

Precision and cost-effectiveness of bioindicators to estimate nutrient regimes on coral reefs

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Marine Pollution Bulletin

DOI:

<https://doi.org/10.1016/j.marpolbul.2021.112606>

Published: 01/09/2021

Peer reviewed version

[Cyswllt i'r cyhoeddiad / Link to publication](#)

Dyfyniad o'r fersiwn a gyhoeddwyd / Citation for published version (APA):

Vaughan, E. J., Wynn, P. M., Wilson, S. K., Williams, G. J., Barker, P. A., & Graham, N. A. J. (2021). Precision and cost-effectiveness of bioindicators to estimate nutrient regimes on coral reefs. *Marine Pollution Bulletin*, 170, [112606]. <https://doi.org/10.1016/j.marpolbul.2021.112606>

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24 **Abstract**

25 Bioindicators are useful for determining nutrient regimes in marine environments, but their
26 ability to evaluate corals reefs in different ecological states is poorly understood. The
27 precision, availability and congruency of eight potential bioindicators (brown macroalgae,
28 green macroalgae, turf algae, cyanobacteria, soft corals, zoanthids, sponges, and sediment)
29 and their stable isotopic and elemental signatures ($\delta^{15}\text{N}$, $\delta^{13}\text{C}$, %N, %C, and C:N Ratio) were
30 assessed across 21 reefs in the Inner Seychelles. The coefficient of variation (CoV) for $\delta^{15}\text{N}$
31 showed that green and brown macroalgae were highly precise (2.47 ± 0.95 , $n=11$; $4.68 \pm$
32 1.33 , $n=16$, respectively), though were less common on recently-bleached reefs relative to
33 macroalgal-dominated ones. Zoanthids were also highly precise for $\delta^{15}\text{N}$ (2.98 ± 1.20), but
34 were more readily available regardless of reef state ($n=18$). Congruency was low among these
35 indicators, suggesting that different physiological mechanisms for nutrient processing have a
36 stronger influence on a bioindicator's effectiveness than reef state.

37

38 **Keywords:** *Pollution; stable isotopes; macroalgae; environmental monitoring; regime shifts*

39

40 **1. Introduction**

41 Coral reefs are facing global declines in live coral cover due to climate change (Hughes et al.,
42 2018), and local-scale degradation from overfishing and pollution (Burkepile & Hay, 2006;
43 Littler et al., 2006; Zaneveld et al., 2016; MacNeil et al., 2019). Increased anthropogenic
44 nutrient loads and reduced herbivory can cause the proliferation of opportunistic species such
45 as fleshy macroalgae, which may lead to a regime shift from a coral-dominated to an algal-
46 dominated reef (Littler et al., 2006; Hughes et al., 2007; Fulton et al., 2019). Monitoring the
47 state of coral reefs relative to anthropogenic stressors provides insights into causes of decline
48 in reef condition, potentially instigating management actions. Two particularly widespread

49 local stressors are fishing and eutrophication (Fabricius et al., 2005; Burkepile & Hay, 2006;
50 Littler et al., 2006; Zaneveld et al., 2016). While there has been significant progress in
51 understanding the effects of fishing (e.g. Cinner et al. 2018), it has been more difficult to
52 detect and quantify nutrient loads that cause eutrophication in the marine environment, due to
53 high spatio-temporal variability in the water column (Fabricius et al., 2005; Wyatt et al.,
54 2013; D'Angelo & Wiedenmann, 2014; Briand et al., 2015; Lowe & Falter, 2015; Clausing &
55 Fong, 2016; MacNeil et al., 2019). It is therefore critical to identify more cost-effective
56 methods of capturing nutrient enrichment to improve assessments of coral reef health over
57 different spatial scales as part of routine environmental monitoring strategies (Fabricius et al.,
58 2012; Bal et al., 2020).

59

60 Bioindicators are used widely to capture nutrient regimes in tropical marine systems, as they
61 provide an ecologically relevant response to bioavailable nutrients in the surrounding water
62 column (Fichez et al., 2005; Cooper et al., 2009; Fabricius et al., 2012). As such,
63 bioindicators are cost-effective alternatives to direct measures of seawater nutrients, which
64 can be highly variable and require frequent sampling that do not always capture fine-scale
65 temporal variation or wider ecological impacts (Fabricius et al., 2012). Suitable bioindicators
66 are defined in Cooper et al. (2009) as those with biological responses that are a) specific
67 towards a driver of change or stressor, b) reflective of the magnitude of any changes, c)
68 consistent across different scales, d) cost-effective, and e) ecologically relevant. Non-
69 biological indicators, conversely, are those which can still reflect drivers of change, but not
70 through biological responses (i.e. nutrients stored in reef sediments) (Linton & Warner, 2003;
71 Fichez et al., 2005).

72

73 Previous studies have measured the presence: absence ratio of selected bioindicators to
74 investigate water quality (Fichez et al., 2005; Cooper et al., 2009), however, using this type
75 of methodology alone does not take into account other biophysical factors that may influence
76 their abundance (Linton & Warner, 2003). Therefore, measuring stable isotope signatures
77 ($\delta^{15}\text{N}$ and $\delta^{13}\text{C}$) and concentration levels (%N, %C and C:N ratio) in the tissues of a selected
78 bioindicator allows scientists and environmental managers to assess both the source(s) and
79 concentration of nutrient regimes, respectively, better determine the spatio-temporal
80 variability of nutrient regimes and detect and map the spatial ecological impacts (Costanzo et
81 al., 2001)Fleshy macroalgae are widely used for such a purpose, because they respond rapidly
82 to high nutrient concentrations by assimilating bioavailable nutrients from their local
83 environment into their tissues over their active growth periods, thereby capturing temporal
84 variation in nutrients (Costanzo et al., 2001). They are also easy to collect and survey in the
85 field, especially in nutrient-rich coastal areas (Fichez et al., 2005; García-Seoane et al.,
86 2018a&b; Zubia et al., 2018).

87

88 One of the main limitations of using only a single species of macroalgae, even with stable
89 isotopic analyses, are the spatio-temporal gaps in their distribution, which are driven by a
90 number of abiotic factors such as wave exposure, irradiance, temperature, rainfall and
91 seasonality (Linton & Warner, 2003; Williams et al., 2013; Clausing & Fong, 2016; Duran et
92 al., 2016; Fulton et al. 2019), and biotic factors such as herbivory and competition (Burkepile
93 & Hay, 2006; Duran et al., 2016). These limiting factors may also affect the ability of
94 macroalgae to proliferate on some reefs that have experienced significant disturbances
95 (Littler et al., 1991; Graham et al., 2015). These distributional gaps can also lead to
96 inconclusive or even misleading findings in any studies or monitoring programs, particularly
97 if they are quantifying the abundance of a particular species across a range of target sites

98 (Linton & Warner, 2003). As such, the utility of alternative bioindicators to capture nutrient
99 regimes is of importance to monitoring programmes.

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101 A range of other marine organisms have been used as bioindicators in water quality or
102 nutrient enrichment studies, such as scleractinian corals (Hoegh-Guldberg et al., 2004), soft
103 corals (Fleury et al., 2000; Risk, 2014), and sponges (Ward-Paige et al., 2005). In addition,
104 multiple candidate bioindicators have been used to assess water quality depending upon their
105 response time to a change in their local nutrient environment (Cooper et al., 2009), or on the
106 extent of their abundance and distribution, which also allows the spatial extent of nutrient
107 runoff to be assessed (Fabricius et al., 2012). Some bioindicators may take longer to find or
108 process than others, particularly in areas where they are relatively uncommon or rare.

109 Selection of bioindicators should therefore also consider the cost-effectiveness of the
110 collection and subsequent processing of samples (Risk et al., 2001; Drummond & Connell,
111 2008; Bal et al., 2020). This will be especially important for researchers and managers tasked
112 with monitoring water quality over large spatial and temporal scales, such as entire reef
113 systems (De'ath & Fabricius, 2010; Graham et al., 2015).

114

115 Few studies have tested whether patterns in nutrient signatures of different bioindicators are
116 congruent (i.e. they are able to show the same relative trends in isotopic values between
117 indicators) across different spatio-temporal scales or gradients (Tucker et al., 1999; Gartner et
118 al., 2002; Pitt et al., 2009), and this multi-taxa approach is even less common in coral reef
119 studies,(Connolly et al., 2013; Kürten et al., 2014; Graham et al., 2018). Untested variability
120 in isotopic composition within and between different reefs , bioindicators, and even studies
121 could therefore reduce the reproducibility, or else the comparability of large-scale and long-
122 term monitoring assessments (Pitt et al., 2009; Connolly et al., 2013).

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If multiple bioindicators can demonstrate similarly precise and congruent spatial patterns of nutrients over a large-scale gradient, then other taxa, particularly as those from multiple trophic positions, may become useful proxies in areas where macroalgae are scarce, such as on reefs that are dominated by reef-building corals or turf algae (den Haan et al., 2014; Fulton et al, 2019). However, some of these bioindicators may not be directly comparable with others due to the way they take up and process nutrients internally or how other biophysical drivers could potentially influence their signatures (Raimonet et al., 2013; Viana & Bode, 2013; Clausing & Fong, 2016). In addition, species at different trophic levels have different $\delta^{15}\text{N}$ signatures due to isotopic fractionation (Boecklen et al., 2011). This may therefore impact the overall effectiveness of a suite of bioindicators, so additional measures are needed to directly compare their compatibility before they can be used for monitoring programs.

In this study, we investigated the precision and cost-effectiveness of a suite of eight potential bioindicators collected from coral reefs across the Inner Seychelles Islands for measuring nutrient regimes. The specific objectives of the study were to (1) quantify the precision of different bioindicators for measuring stable isotopic and elemental signatures of nitrogen and carbon, (2) determine how much variation exists within bioindicators across different coral reef sites which vary in ecological condition, (3) consider whether there is congruency between selected precise bioindicators based on their nitrogen (N)- and carbon (C)-based measurements, and (4) assess cost-effectiveness of using different bioindicators and the tasks involved.

148 **2. Methods**

149 *2.1 Study Sites and Sample Collections*

150 The inner Seychelles islands (43°S, 55°30'E) are comprised of high granitic islands with
151 well-developed carbonate fringing reefs (Littler et al., 1991; Dajka et al., 2019). Bioindicator
152 samples were collected from 21 coral reef sites around the populated islands of Mahé and
153 Praslin, between 11th – 22nd April 2017. These sites have been used as part of a 23-year
154 long-term coral reef monitoring survey, of the reefs of the Inner Seychelles Islands (Suppl.
155 Table 1; Graham et al., 2015; Wilson et al., 2019). The 21 reefs in this study were formed on
156 habitats of either granite, contiguous carbonate or patches that are surrounded by sand or
157 rubble. Twelve of these reefs were defined as “recovering” live coral from a mass bleaching
158 event in 1998, and nine as “regime-shifted” where macroalgae had proliferated (Wilson et al.,
159 2019). However, another mass bleaching event in 2016 caused mass coral mortality on the
160 recovering reefs (Wilson et al., 2019), and so here we define them as “coral-mortality” reefs.
161 Using nitrogen content of brown macroalgae collected from these sites, Graham et al. (2015)
162 also found that nutrient regimes are one of the key determinants of whether a reef can recover
163 or experience a regime shift after a major disturbance like bleaching.

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165 To assess the availability of potential bioindicators, eight replicate 7-m radius point counts
166 were surveyed along the reef slope at each site, and within each point count area, the percent
167 cover of benthic groups such as hard coral, soft coral, macroalgae, sand, rubble, and rock was
168 quantified using eight replicate 10m line-intercept transects (Wilson et al., 2019). Along each
169 transect, the distance of tape occupied by different benthic organisms and substrates was
170 recorded, including live hard coral, soft coral, macroalgae, sponge, cyanobacteria, zoanthids,
171 sand, rubble and rock. For the purpose of this study, the percent cover of dead hard coral and
172 rubble was pooled for an estimate of turf algae per site. Up to ten replicate samples of eight

173 different bioindicators (i.e. each replicate was a separate individual or sample) were collected
174 haphazardly using SCUBA from within the same area used for the benthic surveys on each
175 reef . However, there were not always ten available replicate samples at all sites, and some
176 reefs had none of some types at all. Bioindicators were selected based on their presence in
177 long-term benthic composition data and their use in previous nutrient enrichment and
178 bioindicator studies (Risk et al., 2001; Fichez et al., 2005; Cooper et al., 2009; Fabricius et
179 al., 2012). Bioindicators included whole fronds of mature foliose brown macroalgae with the
180 apical tips (*Sargassum* sp., Littler et al., 1991; Schaffelke, 1999), filamentous green
181 macroalgae (*Chlorodesmis* sp., Schaffelke, 1999), cyanobacteria (Ford et al., 2018), soft
182 corals (*Sarcophyton* sp., Fleury et al., 2000), turf algal matrix (Graham et al., 2018), sponges
183 (Demospongiae: Ward-Paige et al., 2005; Lamb et al., 2012), and zoanthids (*Palythoa* sp.,
184 Leal et al., 2017). For turf algae, branches of dead *Acropora* spp. coral densely covered in
185 turf algal assemblages were broken off and scraped with a scalpel to collect enough material
186 to make up ten replicate samples. Marine sediment (< 4 cm depth; Fichez et al., 2005;
187 Umezawa et al., 2008) which was considered as a non-biological indicator in this study, was
188 also collected to determine nutrient signatures as an important store of nutrients on coral
189 reefs. All samples were frozen at -20°C for up to one month.

190

191 ***2.2 Stable Isotopic and Elemental Analyses***

192 Sample processing and preparation for isotopic analyses were conducted between the
193 Seychelles Fishing Authority laboratory, Victoria, Mahé, Seychelles and Lancaster
194 Environment Centre, Lancaster University, UK. All frozen samples were defrosted, rinsed
195 thoroughly with distilled water and replicate samples were placed in a drying oven for ~48 hr
196 at 60°C.. Once dried, samples were each ground into a fine powder using a ball mill and
197 stored in individual airtight containers at SFA. All dried samples were weighed, alongside the

198 relevant standards (IAEA 600, cornflour, wheatflour and LEC flour), for stable isotopic
199 analyses at LEC. For bioindicators which contained inorganic carbon material (i.e. calcifying
200 organisms such as soft corals, sponges, and zoanthids), additional acidification was required
201 to remove the inorganic carbonate which can affect carbon-based signatures (Schlacher &
202 Connolly, 2014). ~10g of material was digested in 10% v/v hydrochloric acid (HCl) at room
203 temperature until all constituent carbonate had been removed. Samples were then centrifuged,
204 repeatedly washed until all traces of acidity had been removed, and left to dry prior to
205 analysis for carbon stable isotope composition. The carbon stable isotopic and elemental
206 signatures could not be measured in sediments in this study, because the samples were almost
207 entirely composed of inorganic carbon material, so almost all of the test sediment material
208 dissolved during initial runs of the acidification process. In addition, a subset of all calcified
209 samples were not acidified so that they could be used for nitrogen-based stable isotopic
210 signatures, as acidification can alter $\delta^{15}\text{N}$ signatures in some organisms (Schlacher &
211 Connolly, 2014).

212

213 Stable isotopic and elemental analyses for nitrogen stable isotopes ($\delta^{15}\text{N}$), carbon stable
214 isotopes ($\delta^{13}\text{C}$), nitrogen content (%N), carbon content (%C), and C:N Ratio (calculated from
215 dividing the values of %C over %N) were undertaken within the Lancaster Environment
216 Centre stable isotope facility, using an Isoprime100 Isotope Ratio Mass Spectrometer (IRMS)
217 linked to an Elementar VARIO MICROcube Elemental Analyser. Combustion of samples
218 within tin capsules at 950°C yielded N_2 and CO_2 for determination of $\delta^{15}\text{N}$ and $\delta^{13}\text{C}$
219 respectively. Analyses were standardised to AIR (for $\delta^{15}\text{N}$) and VPDB (for $\delta^{13}\text{C}$) using
220 internal reference materials calibrated to international standards. Within-run replication (1σ)
221 was $<0.3\text{‰}$ for $\delta^{15}\text{N}$ and $<0.1\text{‰}$ for $\delta^{13}\text{C}$ for both standards and samples.

222

223 ***2.3 Cost-Effectiveness Analyses***

224 To evaluate the cost-effectiveness of each of the techniques used to quantify the nutrient
225 signatures in the eight different bioindicators, the time taken for collection, processing and
226 analysis was calculated as follows. Collection time involved the time taken to search for and
227 retrieve samples from up to 21 sites, where the average time recorded for each dive was ~1 h.
228 Processing time included sample drying, crushing, weighing, and/or acidifying. Drying time
229 represented the time taken to completely dry each sample in the drying oven, while crushing
230 time was the time taken to crush each dried sample into a fine powder. For weighing, the
231 average time weighing standards for each mass spectrometric analysis was added to the time
232 taken to weigh each individual sample, and stable isotope analysis time represented the time
233 per analysis. The time taken to acidify each sample of the four calcified bioindicators was
234 also included, though these samples had to be run twice to obtain results for both N and C
235 signatures, with the first subset of samples unacidified, and the second subset acidified. All
236 recorded and calculated times were then standardised to hours (h). The time taken per unit
237 sample was used as a measure of “cost” instead of monetary value in this study, because the
238 methods used to collect, process and analyse them were the same, except for the carbonate-
239 containing samples which needed to be weighed and analysed twice.

240

241 ***2.4 Statistical Analyses***

242 Availability of the bioindicators was assessed in two ways. Firstly, the abundance of the
243 selected groups from the benthic composition data across the 21 sites was averaged and
244 pooled for the two different types of reef state. Secondly, the number of sites that the
245 different bioindicator types were collected from were totalled and categorised according to
246 reef state (i.e. coral-mortality or regime-shifted). The percentage of sites from which each
247 bioindicator was collected, relative to each reef state (i.e. out of 12 for coral-mortality reefs,

248 and out of 9 for regime-shifted reefs), was calculated, as there were different numbers in each
249 category. The mean and standard deviation of the five nutrient signatures ($\delta^{15}\text{N}$, $\delta^{13}\text{C}$, %N,
250 %C and C:N Ratio) from samples of each bioindicator, collected from up to 21 sites, were
251 then analysed in R (R-Core-Team 2018).

252

253 The spatial variation for nutrient signatures of each bioindicator was assessed across all
254 available sites using generalized linear models (GLM). All model fits were inspected for
255 normality using visual plots, and GLMs were used on those with non-normal distributions. A
256 GLM was used to determine the impact of the bioindicator, reef state and individual site on
257 the five nutrient signatures (i.e. the response variables), using the following model for each
258 individual signature:

259 Model 1: Nutrient Signature \sim Bioindicator + Reef State + Site

260 Where the nutrient signature was either $\delta^{15}\text{N}$, $\delta^{13}\text{C}$, %N, %C and C:N Ratio, and bioindicator
261 (eight levels), reef state (two levels) and site (up to 21 levels) as fixed factors for each of the
262 five response variables, (C-based signatures in sediment were omitted, as there was no data
263 available). A total of 37 models were therefore run for the overall analysis ($\alpha = 0.05$).

264

265 The coefficient of variation (CoV) was used to calculate the overall precision of each
266 bioindicator across all available sites. CoV is the ratio of the sample standard deviation to the
267 same mean, for a given set number of data points, and was used in this study because it is a
268 unitless measure of variation, which is useful when testing the statistical effectiveness (i.e.
269 precision) of the signatures across the different bioindicators. High precision is defined in this
270 study as a small standard deviation compared to the mean, which increases the ability to
271 detect statistical significance, both between the replicate samples of each bioindicator
272 collected at each site, and over all the sites from which each bioindicator was collected. Low

273 precision, conversely, is a large standard deviation compared to the mean (Conquest, 1983).
274 Though there is not one set standard in the literature, it is generally assumed that values of
275 $\text{CoV} < 10$ can be regarded as “precise”. CoV was calculated from the raw measurements
276 detected in the replicate samples of each bioindicator collected from individual sites.
277 Following this, the CoV of the N- and C-based signatures were compared across all the sites
278 from which each bioindicator was collected with five linear models (Model 2), which were
279 run separately for each nutrient signature:

280 Model 2: $\text{CoV} \sim \text{Bioindicator} + \text{Reef State} + \text{Site}$

281 Where CoV was the CoV value for $\delta^{15}\text{N}$, $\delta^{13}\text{C}$, %N, %C and C:N Ratio, and Bioindicator
282 (eight levels), reef state (two levels) and site (up to 21 levels) were the fixed factors. The
283 overall mean and standard deviation for the CoV each bioindicator were also summarised in
284 box-plots.

285

286 A principal components analysis (PCA) (PRIMER-E Ltd, V.6.1.5, Plymouth, UK) based on a
287 Bray–Curtis similarity matrix was used to visualise the similarities between averaged values
288 of the five different nutrient measurements and the different bioindicators as a way of
289 assessing the level of congruency of the bioindicators (Clarke & Warwick, 2001). The
290 selection of a subset of bioindicators for this analysis (brown macroalgae, green macroalgae
291 and zoanthids) was based on their level of precision, and the number of sites used, out of 21,
292 depended upon the availability of each of these three indicators. Therefore nine sites were
293 selected, as they had sufficient replicates of all three bioindicators to compare across sites
294 ($n=4$), and the nutrient measurements were averaged at site level to compensate for the
295 varying numbers of replicate samples available at each site. However, for C-based signatures,
296 zoanthid samples from one site could not be acidified due to limited material so for these,
297 eight sites were used. A correlation matrix was also constructed to assess the different

298 correlation values between the three selected indicators, where a p-value < 0.05 was
299 considered significant.

300

301 To statistically assess the cost-effectiveness of each bioindicator, another GLM was used (as
302 the data was not normally distributed) to compare the average times taken (per sample per
303 bioindicator) for (a) collecting from the field, (b) drying and crushing of samples, (c)
304 weighing and preparing samples (i.e. acidification) for isotopic analyses, and (d) running
305 isotopic analyses. In this model, “Time” was the response variable, and “Bioindicator” and
306 “Task” were the fixed factors (eight and two levels in each factor, respectively):

307 Model 3: Time ~ Bioindicator * Task

308 The interaction between these two fixed factors in Model 3 was also analysed to determine
309 whether the “Bioindicator” (eight levels), “Task” (4-5 levels, depending on whether or not
310 the bioindicator was acidified), or the interaction between them affects the time per unit
311 sample. Reef State was also used as a fixed factor (with two levels) during initial statistical
312 analyses, but was not included in this study as it showed no significant effect.

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323 **3. Results**

324 ***3.1 Sample Collection and Benthic Cover***

325 Across the 21 sites, a total of 150 samples of brown macroalgae (*Sargassum* sp.), 91 green
326 macroalgae (*Chlorodesmis* sp.), 103 cyanobacteria, 59 soft corals, 112 sponges, 134
327 zoanthids (*Palythoa* sp.), 171 turf algal assemblages, and 204 sediment samples were
328 collected. Availability of bioindicator varied between regime-shifted and coral-mortality
329 reefs, as did the percentage of sites within these two categories where they were present
330 (*Table 1*). Average cover of *Sargassum* sp. was significantly higher at the regime-shifted sites
331 where it was an order of magnitude greater than on the coral-mortality sites. As such, there
332 were specimens available at 100% of the regime-shifted sites, whereas they were only found
333 at 58% of regime-shifted reefs. There was a similar percent cover of sediment across sites
334 (along the line-intersect transect) regardless of reef state, and sediment samples were
335 collected from all 21 sites. Percent cover of turf algae on coral-mortality reefs was $32.8 \pm$
336 23.8% , compared to $12.2 \pm 8.11 \%$ on regime-shifted reefs, but still had 100% availability in
337 both reef states. Cyanobacteria, soft coral and sponge all had higher percent cover and were
338 also present on a higher percentage of coral-mortality sites than on regime-shifted ones.

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348 **Table 1.** Summary table for percent cover (% cover) of candidate bioindicators (BM = brown macroalgae; CYB
 349 = Cyanobacteria; GM = Green Macroalgae; SED = Sediment; SC = Soft Coral; TA = Turf Algae; ZO =
 350 Zoanthid) from the line-intercept transect surveys at 21 coral reefs around the Inner Seychelles Islands.
 351 Percentage of Sites represents the percentage of sites relative to the total number in each reef state (out of n=12
 352 for “coral-mortality” reefs versus n=9 “regime-shifted” reefs). Mean ± S.D for percent cover.

353

Bioindicator	Regime-Shifted Reefs (n=9)		Coral-Mortality Reefs (n=12)	
	Mean ± S.D. (%)	Percentage of Sites (%)	Mean ± S.D. (%)	Percentage of Sites (%)
<i>Sargassum</i> (BM)	36.9 ± 20.3	100	2.7 ± 8.47	58
Cyanobacteria (CYB)	1.2±2.8	44	2.5 ± 5.0	75
<i>Chlorodesmis</i> (GM)	0.2 ± 0.3	89	0.3 ± 0.4	25
Soft Coral (SC)	0.1 ± 0.8	11	1.2 ± 2.5	67
Sediment (SED)	6.7± 3.4	100	9.52 ± 11.5	100
Sponge (SP)	0.00*	56	1.4 ± 2.1	75
Turf Algae (TA)	12.2 ± 8.1	100	32.8 ± 23.8	100
<i>Palythoa</i> (ZO)	0.2 ± 0.4	67	1.3 ± 1.0	100

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363 3.2 *Spatial Variation of Nutrient Signatures in Bioindicators*

364 The type of bioindicator had variable effects on each of the five nutrient signatures. Overall,
365 brown and green macroalgae (BM and GM, respectively) not only had lower average $\delta^{15}\text{N}$
366 signatures than the other indicators, but they also had the smallest variations in signatures
367 across all of their sites (5.58 ± 0.82 and $5.33 \pm 0.45\text{‰}$, respectively. *Fig. 1a*). Bioindicators
368 representing higher trophic levels, such as sponges (SP), soft corals (SC), and zoanthids (ZO)
369 (7.51 ± 0.67 ; 7.61 ± 1.27 , and $9.08 \pm 0.88\text{‰}$, respectively) had more enriched average $\delta^{15}\text{N}$
370 signatures, as did sediment (SED) ($9.61 \pm 1.41 \text{‰}$). After acidification, the four bioindicators
371 that contained inorganic carbon (soft corals, sponges, and turf algae (TA)) showed similar
372 signatures of $\delta^{13}\text{C}$ on average (-16.3 ± 1.29 ; -17.4 ± 0.38 ; and $-18.5 \pm 3.16 \text{‰}$, respectively),
373 though it was less negative in zoanthids ($-13.7 \pm 0.88 \text{‰}$). The two types of macroalgae also
374 differed (BM: -16.2 ± 1.58 , and GM: $-21.3 \pm 0.96 \text{‰}$) whereas cyanobacteria (CYB) ($-21.3 \pm$
375 3.36‰) was similar to green macroalgae (*Fig. 1b*).

376

377 Turf algae had a similar average signature for %N ($1.53 \pm 0.45\text{‰}$) relative to brown
378 macroalgae ($1.10 \pm 0.18 \text{‰}$) but green macroalgae had a much higher value ($4.32 \pm 0.48 \text{‰}$),
379 which was even higher than cyanobacteria ($3.31 \pm 1.25 \text{‰}$). The N content of brown
380 macroalgae was also most similar to zoanthids ($1.06 \pm 0.22 \text{‰}$). N content was also much
381 lower in sediment ($0.05 \pm 0.11 \text{‰}$) (*Fig. 1c*). There was much higher C content in green
382 macroalgae than in the other bioindicators ($42.2 \pm 2.40 \text{‰}$), followed by brown macroalgae
383 ($31.0 \pm 1.41 \text{‰}$), and cyanobacteria ($28.7 \pm 5.52 \text{‰}$). Zoanthids had the lowest %C ($11.2 \pm$
384 2.74) (*Fig. 1d*). Brown macroalgae had higher C:N Ratio signatures with a large range due to
385 high %C content and low %N content (28.8 ± 4.99). The other five groups were quite similar
386 to one another, with the exception of sponge (0.85 ± 0.11) (*Fig. 1e*).

387

388 The GLMs showed that the type of bioindicator had a strong influence on the variability of
389 nutrient signatures, with significance evident across almost all signatures. However, both
390 types of macroalgae were statistically similar for $\delta^{15}\text{N}$, as were brown macroalgae, turf algae
391 and zoanthid for %N (Suppl. Table 2). However, the effect of reef state varied among both
392 bioindicators and nutrient signatures. For instance, differences in $\delta^{15}\text{N}$ signatures in BM
393 ($p=0.0002$), CYB ($p=0.002$), GM ($p<0.0001$), SED ($p=0.01$), TA ($p=0.02$) and ZO
394 ($p<0.0001$) were significant, whereas the difference in %N for GM between reef states was
395 not ($p=0.93$). Reef state was also significantly different for $\delta^{13}\text{C}$ in cyanobacteria ($p=0.002$),
396 green macroalgae ($p < 0.0001$), sediment ($p=0.01$), turf algae ($p=0.02$) and zoanthids
397 ($p<0.0001$). For %N, reef state also significantly differed in BM ($p < 0.0001$), CYB
398 ($p<0.0001$) and ZO ($p=0.04$). For %C, reef state differed significantly for CYB ($p<0.0001$)
399 and ZO ($p=0.01$), and for C:N Ratio, only BM ($p=0.04$) and TA ($p=0.0002$) differed
400 significantly.

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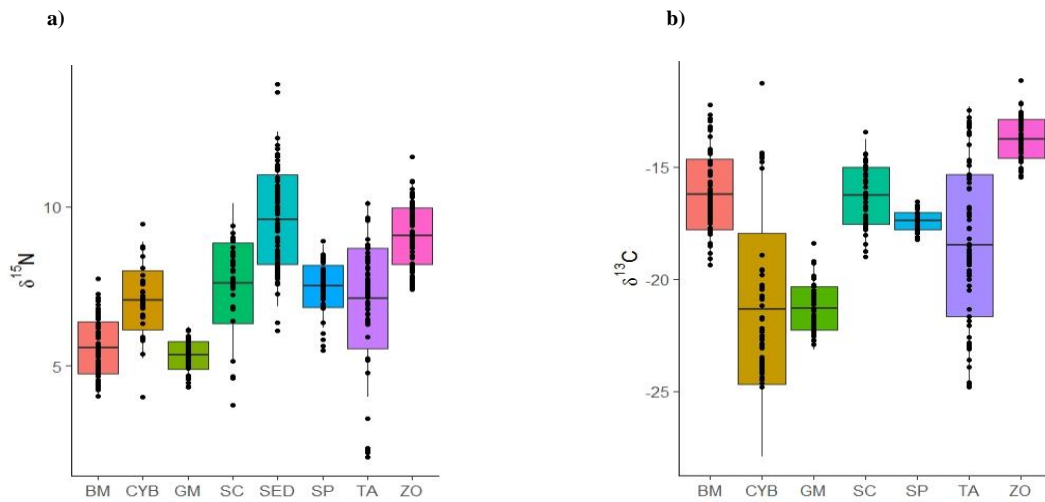
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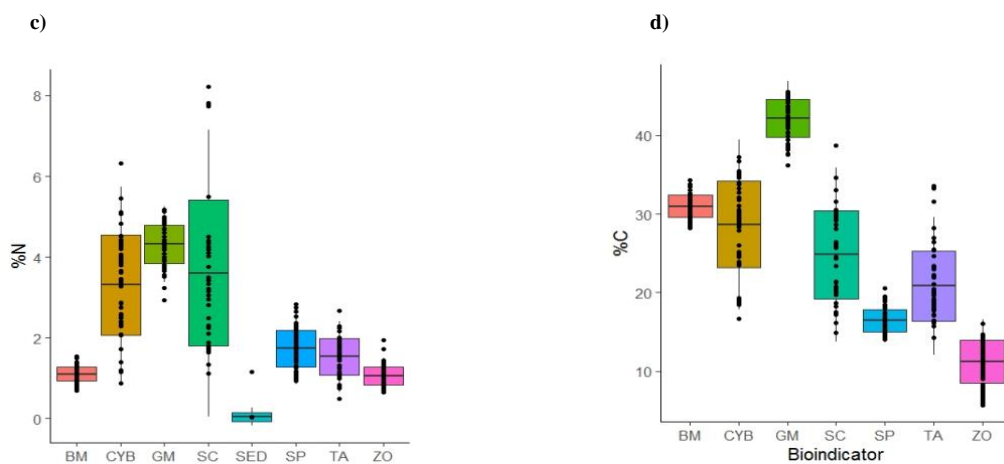
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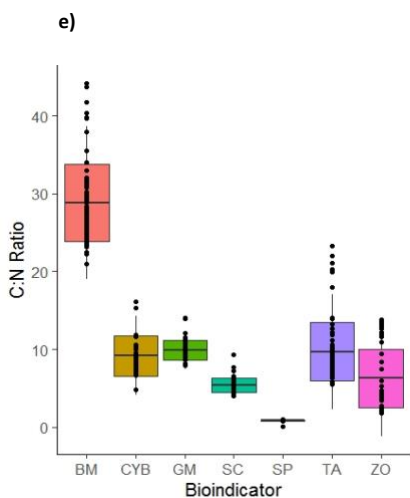


Figure 1. Box (median and 50% quantile) and whisker (95% quantile) plots of the variation of the average values of nutrient signatures measured in the eight bioindicators for (a) $\delta^{15}\text{N}$, (b) $\delta^{13}\text{C}$, (c) %N, (d) %C and (e) C:N Ratio from up to 21 reefs. Each black dot represents the average value from an individual site that each bioindicator was collected from to also show the spread of variation within each bioindicator (BM = Brown Macroalgae; CYB = Cyanobacteria; GM = Green Macroalgae; SED = Sediment; SC = Soft Coral; SP = Sponge; TA = Turf Algae, and ZO = Zoanthid).

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434

435 3.3 Precision of Bioindicators

436 The precision of the bioindicators was assessed using CoV, as this standardised the nutrient
437 signatures between bioindicators (including the non-biological indicator sediment) and
438 controlled for differences in isotopic fractionation in measurements, particularly between
439 trophic levels. Green macroalgae had the lowest and most consistent CoV within and across
440 reefs, and therefore the highest precision for all N-based nutrient measurements ($\delta^{15}\text{N}$: $2.47 \pm$
441 0.95 ; %N: 7.53 ± 4.29 ; C:N Ratio: 5.76 ± 5.39), however this pattern was not as distinct for
442 C-only signatures ($\delta^{13}\text{C}$: -1.87 ± 1.06 and %C: 3.60 ± 1.67) (Fig. 2). This was closely
443 followed by brown macroalgae ($\delta^{15}\text{N}$: 4.68 ± 1.33 ‰; $\delta^{13}\text{C}$: -6.03 ± 3.12 ; %N: 11.3 ± 4.07 ;
444 %C: 4.07 ± 1.12 , and C:N Ratio: 9.92 ± 3.75). Turf algal assemblages had much more
445 variable average signatures for all five measures, especially those that were N-based ($\delta^{15}\text{N}$:
446 8.30 ± 4.90 ; $\delta^{13}\text{C}$: $-5.14 \pm$; %N: 20.5 ± 20.1 ; %C: 9.54 ± 10.6 , and C:N Ratio: 10.6 ± 10.3).
447
448 Zoanthids had lower average CoV values for N-based signatures than higher trophic
449 organisms and were more similar to the two macroalgal types ($\delta^{15}\text{N}$: 2.98 ± 1.20 , and %N:
450 14.3 ± 5.52), as well as for $\delta^{13}\text{C}$ (-5.14 ± 2.43), though the CoV values for both %C and C:N
451 Ratio were much higher than for any of the other bioindicators (11.8 ± 8.57 and 20.0 ± 24.1 ,
452 respectively). The other higher trophic level organisms, such as soft corals ($\delta^{15}\text{N}$: 6.26 ± 4.87 ;
453 $\delta^{13}\text{C}$: -6.20 ± 1.86 ; %N: 30.4 ± 17.6 ; %C: 17.4 ± 12.2 , and C:N Ratio: 11.6 ± 8.68) and
454 sponges ($\delta^{15}\text{N}$: 6.82 ± 5.24 ; $\delta^{13}\text{C}$: -1.44 ± 1.08 ; %N: 20.0 ± 10.3 ; %C: 7.24 ± 3.94 , and C:N
455 Ratio: 7.58 ± 12.1) showed inconsistent levels of precision across the five signatures. Though
456 sediment had similar precision for $\delta^{15}\text{N}$ to the other candidates (7.97 ± 3.90), it had the
457 highest range of CoV values for %N (17.4 ± 40.2) (Fig. 2a).

458

459 Overall, the CoV analyses showed that both brown and green macroalgae had low average
460 CoV values for N-based signatures, as well as small variations in CoV across the sites. In
461 addition, while the C-based signatures were more variable for zoanthids, the N-based results
462 were more precise compared to the other higher-trophic bioindicators. There was also no
463 overall significant effect of reef state or site-level variation on CoV for any of the five
464 nutrient signatures, suggesting that precision did not vary over different spatial scales or
465 between the coral-mortality and regime-shifted reefs. The statistical models showed variable
466 patterns for each nutrient signature type across the eight bioindicators, however for %C and
467 C:N Ratio, zoanthids were the only bioindicator that significantly differed from brown
468 macroalgae due to its high variation (Suppl. Table 3).

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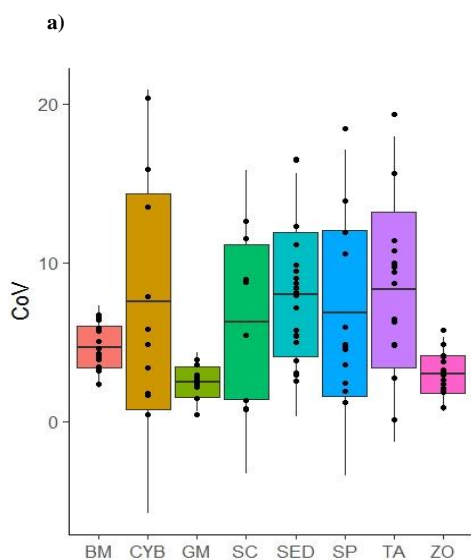
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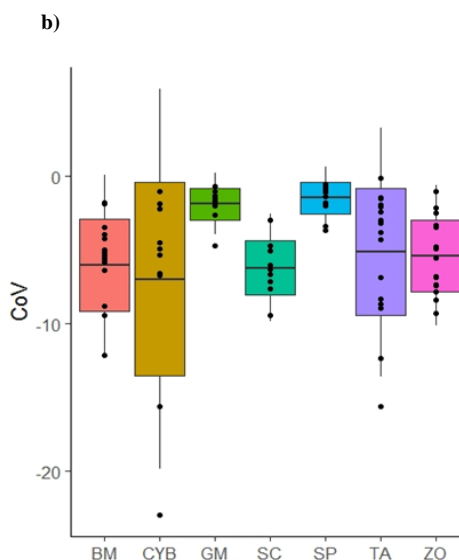
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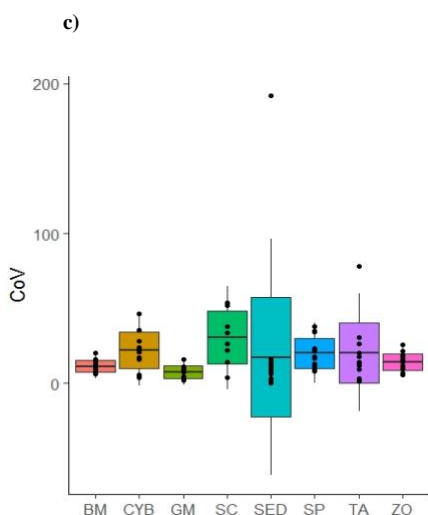
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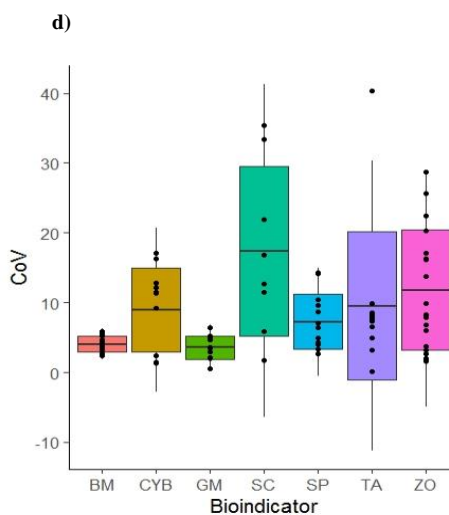
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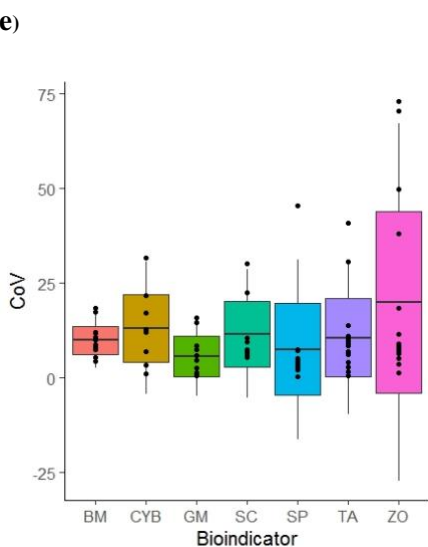


Figure 2. Box (median and 50% quantile) and whisker (95% quantile) plots of the spread of the coefficient of variation (CoV) of the eight bioindicators for (a) $\delta^{15}\text{N}$, (b) $\delta^{13}\text{C}$, (c) %N, (d) %C and (e) C:N Ratio up to 21 reefs (mean \pm S.D.). Each black dot represents the average CoV from the individual sites from which each bioindicator was collected to also show the spread of variation within- and among sites (BM = Brown Macroalgae; CYB = Cyanobacteria; GM = Green Macroalgae; SED = Sediment; SC = Soft Coral; SP = Sponge; TA = Turf Algae, and ZO = Zoanthid). CoV for each nutrient measurement in each bioindicator collected from each site was calculated by the ratio of standard deviation to the mean of a given number of replicate data points (i.e. up to 5 samples per indicator per site).

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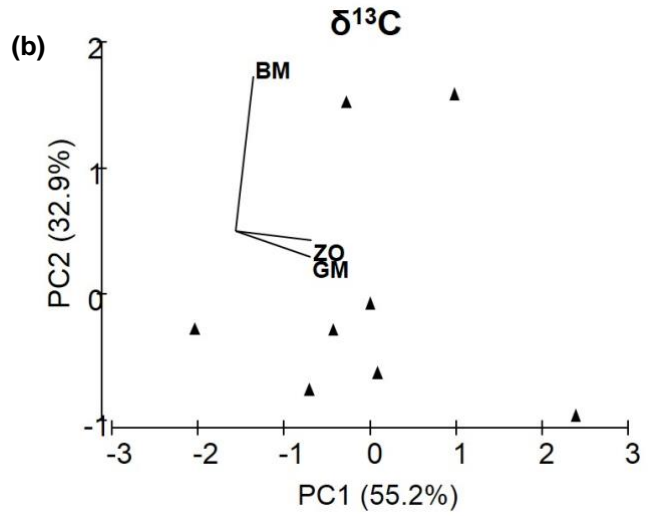
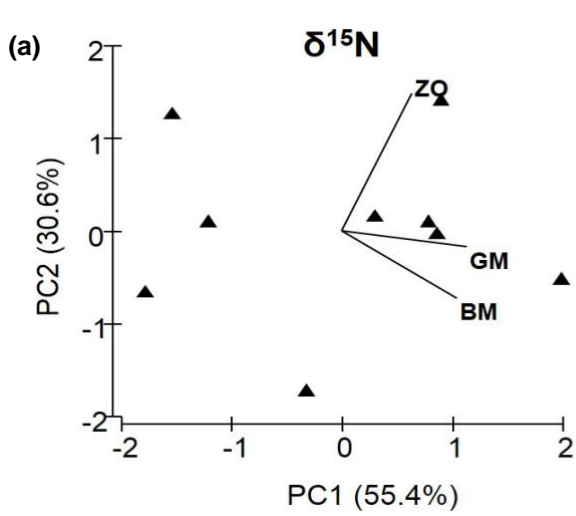
505 **3.4. Congruency of Bioindicators**

506 A principal components analysis (PCA) was used to assess congruency between the three
 507 selected bioindicators. Brown and green macroalgae had low correlation, especially for
 508 signatures of N, while zoanthids had no significant relationships with either macroalgae.
 509 There were weak positive relationships between N-based signatures of green and brown
 510 macroalgae (Table 2), but these explain <40% of the variance and are not significant at alpha
 511 =0.05 (Fig. 3). This was also shown by Pearson’s correlation analyses between the different
 512 combinations of bioindicators (Table 2). The two types that showed the highest similarity for
 513 N-based signatures were between brown and green macroalgae for C:N Ratio measurements
 514 ($r^2 = 0.61$), closely followed for those of %N ($r^2 = 0.60$) and $\delta^{15}\text{N}$ ($r^2 = 0.55$) signatures,
 515 though none of these were significantly correlated. However, the highest similarity for C-only
 516 signatures was between %C of brown and green macroalgae ($r^2 = 0.81$), but was very low for
 517 $\delta^{13}\text{C}$ ($r^2 = 0.041$) (Table 2).

518
 519 **Table 2.** Pearson’s correlation analyses between the three selected bioindicators (brown macroalgae
 520 versus green macroalgae; brown macroalgae versus zoanthids; green macroalgae versus zoanthids) to
 521 determine amount of correlation between them (correlation coefficient) The significance level for the
 522 p-values is alpha = 0.05.

523

<i>Bioindicator</i>	$\delta^{15}\text{N}$	$\delta^{13}\text{C}$	%N	%C	C:N Ratio
<i>BM vs. GM</i>	0.55 (p=0.12)	0.041 (p=0.92)	0.60 (p=0.09)	0.81 (p=0.02)	0.61 (p=0.08)
<i>BM vs. ZO</i>	0.10 (p=0.79)	0.11 (p=0.80)	0.18 (p=0.64)	-0.005 (p=0.99)	0.07 (p=0.68)
<i>GM vs. ZO</i>	0.28 (p=0.47)	0.64 (p=0.09)	0.23 (p=0.55)	-0.23 (p=0.58)	-0.36 (p=0.34)



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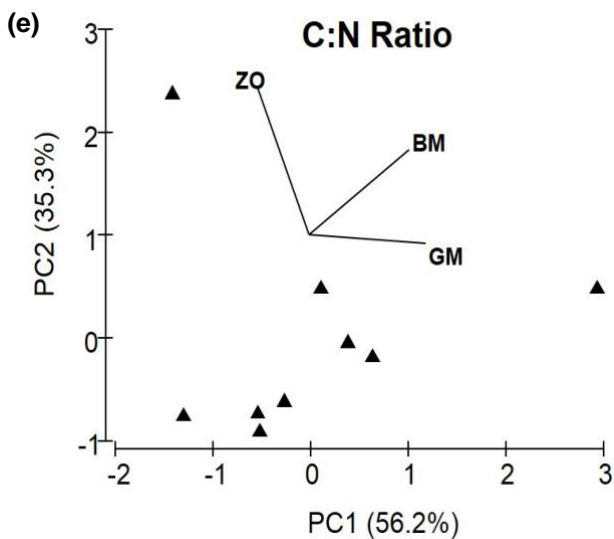
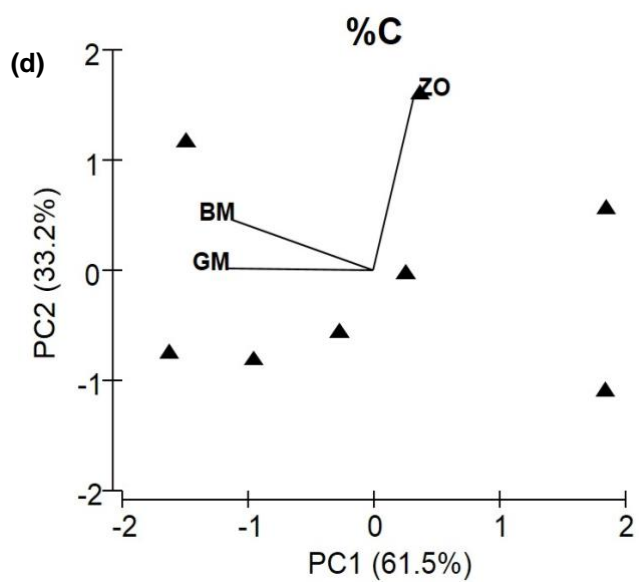
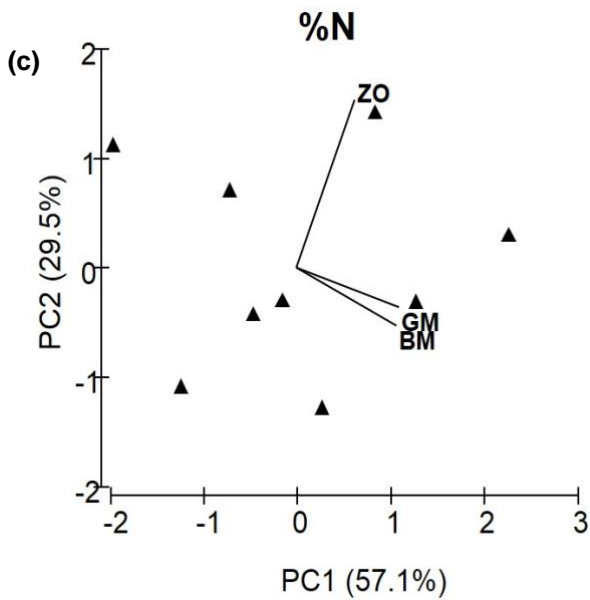


Figure 3. Principal Components Analyses (PCA) quantifying congruency between a selection of bioindicators ($n=3$) (BM = Brown Macroalgae; GM = Green Macroalgae; ZO = Zoanthids) all present at a subset number of sites ($n=9$) for measurements of (a) $\delta^{15}\text{N}$, (b) $\delta^{13}\text{C}$, (c) %N, (d) %C and (e) C:N Ratio.

534 **3.5 Cost-Effectiveness of Bioindicators**

535 The time taken for the whole process, from collection to stable isotopic analyses, per unit
536 sample, differed among the eight bioindicators (Table 3; Suppl. Table 4). The GLMs
537 suggested that both bioindicator and task can have a significant effect on the time taken, per
538 sample, to use each bioindicator for capturing measure nutrient regimes, but reef state does
539 not. Overall, it took a similar amount of time to collect the two macroalgae and
540 cyanobacteria, whereas soft corals, sponges, turf algae and zoanthids took significantly longer
541 to find. Sediment, in contrast, took the least time overall to find and collect (Table 3). Each
542 task differed significantly as well, with “Drying and Crushing” taking the most time to
543 complete and “Field Collection” took the least time, but significance varied between the
544 bioindicators. The time taken to process the four calcified bioindicators was much greater,
545 because each sample of these indicators required the additional step of “Acidification”.

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559 **Table 3.** Summary of the mean time taken (per unit sample, per hour) for each task undertaken to process each
 560 bioindicator for the cost-effectiveness. *Acidifying only includes the four bioindicators that were acidified, and
 561 thus weighed and analysed in the mass spectrometer. Significance Level is $p < 0.05$. Normality inspected using
 562 visual plots. Mean \pm S.D.

<i>BIOINDICATOR</i>	<i>FIELD COLLECTION</i>	<i>DRYING & CRUSHING</i>	<i>ACIDIFICATION</i>	<i>WEIGHING</i>	<i>STABLE ISOTOPIC ANALYSES</i>
Brown Macroalgae (BM)	0.038 \pm 0.04 ($p < 0.0001$)	24.8 \pm 0.5 ($p < 0.0001$)	-	1.5 \pm 0.01 (N/A)	0.18 \pm 0.03 ($p < 0.0001$)
Cyanobacteria (CYB)	0.35 \pm 0.4 ($p = 0.52$)	23.2 \pm 1.4 ($p < 0.0001$)	-	1.5 \pm 0.03 (N/A)	0.21 \pm 0.1 ($p = 0.93$)
Green Macroalgae (GM)	0.078 \pm 0.08 ($p = 0.86$)	24.1 \pm 0.005 ($p = 0.26$)	-	1.5 \pm 0.01 (N/A)	0.17 \pm 0.05 ($p = 0.98$)
Soft Coral (SC)	0.25 \pm 0.3 ($p = 0.001$)	22.2 \pm 1.2 ($p < 0.0001$)	0.17 \pm 0.001 ($p < 0.0001$)	3.1 \pm 0.06 ($p = 0.95$)	0.48 \pm 0.2 ($p = 0.004$)
Sediment (SED)	0.015 \pm 0.003 ($p = 0.0002$)	22.7 \pm 1.2 ($p = 0.05$)	-	0.14 \pm 0.02 (N/A)	0.25 \pm 0.1 ($p < 0.0001$)
Sponge (SP)	0.24 \pm 0.3 ($p = 0.0006$)	22.6 \pm 1.3 ($p < 0.0001$)	0.17 \pm 0.0 ($p < 0.0001$)	3.1 \pm 0.00 ($p = 0.89$)	0.37 \pm 0.07 ($p = 0.002$)
Turf Algae (TA)	0.03 \pm 0.04 ($p = 0.0002$)	24.6 \pm 0.5 ($p = 0.0003$)	0.17 \pm 0.002 ($p < 0.0001$)	3.0 \pm 0.02 ($p = 0.98$)	0.34 \pm 0.08 ($p = 0.0005$)
Zoanthids	0.18 \pm 0.2 ($p < 0.0001$)	23.0 \pm 1.5 ($p < 0.0001$)	0.17 \pm 0.0 ($p < 0.0001$)	3.0 \pm 0.00 (N/A)	0.41 \pm 0.03 ($p = 0.0004$)

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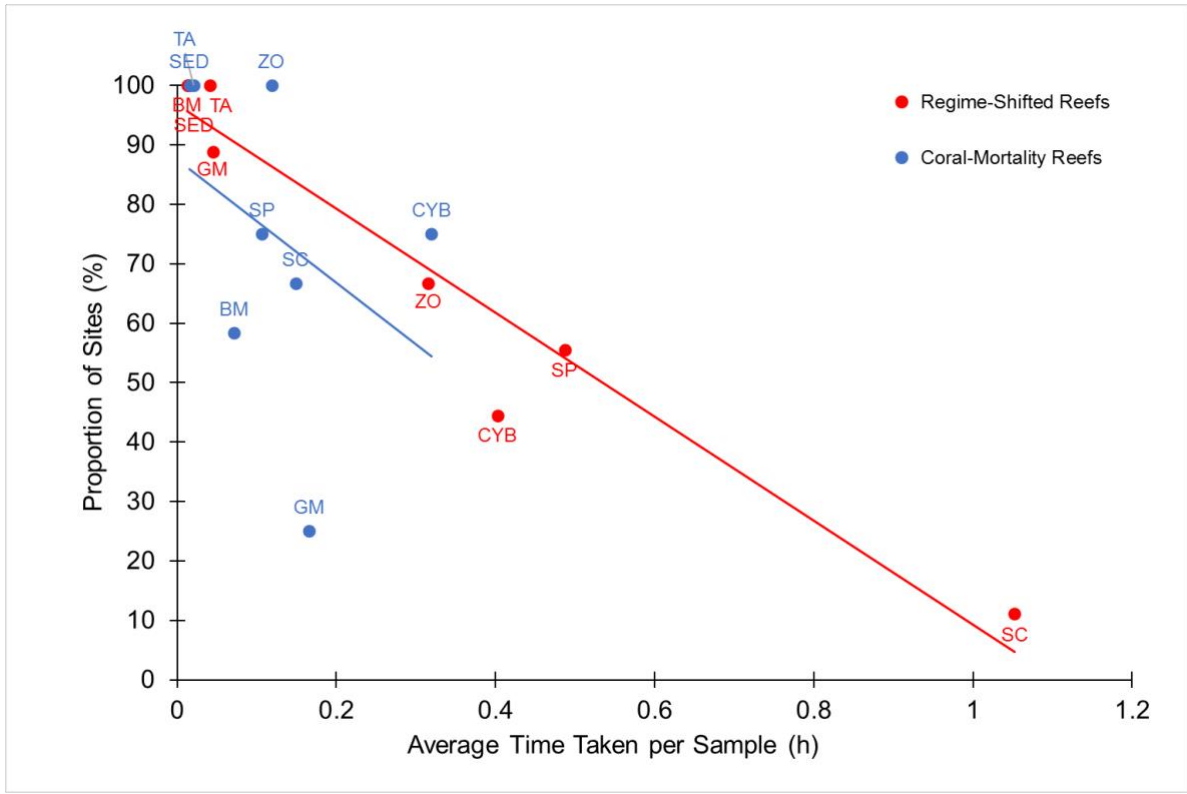
565 Although the time taken per sample to collect each bioindicator from the field did not differ
 566 between reef states, the availability of samples on the different reef did (*Table 1*). There was
 567 a strong negative correlation between average time taken per sample to collect and the
 568 percentage of sites from which each indicator was available on regime-shifted reefs (relative
 569 to the total number of sites, i.e. $n = 9$) ($r^2 = 0.94$), whereas there was a very weak negative
 570 relationship between average time taken and sample availability on coral-mortality sites ($r^2 =$
 571 0.15 ; $n = 12$) (*Fig. 4*). This suggests that although the time taken varied more among
 572 bioindicators on regime-shifted reefs (i.e. it took over an hour, on average, to find one sample
 573 of soft coral), it is a better predictor for finding specific bioindicator(s) on sites dominated by
 574 macroalgae. For coral-mortality reefs, in contrast, the times among bioindicators were more
 575 similar, but sample availability was more variable. Brown macroalgae had similar collections
 576 times between reef states (regime-shifted: 0.01 ± 0.01 ; coral-mortality: 0.07 ± 0.05 h), but

577 there was 100% availability on regime-shifted sites relative to 58% on coral-mortality sites.

578 Turf algae and sediment, in contrast, not only had 100% availability on both reef states, but

579 they took the least time to collect .

580



581

582 **Figure 4.** The relationships between the average time taken, per unit sample (h) and the availability of samples
583 on both reef states. Each individual point in red represent the total average time, per sample, for the eight
584 bioindicators collected from regime-shifted sites versus the percentage of sites they were available to collect at
585 (n=12), and the individual point in blue represented each indicator from coral-mortality sites. $r^2 = 0.94$ on
586 regime-shifted reefs, and $r^2 = 0.15$ on coral-mortality reefs. BM = Brown Macroalgae; CYB = Cyanobacteria;
587 GM = Green Macroalgae; SED = Sediment; SC = Soft Coral; SP = Sponge; TA = Turf Algae, and ZO =
588 Zoanthid.

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596 **4. Discussion**

597 The principal aims of this study were to identify precise, cost-effective, and congruent
598 bioindicators for capturing nutrient regimes on coral reefs, particularly over those in different
599 ecological conditions. Overall, nutrient signatures of brown macroalgae, green macroalgae
600 and zoanthids were considered to meet these criteria, relative to the other candidates. While
601 the macroalgae were more consistent indicators for reefs that have undergone a regime shift,
602 zoanthids were more common on both types of reef state. Turf algae and sediment took the
603 least time to collect and were also the most abundant and available samples across the 21
604 reefs studied, regardless of reef state, but their utility as indicators is limited by their highly
605 variable CoV values. There was low congruency between the three most precise indicators
606 (brown macroalgae, green macroalgae and zoanthids), which suggested that physiological
607 processing of nutrients within each bioindicator has a greater influence on N- and C-based
608 signatures than its local environment. Congruency between multiple taxa could be improved
609 by either choosing a suite of indicators from the same functional group, such as macroalgae
610 with comparable nutrient uptake mechanisms, or by tracing the accumulation of nutrient
611 signatures across different trophic levels from the same food chain.

612

613 ***4.1 Spatial Variation, Precision and Congruency of Nutrient Signatures in Bioindicators***

614 The N- and C-based nutrient signatures of the bioindicators in the current study appear
615 typical of measurements reported in the literature (Atkinson & Smith, 1983; Smit, 2001). For
616 instance, the range of absolute values of $\delta^{15}\text{N}$ signatures in all of the bioindicators are quite
617 consistent (5 – 10 ‰), though they are slightly high relative to other marine systems (Sigman
618 & Casciotti, 2001). In addition, the $\delta^{13}\text{C}$ signatures reflect that of a carbonate-dominated
619 system, which for instance lies within the range of -10 to -30‰ for most marine macrophytes
620 (Smit, 2001; Raven et al., 2002). The N-based signatures also follow trophic status whereby

621 those organisms at higher trophic levels are relatively more enriched than those of primary
622 producer status (Boecklen et al., 2011; Lamb et al., 2012)..
623
624 Spatial variation of the different nutrient signatures, both within- and among-reefs, varied
625 widely across the inner Seychelles. The N-based signatures also showed a significant
626 difference between coral-mortality and regime-shifted reefs for a number of the bioindicators,
627 including $\delta^{15}\text{N}$ in the two macroalgae and zoanthids, whereas signatures tended to be more
628 similar across sites for the C-based signatures. Being able to capture variability in nutrient
629 regimes, especially across different spatial scales or even different reef states, is another
630 important aspect of a good bioindicator (Cooper et al., 2009), so this study provides
631 supporting evidence that $\delta^{15}\text{N}$ and %N are particularly effective proxies of nutrient regimes
632 (Lin & Fong, 2008). For instance, Littler et al., (1991) found that nutrient concentrations in a
633 number of algal species were generally higher on reefs around the high granitic, populated
634 islands like Mahe and Praslin, relative to the low, remote carbonate atolls in the wider
635 Seychelles Archipelago. In a related study in Vaughan et al. (2021), the use of macroalgal
636 $\delta^{15}\text{N}$ helped to determine that the dead coral tissue released into the water column after the
637 2016 coral bleaching event in the Seychelles may have been subsequently taken up and
638 retained by *Sargassum* on the coral-mortality reefs. However, the high variability shown
639 across nutrient signatures in the current study, particularly in $\delta^{15}\text{N}$, may not be solely due to
640 differences in local sources of nutrients. Other studies, for example, have found that
641 differences in signatures are not always consistent with distinct sources of nutrient loads (i.e.
642 in areas with known anthropogenic run-off), which implied that external inputs are not
643 always the cause of variations in nutrient regimes captured in bioindicators (Raimonet et al.,
644 2013; Viana & Bode, 2013).

645

646 There were discrepancies found in some of the signatures even between different primary
647 producers in this study, such as between brown (*Sargassum sp.*) and green macroalgae
648 (*Chlorodesmis sp.*). For instance, although they had similar $\delta^{15}\text{N}$ values across the sites, the
649 other four signatures varied on average between these two bioindicators, particularly for %N,
650 which was much higher in green macroalgae, although it was similar between reef states (*Fig.*
651 *2a&c*). This could be because nitrogen content in *Chlorodesmis* is affected by both biological
652 nutrient uptake mechanisms and environmental factors (Fong et al., 2001; Raimonet et al.,
653 2013; Viana & Bode, 2013; Clausing & Fong, 2016), and therefore do not reflect either
654 inorganic concentrations or the $\delta^{15}\text{N}$ of their surrounding environment (Viana & Bode, 2013).
655 Slower-growing algal species like *Chlorodesmis* have a greater capacity for internal nutrient
656 storage so are not as nutrient-limited, and therefore are less responsive to fluctuations in
657 nutrients as other, more opportunistic species like *Sargassum* (Schaffelke., 1999; García-
658 Seoane et al., 2018a&b).

659

660 Zoanthids are positioned at a higher trophic level than benthic algae so their nutrient
661 signatures tend to fractionate and become more enriched (*Fig. 1a*; Zanden & Rasmussen,
662 2001; Fox et al., 2018). There has been little research into zoanthids as potential indicators of
663 nutrient runoff (Leal et al., 2017), but Costa Jr. et al. (2008) found that phosphorus and silica
664 water concentrations had positive effects on both algal and zoanthid growth, and negative
665 effects on coral cover. However, unlike primary producers, zoanthids have to balance auto-
666 and heterotrophic processes for acquiring sources of C and N (Smit, 2001; Leal et al., 2017)
667 because, like scleractinian corals, they have photosynthetic symbionts in their tissues (Hoegh-
668 Gulberg et al., 2004; Fox et al., 2018). This could explain the large variations in %C and
669 C:N Ratio, both within- and among-reefs in this study (*Fig. 2d &e*; Suppl. Table 2), as they
670 represent the combined signatures from both host and symbiont (Leal et al., 2017).

671

672 Even though the three most precise bioindicators (brown macroalgae, green macroalgae and
673 zoanthids) all showed significant differences in $\delta^{15}\text{N}$ between the two reef states for the
674 spatial variation analyses, their CoV values did not. This suggests that these bioindicators are
675 not only consistently precise among reefs and reef states, but are also able to detect
676 differences in nutrient regimes across the same areas, which is why $\delta^{15}\text{N}$ is such a versatile
677 tool for monitoring water quality (Costanzo et al., 2001; Lin & Fong, 2008). However, when
678 compared directly, the congruency among these three bioindicators was relatively low. This
679 could be due to the differences in nutrient processing between the different bioindicators.
680 Congruency is important, as a single-species approach may result in an underestimation of
681 spatial patterns in nutrient regimes (Linton & Warner, 2003), and it has been shown across
682 multiple taxa in previous studies (Connolly et al., 2013), but these studies were also
683 conducted along strong nutrient gradients (i.e. with increasing distance from a sewage outfall)
684 (Fernandes et al., 2012). This suggests that in the current study, the biological mechanisms of
685 individual species may have outweighed the effect of environmental factors on their isotopic
686 and elemental signatures.

687

688 The other (bio)indicators included in this study were found to have variable and inconsistent
689 nutrient signatures across sites and the two reef states, which was why they were not included
690 in the congruency analyses. Like macroalgae, turf algal assemblages and cyanobacteria are
691 primary producers that not only take up and utilise bioavailable nutrients but are becoming
692 more prevalent on reefs across a range of reef states, particularly following a disturbance (den
693 Haan et al., 2016; Zaneveld et al., 2016, Ford et al., 2018). However, this study showed that
694 both bioindicators had variable precision among the five nutrient signatures with no clear
695 spatial patterns between reefs, which implied they were also more influenced by biological

696 factors (i.e. multiple species within the turf assemblage) than their local environment
697 (Steneck & Dethier, 1994; Raimonet et al., 2013). Similarly to zoanthids, soft corals can also
698 harbour symbionts (Fleury et al., 2000; Risk, 2014; Williams et al., 2018), and while sponges
699 are not photosynthetic, they do have symbiotic relationships with cyanobacteria, which is
700 reflected in their $\delta^{13}\text{C}$ signatures (Smit, 2001; Lamb et al., 2012). Sediments can also capture
701 a range of nutrients within a reef, which can be resuspended within local biogeochemical
702 cycles through various biophysical factors and thus provide an additional source (Fabricius,
703 2005; Umezawa et al., 2008). However, some studies have found sediments to be an overall
704 poor indicator (Fichez et al., 2005). In the current study, for instance, very little N was
705 detected in the subsamples of sediment analysed even before acidification, so the low
706 precision calculated for it was more likely due to random error than environmental factors,
707 and so was not comparable for either N- or C-based signatures.

708

709

710 ***4.2 Cost-Effectiveness of Bioindicators***

711 Cost-effectiveness is often mentioned as an important criteria in previous bioindicator studies
712 (Fichez et al. 2005; Cooper et al., 2009; Risk et al., 2001). However, analyses are rarely
713 conducted to quantify these in ecological studies (Drummond & Connell, 2008; Bal et al.,
714 2020) even though the “cost” of any particular indicator can be affected by various different
715 factors. For instance, the average time taken to collect an individual sample from a study site
716 depended upon its availability and/ or abundance, which is why there was a significant
717 difference in collection time with reef state. While it only took ~1 to 2 minutes on average to
718 collect samples of turf algae and sediments from each site, regardless of ecological condition,
719 it took significantly less time to collect brown macroalgae from regime-shifted reefs than it
720 did on coral-mortality reefs. Differences in availability on those reefs could be influenced by

721 nutrient loads, abundance of herbivores, depth, structural complexity, and juvenile coral
722 cover (Graham et al., 2015; Dajka et al., 2019). The findings of both the sample collection
723 and the line-intercept survey of benthic cover at the 21 sites illustrated the importance of
724 considering the local abundance of a bioindicator when assessing nutrient regimes (Cooper et
725 al., 2009; Fabricius et al., 2012). For instance, turf algae and sediments were ubiquitous at all
726 sites, so could be considered as more “cost-effective” in terms of sampling availability and
727 abundance. However, as turf algae are composed of an assemblage of varying functional
728 groups, and there was very little N detected in sediment, it is difficult to interpret results for
729 nutrient signatures from either bioindicator, and therefore to rely on them for capturing
730 nutrient regimes precisely, despite their widespread abundance.

731

732 ***4.3 Future Directions in Bioindicator Research***

733 This study investigated novel ways of assessing potential bioindicators for monitoring
734 programs across coral reefs under different ecological states. However precision and
735 effectiveness of bioindicators used in this study could be improved, even if these
736 improvements will increase costs. For instance, to reduce the CoV of turf algal assemblages,
737 cyanobacteria, and symbiotic organisms, future studies could isolate and individually
738 measure the different functional groups within assemblages (Steneck & Dethier, 1985),
739 individual strains of cyanobacteria (Thacker & Paul, 2001), or the host and symbiont
740 fractions in zoanthids and soft corals (Hoegh-Guldberg et al., 2004; Leal et al., 2017) so that
741 the nutrient signatures of each group can be measured and interpreted separately. Conversely,
742 such techniques will increase the time taken to process and analyse samples, and thus will
743 increase their “costs” as a bioindicator.

744

745 It was also difficult to determine the accuracy of the bioindicator nutrient signatures, as there
746 is little reference data for nutrient levels around the inner Seychelles Islands, even from
747 seawater samples, and especially at the spatio-temporal scales required for this study. Further
748 research should therefore also investigate the accuracy of cost-effective bioindicators such as
749 macroalgae for capturing either natural or anthropogenic sources by additionally measuring
750 stable isotopic signatures of potential point sources (Costanzo et al., 2001; Dailer et al., 2010;
751 Fernandes et al., 2012; den Haan et al., 2012).. Another approach could entail building up a
752 suite of relatively similar bioindicators by focusing on specific functional group(s),
753 appropriately matched to the scale of the ecological process being investigated (Fong &
754 Fong, 2014). If this option is not possible, for instance, when a group of congruent
755 bioindicators (i.e. fleshy macroalgae) is only found on reefs in a certain ecological state, then
756 nutrient signatures could be compared across a suite of bioindicators to see the accumulation
757 of this energy source across different trophic levels within the same food chain (Smit, 2001;
758 Pitt et al., 2009; Connolly et al., 2013; Kürten et al., 2014; Graham et al., 2018).

759

760 **5. Conclusion**

761 In conclusion, the stable isotopic and elemental signatures of fleshy macroalgae were found
762 to be precise and cost-effective bioindicators across coral reefs in the inner Seychelles, as
763 primary producers with widespread distribution and consistent measurements within their
764 tissues. If the precision of bioindicators can be increased, it would provide additional
765 opportunities to determine differences in bioavailable nutrient regimes between reefs. This
766 could be particularly useful in remote coastal areas where environmental monitoring efforts
767 to assess the local anthropogenic impacts of coastal run-off and excessive nutrient loads on
768 coral reefs are currently limited, but would be highly beneficial to assessing overall
769 ecosystem health. If remote reefs have been subjected to any large disturbance, such as a

770 mass bleaching event, having precise and cost-effective bioindicators to detect whether any
771 areas have excessive nutrient loads, could enable better-informed efforts to improve water
772 quality and mediate coral recovery potential.

773

774 **6. Author Contributions**

775 **Eleanor Vaughan:** Conceptualisation, Data curation, Formal analysis, Investigation,
776 Methodology, Visualisation, Writing – original draft, Writing – review and editing. **Nicholas**
777 **Graham:** Conceptualisation, Funding acquisition, Project administration, Resources,
778 Supervision, Writing – review and editing. **Shaun Wilson:** Funding acquisition,
779 Investigation, Writing – review & editing. **Peter Wynn:** Methodology, Resources,
780 Supervision. **Gareth Williams:** Supervision, Writing – review and editing. **Phillip Barker:**
781 Supervision, Writing – review & editing.

782

783

784 **7. Declaration of Interest Statement**

785 The authors declare that the research was conducted in the absence of any commercial or
786 financial relationships that could be construed as a potential conflict of interest.

787

788 **8. Funding**

789 The project was funded via grants from the Royal Society (UF140691 and RG150710).

790

791 **9. Acknowledgements**

792 We thank Seychelles Fishing Authority, Seychelles Marine Parks Authority and Jan Dajka
793 for field and laboratory assistance in the Seychelles, and David Hughes and Jon Crosse from
794 Lancaster Environment Centre for extensive help with preparations for fieldwork and with
795 the subsequent stable isotopic and elemental analyses. James Robinson and Jeneen Hadj-
796 Hammou gave advice on statistical analyses.

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801 **7. References**

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1004 **Supplementary Figures**

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Supplementary Table 1. Summary of the 21 coral reefs surveyed around the inner Seychelles islands, including latitude, longitude, habitat type and reef state as categorised in 2017 (CM= coral-mortality reef; RS – regime-shifted reef). * denotes the sites added to the 2017 survey in place of the three sites around Cousin Island that were not surveyed that year (Graham et al., 2015).

Site	Lat	Long	Habitat Type	Reef State
Mahe West patch reef	-4.684675	55.43472	Patch	CM
Mahe West carbonate	-4.669121	55.40025	Carbonate	CM
Mahe West granitic reef	-4.659828	55.36099	Granitic	CM
Mahe North West carbonate	-4.634994	55.37612	Carbonate	CM
Mahe North West patch reef	-4.614482	55.41627	Patch	CM
Mahe North West granitic	-4.562673	55.43691	Granitic	CM
Ste. Anne granitic reef	-4.605095	55.51353	Granitic	CM
Ste. Anne patch reef	-4.618086	55.5094	Patch	CM
Ste Anne carbonate	-4.609864	55.49636	Carbonate	RS
Mahe East granitic reef	-4.734961	55.52896	Granitic	RS
Mahe East carbonate	-4.710589	55.52704	Carbonate	RS
Mahe East patch reef	-4.703574	55.5282	Patch	CM
Praslin North East patch reef	-4.303653	55.74655	Patch	CM
Praslin North East carbonate	-4.315847	55.75669	Carbonate	RS
Praslin NE granitic reef	-4.290079	55.7075	Granitic	CM
Praslin SW granitic reef	-4.313662	55.67872	Granitic	CM
Praslin SW patch reef	-4.333943	55.69204	Patch	RS
Praslin SW carbonate	-4.350873	55.70152	Carbonate	RS
Curieuse South West carbonate*	-4.28007	55.71199	Carbonate	RS
Curieuse North East granitic reef*	-4.27987	55.74425	Granitic	RS
Baie Ste Anne patch reef*	-4.34278	55.76919	Patch	RS

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Supp. Table 2. Model (1) for each nutrient measurement and for each bioindicator: Nutrient Signature ~ Bioindicator + Reef State + Site. Model type was selected for each individual model based on normality of distribution. Sediment (SED) values were not available and so were not included for C-based signatures. Significance is noted as: ‘****’ p < 0.001; ‘***’ p < 0.01; ‘**’ p < 0.05; and ‘,’ p < 0.1.

Bioindicator	Model Type (Family)	Intercept	Lower C.I. (5%)	Upper C.I. (95%)	p-value
$\delta^{15}\text{N}$					
Brown Macroalgae					
BSAP_Coral Mortality (Intercept)	GLM	0.15	0.14	0.16	< 0.0001****
Reef State: Regime Shift	GLM	0.020	0.010	0.029	0.0002***
CNEG	GLM	0.020	0.0095	0.031	0.0005***
CSWC	GLM	0.013	0.0029	0.024	0.16*
MEC	GLM	0.0090	-0.0014	0.019	0.095.
MEG	GLM	0.046	0.034	0.057	< 0.0001****
MEP	GLM	0.0028	-0.0063	0.012	0.55
MNWP	GLM	-0.012	-0.021	-0.0032	0.010*
PNEC	GLM	0.064	0.052	0.076	< 0.0001****
PNEG	GLM	0.028	0.018	0.037	< 0.0001****
PNEP	GLM	0.033	0.023	0.043	< 0.0001****
PSWC	GLM	0.039	0.028	0.050	< 0.0001****
PSWG	GLM	0.033	0.023	0.044	< 0.0001****
PSWP	GLM	0.047	0.035	0.059	< 0.0001****
SAC	GLM	0.017	0.0062	0.028	0.003**
SAG	GLM	0.0091	-0.00012	0.018	0.058.
SAP	GLM	N/A	N/A	N/A	N/A
Cyanobacteria					
Intercept (BSAP_Coral Mortality)	GLM	0.12	0.10	0.13	< 0.0001****
Reef State: Regime Shift	GLM	0.039	0.017	0.062	0.002**
MEC	GLM	-0.013	-0.038	0.013	0.35
MEG	GLM	0.0055	-0.019	0.030	0.66
MEP	GLM	0.019	0.00051	0.038	0.054.
MNWC	GLM	0.015	-0.0023	0.033	0.10.
MNWG	GLM	0.020	0.0029	0.039	0.03*
MWC	GLM	0.037	0.018	0.056	0.0006****
MWG	GLM	0.031	0.0097	0.053	0.009**
PNEC	GLM	0.017	-0.022	0.060	0.42
PSWG	GLM	0.033	0.015	0.052	0.0014**
SAG	GLM	0.026	-0.0046	0.061	0.12
SAP	GLM	N/A	N/A	N/A	N/A

Green Macroalgae

Intercept (BSAP_Coral Mortality)	GLM	0.17	0.16	0.17	<0.0001***
Reef State: Regime Shift	GLM	0.030	0.023	0.036	<0.0001***
CNEG	GLM	-0.029	-0.035	-0.023	<0.0001***
CSWC	GLM	-0.014	-0.021	-0.0078	<0.0001***
MEC	GLM	-0.021	-0.027	-0.015	<0.0001***
PNEC	GLM	-0.010	-0.017	-0.0037	0.004**
PNEG	GLM	0.013	0.0072	0.020	0.0001***
PSWC	GLM	0.15	0.0067	0.023	0.0009***
PSWG	GLM	0.020	0.013	0.026	<0.0001***
PSWP	GLM	0.026	0.019	0.033	<0.0001***
SAC	GLM	-0.014	-0.021	-0.0077	<0.0001***
SAG	GLM	N/A	N/A	N/A	N/A

Soft Coral

Intercept (MEC_Coral Mortality)	GLM	0.12	0.11	0.13	<0.0001***
Reef State: Regime Shift	GLM	0.016	-0.004	0.038	0.14
MEP	GLM	0.026	0.012	0.041	0.001**
MNWC	GLM	0.012	0.00097	0.024	0.042*
MNWP	GLM	0.10	0.084	0.12	<0.0001***
MWC	GLM	0.0060	-0.0052	0.017	0.31
MWG	GLM	0.015	0.0035	0.027	0.017*
MWP	GLM	0.0058	-0.0054	0.017	0.32
PNEG	GLM	-0.0039	-0.015	0.0068	0.48
PSWG	GLM	N/A	N/A	N/A	N/A

Sediment

Intercept (BSAP_Coral Mortality)	LM	9.4	8.7	10.2	<0.0001***
Reef State: Regime Shift	LM	1.4	0.35	2.5	0.010*
CNEG	LM	0.076	-0.99	1.1	0.89
CSWC	LM	0.90	-0.17	2.0	0.10
MEC	LM	-1.3	-2.3	-0.18	0.022*
MEG	LM	-1.1	-2.3	0.15	0.085.
MEP	LM	-1.0	-2.1	0.051	0.062.
MNWC	LM	-1.1	-2.1	0.0018	0.050.
MNWG	LM	0.52	-0.55	1.6	0.34
MNWP	LM	-0.95	-2.0	0.12	0.081.
MWC	LM	-1.2	-2.3	-0.13	0.029*
MWG	LM	1.2	0.021	2.3	0.046*
MWP	LM	1.5	0.43	2.6	0.0064**
PNEC	LM	-2.6	-3.7	-1.5	<0.0001***
PNEG	LM	1.2	0.09	2.2	0.034*
PNEP	LM	-0.12	-1.2	0.95	0.83

	PSWC	LM	-1.2	-2.2	-0.080	0.035*
	PSWG	LM	1.3	0.25	2.4	0.012*
	PSWP	LM	-3.7	-4.8	-2.6	<0.0001***
	SAC	LM	-2.1	-3.2	-1.0	0.0002***
	SAG	LM	0.95	-0.12	2.0	0.082.
	SAP	LM	N/A	N/A	N/A	N/A
Sponge						
	Intercept (CNEG_Coral Mortality)	GLM	0.13	0.12	0.14	<0.0001***
	Reef State: Regime Shift	GLM	0.0013	-0.016	0.019	0.89
	CSWC	GLM	0.0026	0.0062	0.046	0.013*
	MEG	GLM	-0.0034	-0.029	0.023	0.80
	MEP	GLM	0.0043	-0.010	0.020	0.56
	MNWG	GLM	-0.0024	-0.016	0.011	0.72
	MWC	GLM	0.0098	-0.0041	0.024	0.17
	MWG	GLM	0.01	-0.0038	0.024	0.16
	MWP	GLM	0.0011	-0.012	0.015	0.87
	PNEC	GLM	0.0067	-0.012	0.025	0.47
	PNEG	GLM	0.0064	-0.0073	0.020	0.37
	PSWC	GLM	0.0097	-0.017	0.038	0.49
	PSWG	GLM	0.0062	-0.0075	0.020	0.38
	PSWP	GLM	0.0017	-0.017	0.020	0.86
	SAG	GLM	-0.0036	-0.017	0.0095	0.59
	SAP	GLM	N/A	N/A	N/A	N/A
Turf Algae						
	Intercept (BSAP_Coral Mortality)	GLM	0.13	0.12	0.15	<0.0001***
	Reef State: Regime Shift	GLM	-0.029	-0.052	-0.0044	0.020*
	CNEG	GLM	0.0066	-0.017	0.028	0.57
	CSWC	GLM	0.041	0.016	0.065	0.001**
	MEC	GLM	0.026	0.0012	0.048	0.036*
	MNWC	GLM	-0.0044	-0.021	0.012	0.60
	MNWG	GLM	0.0055	-0.011	0.022	0.53
	MNWP	GLM	0.0037	-0.014	0.022	0.69
	MWC	GLM	0.018	-0.0027	0.039	0.10
	MWG	GLM	0.0015	-0.015	0.018	0.86
	PNEC	GLM	0.30	0.26	0.34	<0.0001***
	PNEG	GLM	-0.0064	-0.023	0.0098	0.44
	PNEP	GLM	-0.00036	-0.017	0.016	0.97
	PSWC	GLM	0.054	0.018	0.093	0.006**
	PSWG	GLM	-0.0043	-0.021	0.012	0.61
	PSWP	GLM	0.093	0.062	0.12	<0.0001***
	SAC	GLM	0.028	0.0029	0.05	0.026*

	SAG	GLM	0.019	-0.0050	0.043	0.14
	SAP	GLM	N/A	N/A	N/A	N/A
Zoanthids						
	Intercept (BSAP_Coral Mortality)	GLM	0.12	0.11	0.12	<0.0001***
	Reef State: Regime Shift	GLM	0.017	0.012	0.022	<0.0001***
	CNEG	GLM	0.017	-0.024	-0.014	<0.0001***
	MEG	GLM	-0.019	-0.031	-0.16	<0.0001***
	MEP	GLM	-0.024	0.0069	0.020	<0.0001***
	MNWC	GLM	0.013	-0.011	-0.0018	0.0001***
	MNWG	GLM	-0.011	-0.016	-0.0071	0.008**
	MNWP	GLM	-0.018	-0.022	-0.014	<0.0001***
	MWC	GLM	-0.013	-0.018	-0.0091	<0.0001***
	MWG	GLM	-0.012	-0.017	-0.0082	<0.0001***
	MWP	GLM	-0.022	-0.026	-0.018	<0.0001***
	PNEG	GLM	-0.011	-0.016	-0.0058	<0.0001***
	PNEG	GLM	-0.0044	-0.0088	-0.000024	0.056.
	PNEP	GLM	-0.0014	-0.0058	0.0031	0.55
	PSWC	GLM	-0.0037	-0.0087	0.0014	0.16
	PSWG	GLM	-0.0039	-0.0083	0.00053	0.089.
	PSWP	GLM	-0.025	-0.030	-0.020	<0.0001***
	SAC	GLM	-0.033	-0.038	-0.028	<0.0001***
	SAG	GLM	-0.0043	-0.0090	0.00031	0.072.
	SAP	GLM	N/A	N/A	N/A	N/A

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Brown Macroalgae						
	Intercept (BSAP_Coral Mortality)	GLM	-17.0	-17.9	-16.1	<0.0001***
	Reef State: Regime Shift	GLM	-0.25	-1.6	1.1	0.72
	CNEG	GLM	-0.42	-1.7	0.91	0.54
	CSWC	GLM	1.2	-0.079	2.6	0.070.
	MEC	GLM	0.44	-0.89	1.8	0.52
	MEG	GLM	0.16	-1.2	1.5	0.82
	MEP	GLM	0.20	-1.1	1.5	0.77
	MNWP	GLM	4.1	2.8	5.4	<0.0001***
	PNEG	GLM	1.9	0.54	3.2	0.008**
	PNEG	GLM	2.5	1.2	3.8	0.0005***
	PNEP	GLM	1.6	0.31	3.0	0.02*
	PSWC	GLM	-0.18	-1.5	1.1	0.79
	PSWG	GLM	-0.60	-2.0	0.81	0.41
	PSWP	GLM	1.2	-0.17	2.5	0.093.
	SAC	GLM	2.0	0.70	3.4	0.004**
	SAG	GLM	0.36	-0.96	1.7	0.59

SAP	GLM	N/A	N/A	N/A	N/A	
Cyanobacteria						
Intercept (BSAP_Coral Mortality)	GLM	-14.6	-16.5	-12.7	<0.0001***	
Reef State: Regime Shift	GLM	-9.3	-12.2	-6.4	<0.0001***	
MEC	GLM	-2.4	-3.3	2.8	0.88	
MEG	GLM	0.40	-2.4	3.2	0.78	
MEP	GLM	-8.8	-11.5	-6.1	<0.0001***	
MNWC	GLM	-2.4	-5.0	0.11	0.069.	
MNWG	GLM	-7.9	-10.4	-5.3	<0.0001***	
MNWP	GLM	-7.2	-9.7	-4.6	<0.0001***	
MWC	GLM	-5.0	-7.5	-2.5	0.0004***	
MWG	GLM	-9.2	-12.1	-6.4	<0.0001***	
PNEC	GLM	3.1	-1.2	7.5	0.17	
PSWG	GLM	-7.8	-10.4	-5.3	<0.0001***	
SAG	GLM	-8.5	-12.7	-4.3	0.0004***	
SAP	GLM	N/A	N/A	N/A	N/A	
Green Macroalgae						
Intercept (BSAP_Coral Mortality)	GLM	-21.0	-21.4	-20.5	<0.0001***	
Reef State: Regime Shift	GLM	1.2	0.64	1.8	0.0002***	
CNEG	GLM	-2.6	-3.2	-2.0	<0.0001***	
CSWC	GLM	-1.1	-1.6	-0.52	0.0005***	
MEC	GLM	-1.4	-2.0	-0.83	<0.0001***	
PNEC	GLM	-2.7	-3.2	-2.1	<0.0001***	
PNEG	GLM	0.89	0.29	1.5	0.006**	
PSWC	GLM	-1.8	-2.5	-1.2	<0.0001***	
PSWG	GLM	-0.98	-1.6	-0.39	0.002**	
PSWP	GLM	-1.6	-2.2	-1.1	<0.0001***	
SAC	GLM	-2.3	-2.9	-1.8	<0.0001***	
SAG	GLM	N/A	N/A	N/A	N/A	
Soft Coral						
Intercept (MEC_Coral Mortality)	GLM	-17.7	-18.6	16.7	<0.0001***	
Reef State: Regime Shift	GLM	0.93	-1.3	3.2	0.42	
MEP	GLM	3.0	1.6	4.5	0.0003***	
MNWC	GLM	2.3	1.0	3.6	0.001**	
MNWG	GLM	1.1	-0.19	2.4	-0.10	
MNWP	GLM	1.3	0.028	2.6	0.053.	
MWC	GLM	2.2	0.89	3.5	0.002**	
MWG	GLM	0.41	-0.88	1.7	0.54	
MWP	GLM	2.1	0.76	3.3	0.004**	
PNEG	GLM	0.81	-0.48	2.1	0.23	
PSWG	GLM	N/A	N/A	N/A	N/A	

Sponge					
Intercept (CNEG_Coral Mortality?)	GLM	-17.2	-17.5	-16.9	<0.0001***
Reef State: Regime Shift	GLM	-0.034	-0.53	0.47	0.89
CSWC	GLM	-0.023	-0.52	0.48	0.93
MEG	GLM	0.13	-0.60	0.86	0.73
MEP	GLM	0.15	-0.22	0.53	0.43
MNWG	GLM	-0.53	-0.91	-0.15	0.008**
MWC	GLM	-0.12	-0.49	0.26	0.55
MWG	GLM	-0.60	-0.98	-0.22	0.003**
MWP	GLM	-0.44	-0.81	-0.059	0.028*
PNEC	GLM	0.31	-0.19	0.81	0.24
PNEG	GLM	-0.30	-0.68	0.079	0.13
PSWC	GLM	-0.42	-1.1	0.31	0.27
PSWG	GLM	-0.44	-0.82	-0.064	0.027*
SAG	GLM	-0.21	-0.58	0.17	0.29
SAP	GLM	N/A	N/A	N/A	N/A
Turf Algae					
Intercept (BSAP_Coral Mortality)	GLM	-14.3	-15.4	-13.2	<0.0001***
Reef State: Regime Shift	GLM	-1.6	-4.3	0.97	0.22
CNEG	GLM	-1.8	-4.4	0.85	0.19
CSWC	GLM	0.74	-1.9	3.4	0.58
MEC	GLM	-0.98	-3.6	1.6	0.46
MNWC	GLM	-6.6	-8.1	-5.1	<0.0001***
MNWG	GLM	-3.0	-4.5	-1.5	0.0002***
MNWP	GLM	-6.4	-8.0	-4.8	<0.0001***
MWC	GLM	-8.2	-10.0	-6.5	<0.0001***
MWG	GLM	-10.1	-11.6	-8.6	<0.0001***
PNEC	GLM	2.7	0.078	5.3	0.048*
PNEG	GLM	-5.1	-6.6	-3.5	<0.0001***
PNEP	GLM	-4.5	-6.0	-3.0	<0.0001***
PSWC	GLM	-0.60	-3.3	2.1	0.65
PSWG	GLM	-5.2	-6.7	-3.7	<0.0001***
PSWP	GLM	-6.9	-9.5	-4.2	<0.0001***
SAC	GLM	-2.4	-5.0	0.24	0.080.
SAG	GLM	-4.9	-6.9	-2.9	<0.0001***
SAP	GLM	N/A	N/A	N/A	N/A
Zoanthids					
Intercept (BSAP_Coral Mortality)	GLM	-13.8	-14.6	13.1	<0.0001***
Reef State: Regime Shift	GLM	1.1	0.14	2.2	0.031*
CNEG	GLM	-2.2	-3.4	-1.1	0.0002***
MEG	GLM	-1.5	-3.2	0.14	0.079.

MEP	GLM	0.33	-0.97	1.6	0.62
MNWC	GLM	0.60	-0.47	1.7	0.27
MNWG	GLM	-0.12	-1.1	0.90	0.82
MNWP	GLM	0.10	-0.91	1.1	0.84
MWC	GLM	0.56	-0.45	1.6	0.29
MWG	GLM	-0.23	-1.2	0.78	0.66
MWP	GLM	0.57	-0.44	1.6	0.28
PNEC	GLM	-0.84	-1.9	0.17	0.11
PNEG	GLM	0.044	-1.6	1.7	0.96
PNEP	GLM	-0.55	-1.9	0.75	0.41
PSWC	GLM	-1.3	-2.3	-2.5	0.018*
PSWG	GLM	-0.0030	-1.3	1.3	0.99
PSWP	GLM	-1.0	-2.0	0.0065	0.057.
SAG	GLM	-0.97	-2.0	0.039	0.066.
SAP	GLM	N/A	N/A	N/A	N/A

%N

Brown Macroalgae					
Intercept (BSAP_Coral Mortality)	LM	1.07	0.96	1.2	<0.0001***
Reef State: Regime Shift	LM	0.18	0.053	0.31	0.040*
CNEG	LM	-0.41	-0.57	-0.25	<0.0001***
CSWC	LM	-0.16	-0.32	0.0052	0.058.
MEC	LM	0.13	-0.033	0.29	0.12
MEG	LM	-0.072	-0.23	0.091	0.38
MEP	LM	0.19	0.025	0.35	0.024*
MNWP	LM	0.053	-0.11	0.22	0.52
PNEC	LM	-0.20	-0.36	-0.034	0.019*
PNEG	LM	0.16	-0.0028	0.32	0.054.
PNEP	LM	-0.088	-0.25	0.075	0.28
PSWC	LM	0.037	-0.13	0.20	0.65
PSWG	LM	-0.0072	-0.18	0.17	0.93
PSWP	LM	-0.26	-0.42	-0.096	0.002**
SAC	LM	-0.11	-0.27	0.053	0.18
SAG	LM	0.037	-0.13	0.2	0.65
SAP	LM	N/A	N/A	N/A	N/A
Cyanobacteria					
Intercept (BSAP_Coral Mortality)	GLM	0.65	0.50	0.83	<0.0001***
Reef State: Regime Shift	GLM	-0.41	-0.60	-0.24	<0.0001***
MEC	GLM	-0.024	-0.12	0.07	0.62
MEG	GLM	-0.023	-0.11	0.060	0.60
MEP	GLM	-0.44	-0.62	-0.28	<0.0001***
MNWC	GLM	-0.063	-0.28	0.14	0.56

MNWG	GLM	-0.32	-0.51	-0.16	0.0007***
MWC	GLM	-0.22	-0.42	-0.035	0.030*
MWG	GLM	-0.41	-0.60	-0.24	<0.0001***
PNEC	GLM	-0.017	-0.14	0.13	0.80
PSWG	GLM	-0.37	-0.56	-0.21	0.0002***
SAG	GLM	-0.41	-0.62	-0.20	0.0004***
SAP	GLM	N/A	N/A	N/A	N/A
Green Macroalgae					
Intercept (BSAP_Coral Mortality)	GLM	0.23	0.21	0.25	<0.0001***
Reef State: Regime Shift	GLM	-0.0012	-0.028	0.026	0.93
CNEG	GLM	0.030	0.0033	0.057	0.034*
CSWC	GLM	0.0023	-0.023	0.028	0.86
MEC	GLM	-0.026	-0.050	-0.0019	0.041*
PNEC	GLM	0.015	-0.011	0.041	0.28
PNEG	GLM	-0.012	-0.039	0.014	0.37
PSWC	GLM	-0.026	-0.053	0.0014	0.069.
PSWG	GLM	0.029	0.0012	0.058	0.047*
PSWP	GLM	-0.013	-0.038	0.011	0.30
SAC	GLM	0.014	-0.013	0.040	0.32
SAG	GLM	N/A	N/A	N/A	N/A
Soft Coral					
Intercept (MEC_Coral Mortality)	GLM	0.43	0.32	0.57	<0.0001***
Reef State: Regime Shift	GLM	-0.14	-0.35	0.12	0.24
MEP	GLM	0.023	-0.18	0.25	0.83
MNWC	GLM	-0.20	-0.35	-0.064	0.0098**
MNWP	GLM	-0.29	-0.43	-0.17	0.0002***
MWC	GLM	0.0010	-0.18	-0.18	0.99
MWG	GLM	-0.16	-0.32	-0.020	0.41*
MWP	GLM	-0.12	-0.28	0.033	0.14
PNEG	GLM	-0.12	-0.28	0.031	0.14
PSWG	GLM	N/A	N/A	N/A	N/A
Sediment					
Intercept (BSAP_Coral Mortality)	GLM	27.5	18.3	39.4	<0.0001***
Reef State: Regime Shift	GLM	-5.1	-19.3	8.3	0.46
CNEG	GLM	1.3	-11.3	14.1	0.84
CSWC	GLM	1.9	-10.8	15.0	0.76
MEC	GLM	10.3	-4.4	26.4	0.19
MEG	GLM	10.4	-6.4	30.9	0.27
MEP	GLM	1.1	-14.3	16.6	0.89
MNWC	GLM	8.6	-8.48	26.8	0.34
MNWG	GLM	5.8	-10.6	23.1	0.49

MNWP	GLM	0.81	-14.5	16.3	0.92
MWC	GLM	5.1	-11.2	22.1	0.54
MWG	GLM	0.10	-15.7	16.6	0.99
MWP	GLM	0.84	-14.5	16.3	0.91
PNEC	GLM	7.2	-6.7	22.2	0.32
PNEG	GLM	-3.7	-18.1	10.2	0.61
PNEP	GLM	2.3	-13.4	18.2	0.78
PSWC	GLM	9.9	-4.7	25.8	0.20
PSWG	GLM	-23.7	-35.7	-14.3	<0.0001***
PSWP	GLM	-2.6	-14.4	8.8	0.65
SAC	GLM	5.9	-7.7	20.3	0.41
SAG	GLM	-4.6	-18.9	9.0	0.51
SAP	GLM	N/A	N/A	N/A	N/A
Sponge					
Intercept (CNEG_Coral Mortality)	GLM	0.53	0.44	0.64	<0.0001***
Reef State: Regime Shift	GLM	-0.055	-0.22	0.12	0.53
CSWC	GLM	0.15	-0.044	0.34	0.13
MEG	GLM	0.41	0.058	0.86	0.046*
MEP	GLM	0.25	0.068	0.45	0.012*
MNWG	GLM	-0.061	-0.19	0.07	0.37
MWC	GLM	0.064	-0.08	0.21	0.40
MWG	GLM	0.029	-0.11	0.17	0.69
MWP	GLM	0.24	0.076	0.43	0.008**
PNEC	GLM	-0.0010	-0.18	0.16	0.99
PNEG	GLM	0.16	-0.0034	0.32	0.064.
PSWC	GLM	-0.027	-0.25	0.22	0.82
PSWG	GLM	-0.079	-0.21	0.050	0.24
PSWP	GLM	0.052	0.133	0.23	0.57
SAG	GLM	0.16	-0.018	0.33	0.056.
SAP	GLM	N/A	N/A	N/A	N/A
Turf Algae					
Intercept (BSAP_Coral Mortality)	GLM	0.64	0.41	0.96	<0.0001***
Reef State: Regime Shift	GLM	-0.058	-0.39	0.21	0.70
CSWC	GLM	0.031	-0.13	0.20	0.71
MNWC	GLM	-0.16	-0.49	0.10	0.30
MNWG	GLM	-0.0069	-0.35	0.28	0.97
MWG	GLM	-0.063	-0.42	0.24	0.71
PNEC	GLM	0.42	0.20	0.65	0.0007***
PNEG	GLM	-0.059	-0.39	0.21	0.70
PNEP	GLM	-0.074	-0.27	0.36	0.64
PSWC	GLM	0.052	-0.11	0.22	0.54

PSWG	GLM	-0.053	-0.40	0.24	0.74
SAC	GLM	0.11	-0.065	0.28	0.23
SAG	GLM	1.4	0.74	2.1	0.0003***
SAP	GLM	N/A	N/A	N/A	N/A
Zoanthids					
Intercept (BSAP_Coral Mortality)	GLM	0.94	0.82	1.1	<0.0001***
Reef State: Regime Shift	GLM	0.22	0.021	0.42	0.036*
CNEG	GLM	-0.30	-0.49	-0.11	0.0037**
MEG	GLM	-0.29	-0.58	0.027	0.62
MEP	GLM	0.33	0.044	0.64	0.034*
MNWC	GLM	0.12	-0.079	0.33	0.25
MNWG	GLM	-0.010	-0.19	0.17	0.91
MNWP	GLM	0.064	-0.12	0.25	0.50
MWC	GLM	-0.085	-0.26	0.085	0.33
MWG	GLM	-0.040	-0.21	0.13	0.66
MWP	GLM	0.025	-0.15	0.21	0.79
PNEC	GLM	0.14	-0.10	0.40	0.26
PNEG	GLM	-0.07	-0.24	0.10	0.42
PNEP	GLM	0.14	-0.050	0.33	0.15
PSWC	GLM	-0.42	-0.61	-0.24	<0.0001***
PSWG	GLM	-0.11	-0.28	0.058	0.21
PSWP	GLM	-0.16	-0.38	-0.52	0.14
SAC	GLM	-0.14	-0.37	0.10	0.26
SAG	GLM	0.26	-0.43	-0.90	0.004**
SAP	GLM	N/A	N/A	N/A	N/A

%C

Brown Macroalgae

Intercept (BSAP_Coral Mortality)	GLM	0.031	0.030	0.032	<0.0001***
Reef State: Regime Shift	GLM	0.0010	-0.00060	0.0027	0.22
CNEG	GLM	-0.00012	-0.0018	0.0015	0.89
CSWC	GLM	0.00033	-0.0013	0.0020	0.70
MEC	GLM	-0.00074	-0.0024	0.00091	0.38
MEG	GLM	0.0018	0.00013	0.0036	0.039*
MEP	GLM	0.0025	0.00080	0.0042	0.0052**
MNWP	GLM	0.0011	-0.00056	0.0028	0.20
PNEC	GLM	-0.00038	-0.0020	0.0013	0.65
PNEG	GLM	0.0012	-0.00042	0.0029	0.15
PNEP	GLM	0.00041	-0.0012	0.0020	0.62
PSWC	GLM	0.00019	-0.0015	0.0019	0.82
PSWG	GLM	0.0022	0.00044	0.0040	0.017*
PSWP	GLM	0.00087	-0.00082	0.0026	0.32

	SAC	GLM	-0.00075	-0.0024	0.00090	0.38
	SAG	GLM	0.0022	0.00051	0.0039	0.013*
	SAP	GLM	N/A	N/A	N/A	N/A
Cyanobacteria						
	Intercept (BSAP_Coral Mortality)	GLM	0.053	0.047	0.059	<0.0001***
	Reef State: Regime Shift	GLM	-0.024	-0.031	-0.017	<0.0001***
	MEC	GLM	-0.00033	-0.0055	0.0049	0.90
	MEG	GLM	0.0042	-0.00078	0.0091	0.10
	MEP	GLM	-0.023	-0.030	-0.017	<0.0001***
	MNWC	GLM	-0.0071	-0.015	0.00015	0.065.
	MNWG	GLM	-0.021	-0.027	-0.014	<0.0001***
	MNWP	GLM	-0.017	-0.024	-0.011	<0.0001***
	MWC	GLM	-0.011	-0.019	-0.0045	0.0030**
	MWG	GLM	-0.020	-0.027	-0.013	<0.0001***
	PNEC	GLM	0.00027	-0.0069	0.0080	0.94
	PSWG	GLM	-0.020	-0.027	-0.013	<0.0001***
	SAG	GLM	-0.022	-0.031	-0.013	<0.0001***
	SAP	GLM	N/A	N/A	N/A	N/A
Green Macroalgae						
	Intercept (BSAP_Coral Mortality)	GLM	0.024	0.023	0.025	<0.0001***
	Reef State: Regime Shift	GLM	0.00045	-0.0017	0.00082	0.49
	CNEG	GLM	0.00073	-0.0019	0.00043	0.23
	CSWC	GLM	0.0010	-0.0021	0.00016	0.098.
	MEC	GLM	0.0019	0.0006	0.0031	0.005**
	PNEC	GLM	0.0010	-0.0023	0.00021	0.11
	PNEG	GLM	0.00095	-0.0022	0.00030	0.14
	PSWC	GLM	0.000086	-0.0013	0.0015	0.90
	PSWG	GLM	0.00043	-0.00084	0.0017	0.50
	PSWP	GLM	0.00068	-0.0018	0.00048	0.26
	SAC	GLM	0.0023	0.0011	0.0038	0.0006***
	SAG	GLM	N.A	N/A	N/A	N/A
Soft Coral						
	Intercept (MEC_Coral Mortality)	GLM	51.5	49.8	53.1	<0.0001***
	Reef State: Regime Shift	GLM	2.5	-1.6	6.6	0.25
	MEP	GLM	-0.13	-2.9	2.6	0.93
	MNWC	GLM	1.6	-0.81	3.9	0.20
	MNWG	GLM	-0.87	-3.2	1.5	0.48
	MNWP	GLM	2.1	-0.21	4.5	0.084.
	MWC	GLM	2.2	-0.21	4.5	0.084.
	MWG	GLM	0.75	-1.6	3.1	0.54
	MWP	GLM	0.43	-1.9	2.8	0.72

	PNEG	GLM	0.56	-1.8	2.9	0.65
	PSWG	GLM	N/A	N/A	N/A	N/A
Sponge						
	Intercept (CNEG_Coral Mortality)	GLM	0.096	0.092	0.10	<0.0001***
	Reef State: Regime Shift	GLM	0.0011	-0.0066	0.0090	0.79
	CSWC	GLM	-0.00032	-0.0082	0.0074	0.94
	MEG	GLM	-0.0039	-0.015	0.0074	0.50
	MEP	GLM	0.0032	-0.0028	0.0091	0.30
	MNWG	GLM	0.011	0.0050	0.017	0.00096***
	MWC	GLM	0.0032	-0.0027	0.0092	0.29
	MWG	GLM	0.0043	-0.0017	0.010	0.17
	MWP	GLM	0.0016	-0.0043	0.0075	0.60
	PNEC	GLM	0.0028	-0.0052	0.011	0.49
	PNEG	GLM	0.0038	-0.0021	0.0098	0.21
	PSWC	GLM	0.0083	-0.0036	0.021	0.19
	PSWG	GLM	-0.0020	-0.0078	0.0038	0.51
	SAG	GLM	0.0086	0.0025	0.015	0.0084**
	SAP	GLM	N/A	N/A	N/A	N/A
Turf Algae						
	Intercept (BSAP_Coral Mortality)	GLM	0.024	0.023	0.024	<0.0001***
	Reef State: Regime Shift	GLM	-0.0013	-0.0026	0.00012	0.075.
	CNEG	GLM	0.0017	0.00029	0.0031	0.020*
	CSWC	GLM	0.00049	-0.00089	0.0018	0.49
	MEC	GLM	0.00037	-0.0010	0.0071	0.60
	MNWC	GLM	-0.0010	-0.0018	-0.000021	0.016*
	MNWG	GLM	-0.0012	-0.0020	-0.00042	0.004**
	MNWP	GLM	0.0029	0.0020	0.0039	<0.0001***
	MWC	GLM	0.00025	-0.00071	0.0012	0.61
	MWG	GLM	0.000068	-0.00076	0.00089	0.87
	PNEC	GLM	0.00067	-0.000070	0.0020	0.34
	PNEG	GLM	-0.00026	-0.0011	0.00056	0.54
	PNEP	GLM	0.00067	0.0016	-0.000030	0.047*
	PSWC	GLM	-0.00084	-0.0011	0.0017	0.67
	PSWG	GLM	-0.00078	-0.0016	0.000024	0.062.
	SAC	GLM	0.0012	-0.00020	0.0025	0.094.
	SAG	GLM	0.0033	0.0021	0.0044	<0.0001***
			N/A	N/A	N/A	N/A
Zoanthids						
	Intercept (BSAP_Coral Mortality)	GLM	0.038	0.026	0.053	<0.0001***
	Reef State: Regime Shift	GLM	0.056	0.026	0.091	0.001**
	CNEG	GLM	0.040	-0.018	0.11	0.21

MEG	GLM	-0.071	-0.11	-0.038	0.0001***
MEP	GLM	0.0052	-0.018	0.033	0.69
MNWC	GLM	0.14	0.081	0.21	<0.0001***
MNWG	GLM	0.10	0.059	0.15	<0.0001***
MNWP	GLM	0.11	0.063	0.16	<0.0001***
MWC	GLM	0.0076	-0.012	0.027	0.44
MWG	GLM	0.025	0.0022	0.050	0.042*
MWP	GLM	0.0048	-0.014	0.024	0.62
PNEC	GLM	-0.055	-0.089	-0.024	0.002**
PNEG	GLM	0.11	0.026	0.23	0.047*
PNEP	GLM	-0.010	-0.029	0.0097	0.30
PSWC	GLM	-0.060	-0.10	-0.034	0.0003***
PSWG	GLM	0.060	0.017	0.12	0.023*
PSWP	GLM	-0.040	-0.077	-0.0067	0.027*
SAG	GLM	0.036	0.011	0.064	0.010*
SAP	GLM	N/A	N/A	N/A	N/A

C:N Ratio

Brown Macroalgae

Intercept (BSAP_Coral Mortality)	GLM	0.033	0.030	0.036	<0.0001***
Reef State: Regime Shift	GLM	0.0052	0.00049	0.0099	0.035*
CENG	GLM	-0.0134	-0.018	-0.0092	<0.0001***
CSWC	GLM	-0.0046	-0.0093	0.00013	0.062.
MEC	GLM	0.0029	-0.0023	0.0081	0.28
MEG	GLM	-0.00027	-0.0053	0.0047	0.92
MEP	GLM	0.0088	0.0039	0.014	0.0009***
MNWP	GLM	0.0028	-0.0017	0.0073	0.23
PNEC	GLM	-0.0072	-0.012	-0.0026	0.003**
PNEG	GLM	0.0063	0.0016	0.011	0.012*
PNEP	GLM	-0.0031	-0.0073	0.0010	0.14
PSWC	GLM	0.0013	-0.0038	0.0064	0.61
PSWG	GLM	0.0017	-0.0030	0.0065	0.47
PSWP	GLM	-0.0073	-0.012	-0.0028	0.002**
SAC	GLM	-0.0043	-0.0090	0.00047	0.083.
SAG	GLM	0.0034	-0.0012	0.0079	0.15
SAP	GLM	N/A	N/A	N/A	N/A

Cyanobacteria

Intercept (BSAP_Coral Mortality)	GLM	0.12	0.099	0.14	<0.0001***
Reef State: Regime Shift	GLM	0.027	-0.0033	0.057	0.087.
MEC	GLM	-0.016	-0.047	0.016	0.34
MEG	GLM	N/A	N/A	N/A	N/A
MEP	GLM	0.016	-0.015	0.046	0.32

	MNWC	GLM	-0.019	-0.046	0.0065	0.16
	MNWG	GLM	-0.020	-0.046	0.0057	0.15
	MWC	GLM	-0.029	-0.055	-0.0046	0.031*
	MWG	GLM	0.0094	-0.021	0.039	0.54
	PNEC	GLM	0.010	-0.033	0.060	0.66
	PSWG	GLM	-0.0014	0.031	0.027	0.92
	SAP	GLM	-0.048	-0.073	-0.024	0.0006***
Green Macroalgae						
	Intercept (BSAP_Coral Mortality)	GLM	0.10	0.096	0.11	<0.0001***
	Reef State: Regime Shift	GLM	-0.0015	-0.012	0.0093	0.78
	CNEG	GLM	-0.016	-0.025	-0.0063	0.002**
	CSWC	GLM	-0.0052	-0.015	0.0047	0.31
	MEC	GLM	0.022	0.11	0.033	0.0004***
	PNEC	GLM	-0.012	-0.022	-0.0015	0.031*
	PNEG	GLM	0.00082	-0.010	0.012	0.88
	PSWC	GLM	0.014	0.0010	0.026	0.042*
	PSWG	GLM	-0.010	-0.021	-0.00012	0.056.
	PSWP	GLM	0.00067	-0.0095	0.011	0.90
	SAC	GLM	0.0034	-0.0069	0.014	0.52
	SAG	GLM	N/A	N/A	N/A	N/A
Soft Coral						
	Intercept (MEC_Coral Mortality)	GLM	0.018	0.16	0.20	<0.0001***
	Reef State: Regime Shift	GLM	-0.00021	-0.053	0.060	0.99
	MEP	GLM	0.021	-0.018	0.062	0.32
	MNWC	GLM	0.0088	-0.024	0.042	0.61
	MNWG	GLM	0.027	-0.0074	0.063	0.13
	MNWP	GLM	-0.0046	-0.037	0.027	0.78
	MWC	GLM	-0.027	-0.057	0.0031	0.090.
	MWG	GLM	0.021	-0.014	0.055	0.25
	MWP	GLM	0.016	-0.018	0.050	0.37
	PNEG	GLM	0.00012	-0.032	0.033	0.99
	PSWG	GLM	N/A	N/A	N/A	N/A
Sponge						
	Intercept (CNEG_Coral Mortality)	GLM	1.2	1.0	1.3	<0.0001***
	Reef State: Regime Shift	GLM	-0.041	-0.31	0.24	0.77
	CSWC	GLM	0.030	-0.25	0.30	0.83
	MEG	GLM	-0.041	-0.42	0.37	0.84
	MEP	GLM	-0.026	-0.24	0.19	0.81
	MNWG	GLM	0.022	-0.19	0.24	0.84
	MWC	GLM	0.011	-0.20	0.23	0.92
	MWG	GLM	-0.030	-0.24	0.18	0.78

	MWP	GLM	-0.024	-0.24	0.19	0.83
	PNEC	GLM	0.23	-0.09	0.51	0.13
	PNEG	GLM	0.0041	-0.27	0.30	0.98
	PSWC	GLM	0.12	-0.29	0.57	0.59
	PSWG	GLM	-0.054	-0.26	0.15	0.61
	SAG	GLM	-0.011	-0.22	0.20	0.92
	SAP	GLM	N/A	N/A	N/A	N/A
Turf Algae						
	Intercept (BSAP_Coral Mortality)	GLM	0.068	0.059	0.078	<0.0001***
	Reef State: Regime Shift	GLM	0.11	0.062	0.18	0.0002***
	CNEG	GLM	-0.060	-0.12	-0.0068	0.048*
	CSWC	GLM	-0.97	-0.16	-0.045	0.0014**
	MEC	GLM	-0.78	-0.14	-0.026	0.0098**
	MNWC	GLM	0.056	0.037	0.077	<0.0001***
	MNWG	GLM	0.053	0.034	0.072	<0.0001***
	MNWP	GLM	0.057	0.037	0.079	<0.0001***
	MWC	GLM	0.044	0.023	0.067	0.0002***
	MWG	GLM	0.039	0.021	0.056	<0.0001***
	PNEC	GLM	-0.084	-0.15	-0.031	0.0059**
	PNEG	GLM	0.064	0.044	0.085	<0.0001***
	PNEP	GLM	0.068	0.046	0.092	<0.0001***
	PSWC	GLM	-0.13	-0.20	-0.084	<0.0001***
	PSWG	GLM	0.049	0.030	0.070	<0.0001***
	PSWP	GLM	-0.030	-0.095	0.026	0.33
	SAC	GLM	-0.057	-0.12	-0.0039	0.059.
	SAG	GLM	0.067	0.038	0.099	<0.0001***
	SAP	GLM	N/A	N/A	N/A	N/A
Zoanthids						
	Intercept (BSAP_Coral Mortality)	GLM	0.25	0.19	0.32	<0.0001***
	Reef State: Regime Shift	GLM	-0.011	-0.095	0.071	0.80
	CNEG	GLM	0.014	-0.074	0.11	0.76
	MEG	GLM	0.0069	-0.11	0.16	0.92
	MEP	GLM	-0.00023	-0.10	0.11	0.99
	MNWC	GLM	-0.17	-0.24	-0.11	<0.0001***
	MNWG	GLM	-0.17	-0.24	-0.11	<0.0001***
	MNWP	GLM	-0.17	-0.24	-0.11	<0.0001***
	MWC	GLM	-0.072	-0.15	0.00014	0.065.
	MWG	GLM	-0.050	-0.14	0.048	0.30
	MWP	GLM	0.21	0.093	0.33	0.0014**
	PNEC	GLM	0.012	-0.070	0.096	0.78
	PNEG	GLM	-0.033	-0.15	0.11	0.61

PNEP	GLM	-0.0067	-0.11	0.11	0.90
PSWC	GLM	-0.0044	-0.084	0.077	0.91
PSWG	GLM	-0.13	-0.21	-0.059	0.0012**
PSWP	GLM	-0.0077	-0.086	0.073	0.85
SAG	GLM	-0.095	-0.17	-0.026	0.012*
SAP	GLM	N/A	N/A	N/A	N/A

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1066 **Supp. Table 3.** Model (2) for the CoV of each nutrient measurement in each bioindicator across all sites: CoV ~
 1067 Bioindicator + Reef State + Site. Model type selected for each individual model based on normality of
 1068 distribution. Sediment (SED) values were not available and so were not included for C-based signatures.
 1069 Significance is noted as: '****' p < 0.001; '***' p < 0.01; '**' p < 0.05; and '.' p < 0.1.

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Bioindicator	Model Type	Estimate	Lower C.I. (%)	Upper C.I. (%)	p-value
$\Delta^{15}\text{N}$					
Intercept (BM_BSAP_Coral Mortality)	GLM	0.26	0.17	0.37	<0.0001****
CYB	GLM	-0.083	-0.16	-0.012	0.027*
GM	GLM	0.17	0.042	0.33	0.019*
SC	GLM	-0.059	-0.14	0.028	0.17
SED	GLM	-0.086	-0.15	-0.027	0.008**
SP	GLM	-0.071	-0.14	-0.0011	0.053.
TA	GLM	-0.099	-0.17	-0.038	0.003**
ZO	GLM	0.11	0.0077	0.21	0.042*
Reef State: Regime Shift	GLM	-0.056	-0.18	0.066	0.36
CNEG	GLM	0.048	-0.077	0.18	0.45
CSWC	GLM	-0.045	-0.15	0.042	0.35
MEC	GLM	0.15	-0.0048	0.34	0.079.
MEG	GLM	-0.064	-0.17	0.018	0.16
MEP	GLM	-0.082	-0.19	0.015	0.12
MNWC	GLM	-0.051	-0.17	0.058	0.37
MNWG	GLM	-0.0048	-0.13	0.12	0.94
MNWP	GLM	-0.069	-0.18	0.037	0.21
MWC	GLM	-0.053	-0.17	0.048	0.32
MWG	GLM	0.16	-0.0079	0.36	0.083.
MWP	GLM	-0.047	-0.17	0.079	0.45
PNEC	GLM	-0.034	-0.14	0.057	0.49
PNEG	GLM	-0.051	-0.17	0.054	0.36
PNEP	GLM	-0.050	-0.17	0.074	0.42
PSWC	GLM	0.12	-0.056	0.34	0.24
PSWG	GLM	-0.0037	-0.13	0.11	0.95
PSWP	GLM	0.024	-0.095	0.14	0.68
SAC	GLM	0.017	-0.10	0.14	0.78
SAG	GLM	-0.019	-0.14	0.11	0.76
SAP	GLM	N/A	N/A	N/A	N/A
$\Delta^{13}\text{C}$					
Intercept (BM_BSAP_Coral Mortality)	LM	-6.5	-10.0	-3.0	0.0004****
CYB	LM	-0.93	-3.8	1.9	0.52
GM	LM	4.2	1.4	7.0	0.004**
SC	LM	0.61	-2.6	3.8	0.70
SP	LM	4.9	2.1	7.7	0.0008****
TA	LM	1.4	-1.1	3.9	0.26
ZO	LM	1.2	-1.4	3.7	0.37
Reef State: Regime Shift	LM	0.72	-4.0	5.4	0.76
CNEG	LM	-2.1	-6.8	2.5	0.36
CSWC	LM	-0.21	-5.2	4.7	0.93
MEC	LM	1.8	-3.1	6.7	0.46
MEG	LM	2.9	-3.2	8.9	0.35
MEP	LM	-0.48	-4.9	3.9	0.83
MNWC	LM	-3.3	-8.0	1.4	0.16
MNWG	LM	-1.1	-5.5	3.3	0.62
MNWP	LM	1.2	-3.2	5.6	0.58
MWC	LM	-1.0	5.4	3.4	0.64

MWG	LM	1.3	-3.1	5.7	0.56
MWP	LM	-0.61	-5.8	4.5	0.81
PNEC	LM	-0.73	-3.2	3.9	0.75
PNEG	LM	-0.41	-4.8	4.0	0.85
PNEP	LM	-0.17	-6.8	3.4	0.50
PSWC	LM	-1.3	-6.2	3.6	0.59
PSWG	LM	1.6	-2.5	5.6	0.44
PSWP	LM	0.62	-4.3	5.5	0.80
SAC	LM	-3.6	-8.9	1.7	0.18
SAG	LM	3.3	-1.1	7.7	0.14
SAP	LM	N/A	N/A	N/A	N/A
%N					
Intercept (BM_BSAP_Coral Mortality)	GLM	14.8	-6.4	36.0	0.17
CYB	GLM	8.8	-8.8	26.4	0.33
GM	GLM	-3.7	-20.4	13.1	0.67
SC	GLM	14.6	-5.0	34.1	0.15
SED	GLM	5.2	-8.9	19.4	0.47
SP	GLM	5.0	-11.3	21.4	0.55
TA	GLM	7.2	-9.4	23.8	0.40
ZO	GLM	1.0	-13.8	15.8	0.89
Reef State: Regime Shift	GLM	-11.0	-37.7	15.8	0.42
CNEG	GLM	12.8	-12.9	38.5	0.33
CSWC	GLM	1.4	-25.6	28.2	0.92
MEC	GLM	0.050	-28.1	28.2	0.99
MEG	GLM	3.1	-27.8	34.0	0.85
MEP	GLM	0.18	-25.3	25.7	0.99
MNWC	GLM	-8.1	-35.1	18.9	0.56
MNWG	GLM	-2.0	-27.6	23.6	0.88
MNWP	GLM	-8.4	-37.0	20.2	0.57
MWC	GLM	-0.33	-27.1	26.4	0.98
MWG	GLM	7.3	-18.4	33.0	0.58
MWP	GLM	3.9	-24.7	32.5	0.79
PNEC	GLM	8.5	17.1	34.2	0.52
PNEG	GLM	-3.1	-28.1	21.8	0.81
PNEP	GLM	-1.1	-29.6	27.4	0.94
PSWC	GLM	5.8	-21.0	32.6	0.67
PSWG	GLM	16.5	-7.6	40.7	0.18
PSWP	GLM	8.2	-18.6	34.9	0.55
SAC	GLM	5.9	-20.9	32.7	0.67
SAG	GLM	-7.9	-33.7	17.8	0.55
SAP	GLM	N/A	N/A	N/A	N/A
%C					
Intercept (BM_BSAP_Coral Mortality)	GLM	0.34	0.053	0.84	0.075
CYB	GLM	-0.13	-0.22	-0.047	0.004**
GM	GLM	0.023	-0.10	0.16	0.72
SC	GLM	0.081	-0.059	0.24	0.29
SP	GLM	-0.017	-0.12	0.093	0.76
TA	GLM	0.21	0.060	0.37	0.011*
ZO	GLM	-0.19	-0.27	-0.12	<0.0001***
Reef State: Regime Shift	GLM	-0.046	-0.53	0.22	0.80
CNEG	GLM	-0.083	-0.22	0.0058	0.13
CSWC	GLM	0.038	-0.19	0.32	0.77
MEC	GLM	0.065	-0.14	0.33	0.58
MEG	GLM	0.055	-0.16	0.37	0.67
MEP	GLM	-0.13	-0.63	0.15	0.48
MNWC	GLM	-0.11	-0.61	0.18	0.56
MNWG	GLM	-0.12	-0.61	0.18	0.57
MNWP	GLM	-0.13	-0.62	0.17	0.54

MWC	GLM	-0.13	-0.63	0.15	0.48
MWG	GLM	-0.12	-0.62	0.17	0.54
MWP	GLM	-0.088	-0.59	0.21	0.65
PNEC	GLM	-0.091	-0.22	-0.0019	0.097.
PNEG	GLM	-0.065	-0.58	0.28	0.75
PNEP	GLM	-0.11	-0.61	0.18	0.56
PSWC	GLM	-0.080	-0.21	0.011	0.15
PSWG	GLM	-0.096	-0.59	0.20	0.62
PSWP	GLM	-0.097	-0.23	-0.018	0.072.
SAC	GLM	-0.091	-0.29	0.15	0.39
SAG	GLM	-0.075	-0.58	0.23	0.70
SAP	GLM	-0.13	-0.63	0.16	0.49

C:N Ratio

Intercept (BM_BSAP_Coral Mortality)	GLM	2.6	-20.0	25.2	0.82
CYB	GLM	1.9	-9.7	13.5	0.75
GM	GLM	-4.9	-15.5	5.8	0.37
SC	GLM	0.14	-11.9	12.2	0.98
SP	GLM	-5.9	-16.6	4.7	0.28
TA	GLM	-0.87	-10.2	8.5	0.86
ZO	GLM	9.2	-0.46	18.9	0.066.
Reef State: Regime Shift	GLM	0.65	-21.2	22.5	0.95
CNEG	GLM	13.2	-5.2	31.6	0.17
CSWC	GLM	5.6	-13.9	25.0	0.58
MEC	GLM	4.1	-15.3	23.5	0.68
MEG	GLM	8.6	-15.0	32.2	0.48
MEP	GLM	1.6	-22.0	26.1	0.90
MNWC	GLM	4.0	-21.1	29.2	0.75
MNWG	GLM	5.2	-19.3	29.7	0.68
MNWP	GLM	1.2	-24.4	26.7	0.93
MWC	GLM	18.0	-6.6	42.5	0.16
MWG	GLM	17.8	-6.77	42.3	0.16
MWP	GLM	8.0	-18.9	34.9	0.56
PNEC	GLM	14.7	-3.0	32.5	0.11
PNEG	GLM	9.9	-14.7	34.5	0.43
PNEP	GLM	4.0	-22.7	30.7	0.77
PSWC	GLM	3.1	-16.2	22.4	0.75
PSWG	GLM	14.4	-9.1	37.9	0.23
PSWP	GLM	1.7	-17.6	21.0	0.86
SAC	GLM	8.6	-12.3	29.5	0.42
SAG	GLM	8.5	16.1	33.1	0.50
SAP	GLM	12.0	-12.5	36.4	0.34

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1082 **Supp. Table 4.** Generalised Linear Model (3) for the cost-effectiveness analyses to determine the effect of
 1083 Bioindicator, Task, Reef State and the interaction between them on the time per unit sample (per hour): Time ~
 1084 Bioindicator * Task * Reef State. Normality inspected using visual plots. Significance is noted as: ‘***’ p <
 1085 0.001; ‘**’ p < 0.01; ‘*’ p < 0.05; and ‘,’ p < 0.1.
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	Intercept	Lower C.I. (2.5%)	Upper C.I. (97.5%)	p-value
BM (Intercept)	-1.33	-1.89	-0.767	<0.0001***
CYB	0.0109	-0.498	0.520	0.966
GM	0.00803	-0.689	0.704	0.982
SC	1.50	0.831	2.16	<0.0001***
SED	-1.37	-1.85	-0.891	<0.0001***
SP	1.49	0.838	2.15	<0.0001***
TA	1.45	0.864	2.13	<0.0001***
ZO	1.49	1.01	1.97	<0.0001***
DRY-CRUSH	26.0	25.3	26.7	<0.0001***
FIELD	1.40	0.719	2.08	<0.0001***
SIA	1.51	0.830	2.19	<0.0001***
WEIGH	2.84	2.43	3.25	<0.0001***
REEF STATE- REGIME	0.00376	-0.873	0.881	0.993
SHIFT				
CYB-DRY	-1.91	-2.63	-1.19	<0.0001***
GM-DRY	-0.562	-1.55	0.424	0.264
SC-DRY	-3.94	-4.79	-3.094	<0.0001***
SED-DRY	-0.681	-1.36	-0.00183	0.0500*
SP-DRY	-3.83	-4.66	-3.00	<0.0001***
TA-DRY	-1.48	-2.27	-0.684	0.000293***
ZO-DRY	-3.10	-3.78	-2.42	<0.0001***
CYB-FIELD	0.237	-0.483	0.957	0.519
GM-FIELD	0.0864	-0.899	1.072	0.864
SC-FIELD	-1.42	-2.27	-0.573	0.00109**
SED-FIELD	1.32	0.636	2.00	0.000166***
SP-FIELD	-1.46	-2.29	-0.629	<0.000620***
TA-FIELD	-1.55	-2.34	-0.753	<0.000152***
ZO-FIELD	-1.45	-2.13	-0.767	<0.0001***
CYB-SIA	0.0336	-0.686	0.753	0.927
GM-SIA	0.0158	-0.970	1.00	0.975
SC-SIA	-1.26	-2.12	-0.410	0.00380**
SED-SIA	1.40	0.720	2.08	<0.0001***
SP-SIA	-1.29	-2.12	-0.459	0.00246**
TA-SIA	-1.43	-2.22	-0.635	0.000461***
ZO-SIA	-1.25	-1.92	-0.566	0.000361***
CYB-WEIGH	NA	NA	NA	NA
GM-WEIGH	NA	NA	NA	NA
SC-WEIGH	0.0198	-0.632	0.672	0.953
SED-WEIGH	NA	NA	NA	NA
SP-WEIGH	0.0476	-0.585	0.675	0.889
TA-WEIGH	0.00659	-0.576	0.590	0.982
ZO-WEIGH	NA	NA	NA	NA
CYB-REGIME	-0.00667	-0.799	0.785	0.987
GM-REGIME	-0.0157	-0.868	0.837	0.971
SC-REGIME	-0.00710	-1.39	1.38	0.992
SED-REGIME	0.0110	-0.665	0.687	0.975
SP-REGIME	-0.00376	-1.046	1.038	0.994
TA-REGIME	-0.00710	-0.991	0.976	0.989
ZO-REGIME	-0.00376	-0.721	0.713	0.992
DRY-REGIME	0.203	-0.811	1.22	0.695
FIELD-REGIME	-0.0627	-1.08	0.951	0.904
SIA-REGIME	-0.00429	-1.02	1.01	0.993
WEIGH-REGIME	<0.0001	-0.714	0.714	1.00
CYB-DRY-REGIME	1.13	0.0128	2.25	0.0480*
GM-DRY-REGIME	-0.194	-1.40	1.01	0.752
SC-DRY-REGIME	-0.313	-2.14	1.50	0.737
SED-DRY-REGIME	0.0877	-0.869	1.04	0.857

SP-DRY-REGIME	0.518	-0.771	1.81	0.431
TA-DRY-REGIME	-0.343	-1.54	0.850	0.573
ZO-DRY-REGIME	-0.176	-1.90	0.838	0.734
CYB-FIELD-REGIME	0.149	-0.972	1.27	0.795
GM-FIELD-REGIME	-0.0465	-1.25	1.16	0.940
SC-FIELD-REGIME	0.969	-0.854	2.79	0.298
SED-FIELD-REGIME	0.0462	-0.910	1.00	0.925
SP-FIELD-REGIME	0.443	-0.846	1.73	0.501
TA-FIELD-REGIME	0.0873	-1.11	1.28	0.886
ZO-FIELD-REGIME	0.259	-0.755	1.27	0.617
CYB-SIA-REGIME	-0.0562	-1.18	1.06	0.922
GM-SIA-REGIME	-0.0279	-1.23	1.18	0.964
SC-SIA-REGIME	0.520	-1.30	2.34	0.577
SED-SIA-REGIME	0.0742	-0.882	1.03	0.879
SP-SIA-REGIME	-0.0365	-1.33	1.25	0.956
TA-SIA-REGIME	0.233	-0.970	1.42	0.714
ZO-SIA-REGIME	0.0749	-1.09	0.939	0.885
CYB-WEIGH-REGIME	NA	NA	NA	NA
GM-WEIGH-REGIME	NA	NA	NA	NA
SC-WEIGH-REGIME	0.164	-1.51	1.84	0.848
SED-WEIGH-REGIME	NA	NA	NA	NA
SP-WEIGH-REGIME	-<0.0001	-1.07	1.07	1.00
TA-WEIGH-REGIME	0.0133	-0.939	0.965	0.978
ZO-WEIGH-REGIME	NA	NA	NA	NA

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