intercepts, and (3) different slopes and intercepts. We visually inspected residuals 215 of the best-fit model (2) to check that it met assumptions.

216

217 **2.3 Quantitative Review**

218 Stressor-response combinations that did not have sufficient data for meta-analysis 219 were assessed in a quantitative review. For each stressor-coral response combination, we report 220 the range of pollutant concentrations examined across all studies, the no- and lowest- observed 221 adverse effect levels (NOAEL and LOAEL), and corresponding references were compiled and 222 synthesized by coral life history stage. Further, we aggregated the most conservative thresholds 223 reported for each stressor-response combination to inform management strategies in data limited 224 scenarios.

225

226 **3. RESULTS**

227 **3.1 Meta-analysis**

228 Copper, nickel, and diuron were the only pollutants matched with coral responses that 229 had sufficiently comparable data for inclusion in the meta-analysis. For copper, we examined

230 four separate coral responses: gamete fertilization success ($n = 9$ articles with 17 experiments 231 therein), larval settlement (n = 3 articles with 4 experiments therein), larval survival (n = 3 232 articles with 6 experiments therein), and adult photosynthetic efficiency ($n = 4$ articles with 11 233 experiments therein) (Table 2). Diuron had enough articles (n = 5 with 25 experiments therein) to 234 assess its effect on adult photosynthetic efficiency. While there were at least three independent, 235 comparable articles that examined the effects of nickel on fertilization success and copper on 236 chlorophyll concentration, these stressor-response combinations did not exhibit a dose-response 237 relationship that could be accurately modeled with an inhibitory log-logistic (E_{max}) model. 238 *Coral gametes*: Coral gametes are particularly vulnerable to copper exposure, with the 239 rate of fertilization inhibited by 5% at 22.6 μ g L⁻¹ and by 50% at 48.6 μ g L⁻¹ (Table 2; Fig. 1A). 240 Thresholds were estimated from inhibition curves for 9 articles that tested the effects of copper 241 concentrations across 5 orders of magnitude (Fig. 1A) on corals from 12 species within 5 genera: 242 *Acropora*, *Coelastrea*, *Goniastrea*, *Montipora*, and *Platygyra*. Coral gametes were less 243 susceptible to exposure to other metals. We conducted a joint meta-analysis for the 10 metals for 244 which there was an apparent log-linear decline in fertilization rate with increasing metal molar 245 concentration (in μ mol L⁻¹). Relative susceptibility to these metals, ranked from most to least 246 susceptible in terms of estimated EC_{50} values, is as follows: copper, tin, zinc, lead, vanadium, 247 gallium, nickel, aluminum, cadmium, and iron (Fig. 2). The posterior distributions of EC_{50} 248 values are wide (Fig. 2B) indicating the relative paucity of data available to estimate the dose-249 response curves for most metals, with the notable exception of copper. 250 *Coral larvae*: Coral larvae were also relatively vulnerable to copper exposure. Settlement 251 (i.e., metamorphosis) rates were inhibited by 5% at 27.7 μ g L⁻¹ and by 50% at 44.8 μ g L⁻¹ copper

252 (Table 2; Fig. 1C). Thresholds were estimated from inhibition curves for 3 articles that tested the

253 effects of copper concentrations across 5 orders of magnitude (Fig. 1C) on corals from 2 species: 254 *Acropora millepora* and *Acropora tenuis*. Survival rates of pre-settlement coral larvae were 255 inhibited by 5% at 44.7 μ g L⁻¹ and by 50% at 101.0 μ g L⁻¹ copper (Table 2; Fig. 1B). These 256 thresholds were estimated from inhibition curves for 3 articles that tested the effects of copper 257 concentrations across 3 orders of magnitude (Fig. 1B) on corals from 2 species: *Coelastrea* 258 *aspera* and *Platygyra acuta*.

259 *Coral adults*: The only response of coral adults that was adequately comparable for meta-260 analysis across studies was photosynthetic efficiency measured as maximum quantum yield 261 (MOY, F_v / F_m). Adult coral photosynthetic efficiency was relatively insensitive to copper 262 exposure, with MQY inhibited by 5% at 285.5 µg L^{-1} and by 50% at 365.3 µg L^{-1} (Table 2; Fig. 263 1D). Thresholds were estimated from inhibition curves for 4 articles that tested the effects of 264 copper concentrations across 3 orders of magnitude on corals from 2 species: *Mussismilia harttii* 265 and *Pocillopora damicornis*.

266 Adult coral photosynthetic efficiency was much more sensitive to diuron exposure as 267 compared to copper exposure, with MOY inhibited by 5% at just 2.5 μ g L⁻¹ and by 50% at 43.7 268 μ g L⁻¹ (Table 2; Fig. 3A). Thresholds were estimated from inhibition curves for 5 articles that 269 tested the effects of diuron concentrations across 4 orders of magnitude (Fig. 3A) on corals from 270 5 species and genera: *A. millepora*, *Montipora digitata*, *P. damicornis*, *Porites cylindrica*, and 271 *Seriatopora hystrix*. The effect of diuron exposure duration on MQY was slight but significant. 272 A ten-fold increase in duration (in days) was associated with a decline in mean MQY of 0.03 273 (95% confidence interval: 0.01, 0.06; multiple linear regression *p* = 0.019; Fig. 3B). 274

275 **3.2 Quantitative Review**

276 Stressor-response combinations with fewer than three independent and comparable 277 articles were excluded from the meta-analysis but were included in the quantitative review 278 (Table 3; Table S3). Metals tended to affect coral responses at a range of concentrations that 279 varied by metal, as seen with fertilization success (Fig. 2), which in general was more impacted 280 by metals than by the pesticides examined. Considering all pollutants, larval survival and 281 settlement were typically affected at low concentrations or were not affected at all until 282 extremely high concentrations were applied. Juvenile survival was examined in response to a 283 limited range of pollutants but appeared more affected by the metal examined than by the 284 pesticides. In adult corals, the growth rate was impacted at lower pollutant concentrations than 285 the mortality rate across a range of pollutants. Coral responses related to symbiotic zooxanthellae 286 (e.g., bleaching, chlorophyll content, MQY) varied by pollutant.

287 *Coral gametes*: Fertilization success was examined in response to twelve metals and 288 eight pesticides. The effect of metals on fertilization can be grouped into three broad categories: 289 no impact at high concentrations, decreased fertilization at relatively high concentrations, and 290 decreased fertilization at relatively low concentrations. Cobalt, iron, and manganese had no 291 significant impact on fertilization at concentrations up to 2357 μ g L⁻¹, 25,300 μ g L⁻¹, and 71,200 292μ g L⁻¹ respectively. Cadmium, gallium, vanadium, and aluminum impacted fertilization success 293 at relatively high concentrations (5000 μ g L⁻¹, 3230 μ g L⁻¹, 2920 μ g L⁻¹, and 2950 μ g L⁻¹ 294 respectively). Tin, nickel, zinc, and copper had significant impacts on fertilization success at the 295 comparatively low concentrations of 318 μ g L⁻¹, 100 μ g L⁻¹, 10 μ g L⁻¹, and 6 μ g L⁻¹, 296 respectively. Of the eight pesticides examined, only the fungicide MEMC (2- 297 methoxyethylmercuric chloride) had an impact on fertilization at 1 μ g L⁻¹. The insecticides 298 carbaryl, chlorpyrifos, chlorpyrifos-oxon, endosulfan, permethrin, and profenofos had no

299 significant effect on fertilization success at concentrations up to 30 μ g L⁻¹, and the herbicide 300 diuron had no significant effect at concentrations up to 1000 μ g L⁻¹.

301 *Coral larvae*: Survival rates of pre-settlement coral larvae were examined in response to 302 exposure to five metals, five pesticides (all insecticides), and three PAHs. The impacts of metals 303 on larval survival were variable by metal. Mercury had no impact on larval survival at 304 concentrations up to 10 μ g L⁻¹, though higher concentrations were not examined. Iron and 305 manganese had significant negative effects at concentrations of 27,200 μ g L⁻¹ and 17,000 μ g L⁻¹. 306 respectively. Lead had a significant negative impact at $640 \mu g L^{-1}$, and copper had a significant 307 negative impact at concentrations as low as $10 \mu g L^{-1}$. Copper also affected larval development 308 and swimming velocity at 50 μ g L⁻¹, and lead impacted swimming velocity at concentrations of 309 $1,000 \mu g L^{-1}$.

310 Among pesticides, the insecticides naled $(0.56 \,\mu g \, L^{-1})$ and permethrin $(1.0 \,\mu g \, L^{-1})$ had 311 significant negative impacts on larval survival at very low concentrations, but chlorpyrifos 312 (1,000 μ g L⁻¹), 1-naphthol (1,000 μ g L⁻¹), and carbaryl (10,000 μ g L⁻¹) did not have measurable 313 effects until applied at much higher concentrations. PAHs appear to have negative effects on 314 larval survival at relatively low concentrations. Benzo(a)pyrene had significant negative effects 315 at 10 μ g L⁻¹, which was the only concentration examined, and anthracene and phenanthrene 316 negatively impacted larval survival and settlement at 9.4 μ g L⁻¹ and 56.3 μ g L⁻¹, respectively. 317 Larval settlement success (i.e., metamorphosis) was examined in response to five metals, 318 nine pesticides, and two PAHs. Metals either impacted settlement at relatively low 319 concentrations (i.e., copper at 24 μ g L⁻¹ and tin at 10 μ g L⁻¹), or they did not have any impact 320 until applied at very high concentrations (i.e., gallium at 2,150 µg L^{-1} , aluminum at 1,960 µg L^{-1} , 321 and vanadium at 564 μ g L⁻¹). Similarly, pesticides either affected settlement at low

322 concentrations or did not have an apparent effect until they were applied at high concentrations. 323 Naled, an insecticide, had no significant impacts on settlement at the concentrations examined, 324 and diuron, a herbicide, had negative effects at concentrations of 300 μ g L⁻¹. Carbaryl, an 325 insecticide, negatively impacted settlement at $3.0 \mu g L^{-1}$, while the insecticides chlorpyrifos, 326 endosulfan, and permethrin all had negative impacts at $1.0 \mu g L^{-1}$, as did the fungicide MEMC. 327 Chlorpyrifos-oxon and profenofos (both insecticides) showed negative effects on settlement at 328 concentrations as low as $0.3 \mu g L^{-1}$.

329 *Coral Juveniles*: The only response examined for juvenile, post-settlement corals (i.e., 330 recruits) was survival, which was assessed after exposure to tin, diuron, naled, and permethrin. 331 Tin significantly decreased the likelihood of juvenile survival at 2.5 μ g L⁻¹. The insecticides 332 naled and permethrin did not have any significant effect on juvenile survival at the maximum 333 concentrations examined, 9.59 μ g L⁻¹ and 6.04 μ g L⁻¹, respectively. Diuron had no effect on 334 juvenile survival at concentrations up to $1,000 \mu g L^{-1}$.

335 *Coral Adults*: Tissue loss, growth rates, and adult mortality were examined in response to 336 four metals, eight pesticides, two PAHs, and a PCB. Mortality increased following exposure to 337 low concentrations of some pollutants (e.g., copper) and higher concentrations of others (e.g., 338 manganese), but growth rates typically declined at much lower concentrations. Copper reduced 339 growth rates at 4 μ g L⁻¹ and increased adult mortality at concentrations as low as 40 μ g L⁻¹. Coral 340 growth rates also declined at low concentrations of nickel $(3.52 \mu g L^{-1}$ when combined with 341 temperature stress), tin $(0.4 \mu g L^{-1})$, and cobalt $(0.22 \mu g L^{-1})$. Mortality increased after exposure 342 to higher concentrations of lead (320 μ g L⁻¹), and tissue loss and mortality increased at even higher concentrations of manganese (1000 μ g L⁻¹ and 5,000 μ g L⁻¹, respectively).

344 Diuron decreased growth rates at $1 \mu g L^{-1}$ and caused tissue loss and adult coral mortality 345 at 10 μ g L⁻¹, while another herbicide, 2,4-D, caused mortality at 19,300 μ g L⁻¹. None of the 346 fungicides or insecticides (i.e., MEMC, carbaryl, chlorpyrifos, endosulfan, permethrin, and 347 profenofos) caused tissue mortality at the maximum concentration examined, 10 μ g L⁻¹, but 348 profenofos and MEMC reduced tentacular activity at $10 \mu g L^{-1}$. Fluoranthene, a PAH, increased 349 issue mortality at low concentrations (30 μ g L⁻¹), while 1-methylnaphthalene increased tissue 350 mortality and decreased tentacular activity at much higher concentrations (5,427 μ g L⁻¹ and 351 above). Aroclor 1254, a PCB, did not affect mortality or growth at the concentration examined, 352 0.29 μ g L⁻¹. Estrone, which is a naturally produced hormone used in pharmaceutical applications, 353 decreased coral growth rates at concentrations as low as $0.002 \mu g L^{-1}$, but mortality rates were 354 not reported.

355 Bleaching was also examined as a stress response to two metals, eight pesticides, two 356 PAHs, and one PCB. No bleaching was seen in response to cadmium at concentrations up to 50 357μ g L⁻¹, but bleaching was seen after exposure to copper concentrations of 30 µg L⁻¹. Aroclor 1254, a PCB, did not cause bleaching at the concentration examined (0.29 μ g L⁻¹). Bleaching 359 after exposure to PAHs and pesticides was variable. Bleaching occurred at 15 μ g L⁻¹ of f luoranthene but not at concentrations of up to $100 \mu g L^{-1}$ of benzo(a)pyrene. Bleaching also 361 occurred in response to four pesticides at 10 μ g L⁻¹; the fungicide MEMC; the herbicide diuron; 362 and the insecticides permethrin and profenofos. No bleaching response was seen, however, after 363 exposure to 10 μ g L⁻¹ of the insecticides carbaryl, chlorpyrifos, or endosulfan, and even when 364 combined with temperature stress, bleaching was only seen after exposure to very high 365 concentrations of the herbicide glyphosate (10,800 μ g L⁻¹).

366 Symbiont density was also measured in response to six metals, nine pesticides, and one 367 PAH. As seen with other coral responses, symbiont density decreased with exposure to metals at 368 a range of concentrations that varied by metal. Cadmium had no significant effect on symbiont 369 density at the maximum concentrations examined, $5 \mu g L^{-1}$, while nickel decreased symbiont 370 density at 3.5μ g L⁻¹ when combined with temperature stress. Symbiont density decreased with 371 exposure to mercury (180 μ g L⁻¹), lead (75.6 μ g L⁻¹), copper (12.6 μ g L⁻¹), iron (10 μ g L⁻¹), and 372 benzo(a)pyrene, a PAH, (100 μ g L⁻¹). Symbiont density decreased following exposure to 10 μ g 373 L⁻¹ of profenofos (insecticide), MEMC (fungicide), and diuron (herbicide), but there was no 374 significant change in symbiont density following exposure to the same concentration of the 375 insecticides carbaryl, chlorpyrifos, endosulfan, naled, and permethrin. Symbiont density also 376 decreased after exposure to very high (19,300 μ g L⁻¹) concentrations of the herbicide 2,4-D. 377 The impact of pollutants on chlorophyll content was also examined. This assessment 378 included studies focusing on five metals, four pesticides, and one PAH. As seen in other coral 379 responses, chlorophyll content decreased after exposure to metals at a range of concentrations 380 that varied by metal. Cadmium had no significant impact on chlorophyll at concentrations up to 50μ g L⁻¹, but chlorophyll content decreased with exposure to mercury (180 μ g L⁻¹), lead (75.6 1382μ g L⁻¹), and copper (5 μ g L⁻¹). Benzo(a)pyrene, a PAH, reduced chlorophyll content at 9.02 μ g 383 L⁻¹, and when combined with temperature stress, the herbicide glyphosate decreased chlorophyll 384 content at 10,800 μ g L⁻¹. Atrazine, diuron, and hexazinone, all herbicides that inhibit 385 photosystem II (Table 1), did not significantly impact chlorophyll content at the maximum 386 concentrations examined (12.0 μ g L⁻¹, 0.84 μ g L⁻¹, and 3.8 μ g L⁻¹, respectively). 387 Effective quantum yield (EQY) was measured as a response in studies that focused on the 388 effects of copper, 1-methyl-naphthalene (a PAH), and fifteen pesticides (Table 3). However,

389 maximum quantum yield (MQY) is the primary photosynthetic response considered herein (see 390 Methods). MQY was examined in response to copper (see meta-analysis), cobalt, lead, nickel, 391 Aroclor 1254 (PCB), and four herbicides. Cobalt and nickel had no significant impact on MQY 392 at the highest concentrations examined, 0.22 μ g L⁻¹ and 3.52 μ g L⁻¹, respectively. Copper had 393 negative effects on MQY at concentrations as low as $1 \mu g L^{-1}$, and lead also affected MQY at μ 394 higher concentrations of 320 μ g L⁻¹. Aroclor 1254 had no significant impact on MQY at the 395 highest concentration examined, 0.29 μ g L⁻¹. The herbicide, 2,4-D, similarly had no effect on 396 MQY at 100,000 µg L⁻¹, the highest concentration examined. Atrazine and diuron did have 397 negative effects on MQY at $3 \mu g L^{-1}$ and $1 \mu g L^{-1}$, respectively.

398

399 **4. DISCUSSION**

400 Reduced water quality can be a root cause of extended and extensive coral-reef loss. 401 Pollutants are major components of water quality, and as reviewed herein and elsewhere (Cooper 402 et al., 2009; Fabricius, 2005; Gregg, 2013; Shaw et al., 2010), can cause reductions in coral 403 reproductive function, recruitment, growth rates, and survivorship of both larvae and adults, 404 while increasing disease susceptibility. Cumulatively, these effects diminish coral populations' 405 persistence and replenishment capacity. To address this concern, we estimated thresholds of 406 coral health in response to pollutants using a meta-analytical approach (Table 2). This required 407 adapting Bayesian hierarchical dose-response meta-analysis models, originally developed for 408 biopharmaceutical research (Thomas et al., 2014; Wu et al., 2018), for use with complex 409 ecological datasets. Given the diversity of pollutants, coral responses, and experimental 410 approaches, however, thresholds could not be estimated for most combinations of pollutants and 411 responses (Table 4). Some pollutants, such as copper, have 14 different responses examined with 412 up to 9 papers examining a single pollutant-response pair. Other pollutants and pollutant classes 413 have received far less attention, which limits the capacity for meta-analysis to be used to develop 414 more robust guidelines for these stressors. This is a particularly urgent need for pollutants with 415 known impacts in other systems, such as estrogenic compounds and pesticides (Hayes and 416 Hansen, 2017). In contrast to the coverage for copper, the three most widely used herbicides – 417 2,4-D, atrazine, and glyphosate – have only 7 studies among them included in this quantitative 418 review (Table 3) (Hayes and Hansen, 2017).

419 Our study highlights the need to reassess the way in which pollution thresholds are 420 examined on coral reefs and in other systems. Typically, the responses measured during early 421 coral life-history are 'terminal' in that failure to fertilize or survive to the settlement-stage 422 effectively precludes the capacity of a coral population to persist and rebound after stressful 423 events, but these impacts can also compound through the life stages of a coral and affect various 424 life stages differently. The varied and in some cases cumulative impacts of pollutants at different 425 life stages have been demonstrated in other organisms such as Chinese cabbage (Luo et al., 426 2019), zebrafish (Brion et al., 2004), and albatross (Goutte et al., 2014). Understanding how 427 these potentially additive impacts manifest is important in identifying high risk time periods or 428 locations for management. This is especially important in corals which have unique, complex life 429 cycles that are intimately linked to the health of their holobiont (i.e., associated symbionts, 430 bacteria, fungi) (Vega-Thurber et al., 2009).

431 One example of the compounding effect of pollutant exposure specific to this study is 432 illustrated in Fig. 4, in which exposure to just $40 \mu g L^{-1}$ copper during the first week post-433 fertilization leads to less than half the number of coral recruits, as compared to uncontaminated 434 conditions (27% vs. 59% of starting gametes). Copper exposure at 100 μ g L⁻¹ effectively

435 eliminates all coral larvae from settling to the reef. Thus, assigning a management threshold at 436 EC₅₀ values for responses of immature corals will likely be inadequate to prevent reef decline. A 437 greater diversity of responses to stressors is measured for adult corals, which offers an 438 opportunity to consider sublethal effects when estimating pollution thresholds that are more 439 conservative than those estimated from lethal effects only. Regardless, additional studies are 440 needed that evaluate the effect of more pollutants across the coral life cycle before truly effective 441 management thresholds can be assigned. In the meantime, a conservative approach should be 442 adopted when data suggest that a pollutant adversely affects corals at any stage. 443 Our quantitative review indicates that some pollutants impact corals more than other 444 pollutants, which can offer insight and guidance into mitigating the risks of multiple, co-445 occurring chemicals (see Table 3). For example, the lowest concentrations (LOAELs) at which 446 copper adversely affected fertilization was 6 μ g L⁻¹, while settlement was impacted at 24 μ g L⁻¹ 447 and adult survival at 40 μ g L⁻¹. Zinc similarly affects fertilization at just 10 μ g L⁻¹. Conversely, 448 tin does not impact fertilization at concentrations up to 318 μ g L⁻¹, but does negatively affect 449 settlement and juvenile survival at much lower concentrations of 10 μ g L⁻¹ and 2.5 μ g L⁻¹, 450 respectively. Other metals, such as cadmium, only reduce fertilization at much higher 451 concentrations (5000 μ g L⁻¹). Different classes of pollutants, such as herbicides that inhibit 452 photosystem II (e.g., diuron), may differentially impact coral life stages (Table 1). Diuron has a 453 LOAEL for larval settlement of 300 μ g L⁻¹, but negatively impacts photosynthesis at 454 concentrations as low as $0.3 \mu g L^{-1}$ (Negri et al., 2005). Conversely, another herbicide, 455 chlorpyrifos (an acetylcholinesterase-inhibitor), does not inhibit fertilization or adult coral 456 function at the concentrations measured, but does impact larval settlement at just 1 μ g L⁻¹ (Table 457 3). Compared to metals and pesticides, the impacts of PAHs, PCBs, and pharmaceuticals on

458 corals are understudied. However, within those studies that do exist, there is variability in the 459 impacts among life stages. These differences highlight the importance of examining impacts at 460 different life stages to understand the breadth of potential effects and develop management 461 strategies that specifically target the greatest threats at the most vulnerable stages.

462 Many pollutants also degrade in the environment and in organisms, yielding a myriad of 463 different breakdown products that may be harmful to corals and other animals (ATSDR, 1995). 464 However, breakdown products present in the environment are not well documented for many 465 pollutants, making it difficult to assess their potential impact (Hayes and Hansen, 2017). Further, 466 most studies examine one pollutant at varying concentrations and then measure a single 467 biological response. In the environment, however, corals and other organisms are exposed to a 468 diverse array of pollutants that may be found in combination with other stressors such as 469 fluctuations in sediment, freshwater, temperature, and pH (Banc-Prandi and Fine, 2019; 470 Donovan et al., 2020; Hédouin et al., 2016; Negri et al., 2011a). These combinations may 471 produce synergistic and additive effects that are difficult to isolate, quantify, and manage. For 472 example, zinc can be harmful to corals and other organisms in isolation, but it is also known to 473 interact with other metals, such as lead and copper, exacerbating negative impacts (Eisler, 1993). 474 This further highlights the need for conservative guidelines that account for multiple stressors, 475 sublethal impacts, and compounding effects throughout the life cycle of an organism. 476 Future studies examining the impacts of pollutants on corals and other marine organisms 477 should consider environmentally relevant concentrations of pollutants, which means including

478 ambient, background levels as well as those that are enhanced significantly by human activity.

479 For example, nickel is found at high concentrations in the environment from natural sources such

480 as volcanic rock, but it is found in unnaturally high levels on coral reefs adjacent to locations

481 with land use that causes runoff of nickel-rich sediments (Hédouin et al., 2009). Environmentally 482 relevant concentrations may also lend insight into the importance of exposure duration in 483 experimental studies. For instance, we found that diuron may have impacts that vary depending 484 on exposure duration (Fig. 3). This may be of particular importance in areas with limited water 485 flow to flush out pollutants, such as enclosed bays. Understanding the relative importance of 486 exposure concentration, duration, and frequency is important for local management strategies. 487 Thus, increasing the number of studies that examine the impacts of acute vs. chronic pollutant 488 exposures will increase the capacity to compare across stressors and more accurately model their 489 interactions on reefs.

490 The difference between acute exposure and chronic impacts is often considered in the 491 development of consumption limits in the context of human health (e.g., ATSDR Minimal Risk 492 Levels or US EPA Reference Doses), so these guidelines may offer insight into how to more 493 effectively develop thresholds for pollutant impacts on wildlife. In the human health context, 494 'Reference Doses' are developed by taking the highest concentration at which there is no 495 observable adverse effect (NOAEL) in response to a pollutant and dividing it by an uncertainty 496 factor, which can range from 10 to 3000 (US EPA, 1993; US EPA, 2009). Resource managers 497 may want to model habitat conservation guidelines off of this approach to account for the 498 sublethal, synergistic, and compounding impacts of pollutant stressors on corals and other marine 499 organisms. Further, this would aid in addressing the often undocumented differences in 500 responses between species and morphology, where some taxa are better equipped than others to 501 manage exposure to certain stressors. In many cases, we do not have species-specific guidelines, 502 and this is an area that is ripe for additional research, especially in locations where resource 503 managers seek to develop place-based strategies. In the meantime, however, setting conservative

504 limits modeled after human health approaches would ensure that the most vulnerable taxa are 505 better protected, even in cases where their responses are not well documented.

506 Tools that identify sublethal stress in corals, including molecular techniques such as 507 proteomics, genomics, and transcriptomics, also allow for both the diagnosis and evaluation of 508 the effectiveness of management interventions at both individual and population levels. These 509 molecular biomarkers can be used to identify those specific toxicants that affect homeostasis, 510 metabolic condition, reproductive function, and DNA integrity, potentially before declining coral 511 health is evident (Cantin et al., 2007; Parkinson et al., 2019; Tisthammer et al., 2021). When 512 such molecular data are evaluated and applied, interventions can be designed, implemented and 513 evaluated in periods of weeks to months, rather than years to decades, as is done with ecological 514 indicators such as percent coral cover (Cooper et al., 2009). These qualitative and quantitative 515 tools can identify key stressors of biological relevance, threshold levels at which effects occur, 516 and antagonisms/synergisms with other stressors. Furthermore, research frameworks exist for the 517 discovery, validation, and implementation of molecular biomarker tools in corals (Parkinson et 518 al., 2019).

519 These molecular tools now allow researchers and managers to rapidly identify the 520 biological relevance of chemical contaminants, not just their presence and concentration, which 521 when measured in the field are ephemeral and change with tides, wind, rainfall, and water 522 characteristics such as flushing and residence times. Corals and other reef organisms serve as 523 sensitive and accurate integrators of toxicant exposure in the field. For example, coral lipids can 524 act as living semipermeable membrane devices for accumulating lipophilic/hydrophobic 525 substances, such as PAHs and pesticides (Caroselli et al., 2020; Porter et al., 2018). Additionally, 526 molecular tools allow managers to identify both sensitive and resistant genotypes, and of critical

527 importance to reef resilience, genotypic diversity within coral populations (Tisthammer et al., 528 2021). This is a very important indicator of impending local extinction events in which specific 529 stressor thresholds are exceeded and genotypic diversity is lost.

530 Based on apparent gaps in our understanding and approach-to-date, we recommend that 531 researchers target a broader set of pollutant types. We also recommend defining critical threshold 532 values for toxicants on coral reefs by targeting a broad range of stressor concentrations that 533 reflect toxicant levels seen in the environment and elicit sublethal (e.g., physiological, 534 behavioral, molecular, or microbial) responses in corals, so that stress can be quantified and 535 mitigated before corals experience mortality. We also encourage experimental designs that result 536 in a dose-response curve to enable estimation of the inhibitory concentration thresholds (EC_x) . 537 Furthermore, we recommend that researchers attempt to standardize the units in which they 538 report both toxicant levels (e.g., μ g L⁻¹) and coral responses (e.g., bleaching, see Grottoli et al., 539 2020), and that raw data is made available whenever possible. These efforts will improve our 540 ability to synthesize comparable information across studies, locations, species, and stressors, thus 541 resulting in data-rich meta-analyses that better inform management decisions.

542 As the availability of data that addresses a range of pollutants at environmentally relevant 543 concentrations over the complete life cycle of corals becomes available, it is important to update 544 and adapt management strategies as appropriate. In the cases where sufficient data do not exist to 545 inform management and policy decisions, the approach of public health officials should be 546 followed to develop guidelines that employ the precautionary principle. Many pollutants are co-547 occurring and are present in combination with other environmental stressors, such as increased 548 temperature or ocean acidification, that may also have synergistic or additive effects (Biscéré et 549 al., 2015; Cabral et al., 2019; Fujita et al., 2014; Kwok and Ang, 2013). With this in mind, it

550 must be acknowledged that guidelines based on NOAEL/LOAELs or EC50 values are not 551 necessarily conservative enough to protect foundational species, like reef-building corals. In 552 addition, adopting truly conservative guidelines will better address the potential variability in the 553 effects of exposure duration on the stress response.

554 Basing guidelines on the maximum concentrations present in water quality monitoring as 555 well as those seen in extreme events, rather than the mean, is one way that resource managers 556 can work to enact more conservative management strategies. In addition, resource managers can 557 also take proactive steps to collaboratively work with other agencies to address pollution before 558 it reaches the coastal zone. As an example, some pollutants are broken down by bacteria and 559 fungi (Ceci et al., 2019), so comprehensive ridge-to-reef management strategies may consider 560 these active remediation strategies to reduce land-based pollutant inputs. Finally, climate change 561 impacts pose a clear threat to reefs globally, so as managers develop strategies to mitigate the 562 risks associated with increased temperatures, bleaching events, ocean acidification, and increased 563 storm frequency, it is important to also consider the reduced capacity for resilience and recovery 564 in corals that are already experiencing physiological stress as a result of toxicant exposure.

565

566 **5. CONCLUSIONS**

567 When sufficient data are available, Bayesian dose-response meta-analysis provides a 568 robust way of examining the relationship between pollutant concentrations and subsequent coral 569 responses. The impacts of copper on fertilization are well studied and offer an example of the 570 type of data that would be desirable for all stressor-response combinations. Because there are so 571 few studies, it is not yet possible to disentangle the effects of species, morphology, or location, 572 but these are important considerations for the development of place-based management

573 strategies. In the absence of robust reference data for most pollutants, it is important to create 574 management guidelines that are conservative and abide by the precautionary principle. Pollutants 575 on reefs do not act in isolation. Instead, they are typically combined with other toxins and 576 environmental stressors associated with climate change (Cabral et al., 2019; Fujita et al., 2014), 577 and negative impacts likely compound throughout the different life stages (Fig. 4). In 578 combination with more conservative guidelines that account for the known and unknown 579 variability in these systems, coordinated strategies that include active remediation will also 580 reduce impacts on reefs. Finally, it is also important to move beyond considering just lethal coral 581 responses at single life-history stages as indicators of stress. Developing standardized approaches 582 to measure sublethal responses will offer resources for the development of targeted, proactive 583 interventions.

584 Global climate change – with the associated problems of elevated seawater temperatures 585 and regional mass coral bleaching events, ocean acidification affecting calcification rates, 586 enhanced tropical storm frequency and severity, and sea level rise – is clearly the major cause of 587 coral-reef loss at the global scale. From a management perspective, however, it is strategic and 588 essential to address local stressors now to buy time to tackle the challenge of climate change. 589 Reducing local stressors, such as chemical pollutants, can improve resistance, resilience, and 590 recovery for individual reefs and reef ecosystems.

591

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600 **DATA STATEMENT**

- 601 All data generated during this study, along with code used to analyze data and generate figures,
- 602 are shared in the public repository: https://github.com/ljtuttle/coral_pollutant_thresholds

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1087 **TABLE AND FIGURE CAPTIONS**

1088 **Table 1.** Focal pollutants of this review that may elicit negative physiological responses in 1089 corals, grouped by class, industrial use/source, and mode of action.

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1091 **Table 2.** Bayesian hierarchical dose-response meta-analysis results for the stressor-response 1092 pairs with sufficient data to be included in the meta-analysis. ECx refers to the effective 1093 concentration of copper (μ g L⁻¹), as derived from the meta-analytical model, that inhibited the 1094 coral response by 5%, 10%, 20%, or 50%, with model average estimates and lower (Q2.5) and 1095 upper (Q97.5) Bayesian credible intervals.

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1097 **Table 3.** Quantitative review of pollutants, coral responses, range of concentrations examined 1098 (not including control levels at $0 \mu g L^{-1}$), and no- and lowest-observed adverse effect levels 1099 (NOAEL, LOAEL) from the corresponding article(s). A LOAEL is the lowest pollutant 1100 concentration experimentally tested at which a coral adversely responded, and a NOAEL is the 1101 highest pollutant concentration, less than or equal to the LOAEL, at which a coral did not 1102 adversely respond. If more than one article is listed, then the LOAEL is the most conservative 1103 (i.e., lowest) value from among the articles. See Table S3 for more details concerning species, 1104 region, and reported EC50 values from each article. Abbreviations: EQY = effective quantum 1105 yield; MQY = maximum quantum yield; P/R = production to respiration ratio. 1106 1107 **Table 4.** Relative amounts of data available (i.e., gap analysis) that address different

1108 combinations of pollutants (left two columns) with coral responses, organized by life-history

1109 stage (top). The numbers in each cell indicate the number of articles that examine the pollutant-

1110 response pair, and the shade of the cell is scaled to the relative number of articles, with darker

1111 shades indicating more articles. Empty cells indicate no (zero) articles found in our systematic

1112 review that adequately address the pollutant-response pair.

1113

1114 **Figure 1.** Inhibitory dose-response curves for the effects of copper on coral fertilization success 1115 (n = 9 articles with 17 experiments therein) (**A**), larval survival (n = 3 articles with 6 experiments 1116 therein) (**B**), larval settlement ($n = 3$ articles with 4 experiments therein) (**C**), and adult 1117 maximum quantum yield (n = 4 articles with 11 experiments therein) (**D**). Each point represents 1118 a raw mean from an experimental control/treatment group included in the meta-analysis. 1119 Bayesian model results are shown as lines: the bold black lines represent the models' average 1120 curves (with 95% credible intervals as gray-shaded regions) across all studies, and the gray lines 1121 represent the model-estimated curve for each article/experiment (all lines in **D** converged along 1122 the average). The red dashed lines and corresponding numbers along the x-axis indicate the EC_{50} 1123 parameter estimate for the average curve. 1124 *Formatting note*: 1.5 columns, color preference online only 1125 **Figure 2.** The relative effects of different metal concentrations (in μ mol L^{-1}) on coral 1127 fertilization success, shown as Bayesian-modeled inhibitory dose-response curves (**A**) and as 1128 EC50 posterior distributions and estimates (points) +/- Bayesian 95% credible intervals (dark 1129 lines) (**B**). Points and lines in (**A)** are color-coded by metal as indicated in the key. The following 1130 metals were included: cadmium (n = 2 articles with 3 experiments therein); copper (n = 9 articles 1131 with 17 experiments therein); iron (n = 1 article with 4 experiments therein); lead (n = 1 article 1132 with 3 experiments therein); manganese (n = 1 article with 4 experiments therein); nickel (n = 3

1133 articles with 5 experiments therein); zinc (n = 2 articles with 2 experiments therein); and

1134 aluminum, cobalt, gallium, tin, and vanadium (all with n = 1 experiment in 1 article).

1135 *Formatting note*: 1.5 columns, color preference in-print and online

1136

1137 **Figure 3.** Coral maximum quantum yield as a function of diuron exposure concentration (**A**) and 1138 duration (**B**) (n = 5 with 25 experiments therein). Each point represents a raw mean (+/- standard 1139 error, shown in **B** only**)** from an experimental control/treatment group included in the meta-1140 analysis. Bayesian model results are shown in (**A**) as lines: the bold black line represents the 1141 model's average curve (with 95% credible intervals as gray-shaded region) across all studies, and 1142 the gray lines represent the model-estimated curve for each article/experiment. The red dashed 1143 line and corresponding number along the x-axis indicate the EC_{50} parameter estimate for the 1144 average curve. (**B**) Shows data for three exposure concentrations across two orders of magnitude 1145 of diuron exposure duration (1-100 days), and indicates a relatively weak relationship between 1146 – duration and MQY, especially at 0 and 1 μ g L⁻¹. 1147 *Formatting note*: 1.5 columns, color preference online only 1148 1149 **Figure 4**. Illustrative representation of the compounding effects of copper during the early life 1150 stages of a coral in a simplified, closed system where only reproductive adults contribute to the population. The horizontal, colored bands correspond to systems with 0, 40, and 100 μg $L⁻¹$ 1152 copper, respectively. "Absolute" numbers are the Bayesian model average estimates for the 1153 corresponding copper concentration and coral response. "Cumulative" numbers are the absolute 1154 percent listed at a stage multiplied by the cumulative percent from the previous stage (assuming 1155 100% for reproductive adults). Thus, it represents the percent of individuals remaining since

- 1156 release of gametes by adults. Absolute estimates (with Bayesian 95% credible intervals) at 0 μg
- 1157 L⁻¹ are 89.0% (85.5, 92.3) for fertilization success, 89.1% (76.3, 98.7) for larval survival, and
- 1158 74.1% (59.3, 88.9) for larval settlement. At 40 µg L^{-1} , the same estimates are 61.7% (38.8, 88.3),
- 1159 86.4% (63.7, 98.7), and 50.0% (9.8, 88.5), respectively. At 100 μ g L⁻¹, the same estimates are
- 1160 9.0% (4.9, 13.9), 49.9% (42.0, 84.4), and 2.2% (1.8, 4.5), respectively.
- 1161 *Formatting note*: 1.5 columns, color preference online only
- 1162

Copper exposure concentration (μ g L⁻¹)

Table 1. Focal pollutants of this review that may elicit negative physiological responses in corals, grouped by class, industrial use/source, and mode of action.

Table 2. Bayesian hierarchical dose-response meta-analysis results for the stressor-response pairs with sufficient data to be included in the meta-analysis. EC_x refers to the effective concentration of copper (μ g L⁻¹), as derived from the meta-analytical model, that inhibited the coral response by 5% , 10% , 20% , or 50%, with model average estimates and lower (Q2.5) and upper (Q97.5) Bayesian credible intervals.

Table 3. Quantitative review of pollutants, coral responses, range of concentrations examined (not including control levels at 0 µg L⁻ ¹), and no- and lowest-observed adverse effect levels (NOAEL, LOAEL) from the corresponding article(s). A LOAEL is the lowest pollutant concentration experimentally tested at which a coral adversely responded, and a NOAEL is the highest pollutant concentration, less than or equal to the LOAEL, at which a coral did not adversely respond. If more than one article is listed, then the LOAEL is the most conservative (i.e., lowest) value from among the articles. See Table S3 for more details concerning species, region, and reported EC50 values from each article. Abbreviations: EQY = effective quantum yield; MQY = maximum quantum yield; P/R = production to respiration ratio.

^a when combined with temperature stress
^b when combined with urea enrichment
^c qualitative description
^d when combined with UVA

Table 4. Relative amounts of data available (i.e., gap analysis) that address different combinations of pollutants (left two columns) with coral responses, organized by life-history stage (top). The number in each cell indicates the number of articles that examine the pollutant-response pair, and the shade of the cell is scaled to the relative number of articles, with darker shades indicating more articles. Empty cells indicate no (zero) articles found in our systematic review that adequately address the pollutant-response pair.

9,332 search results

n = 55 studies in quantitative review, *n = 25* studies in meta-analysis

Metals Pesticides PAH Pharma-ceuticals **Pollutants on Corals:** © E. Conklin

RECOMMENDATIONS to fill research gaps and standardize reporting across studies

1) SYSTEMATIC REVIEW 2) QUANTITATIVE REVIEW 3) DOSE-RESPONSE META-ANALYSIS

