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Standardization of *in situ* coral bleaching measurements highlights the variability in responses across genera, morphologies, and regions

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ABSTRACT

Marine heatwaves and regional coral bleaching events have become more frequent and severe across the world's oceans over the last several decades due to global climate change. Observational studies have documented spatiotemporal variation in the responses of reef-building corals to thermal stress within and among taxa across geographic scales. Although many tools exist for predicting, detecting, and quantifying coral bleaching, it remains difficult to compare bleaching severity (e.g., percent cover of bleached surface areas) among studies and across species or regions. For this review, we compiled over 2,100 in situ coral bleaching observations representing 87 reef-building coral genera and 250 species of common morphological groups from a total of 74 peerreviewed scientific articles, encompassing three broad geographic regions (Atlantic, Indian, and Pacific Oceans). While bleaching severity was found to vary by region, genus, and morphology, we found that both genera and morphologies responded differently to thermal stress across regions. These patterns were complicated by (i) inconsistent methods and response metrics across studies; (ii) differing ecological scales of observations (*i.e.*, individual colony-level vs. population or community-level); and (iii) temporal variability in surveys with respect to the onset of thermal stress and the chronology of bleaching episodes. To improve cross-study comparisons, we recommend that future surveys prioritize measuring bleaching in the same individual coral colonies over time and incorporate the severity and timing of warming into their analyses. By reevaluating and standardizing the ways in which coral bleaching is quantified, researchers will be able to track responses to marine heatwaves with increased rigor, precision, and accuracy.

Subjects Ecology, Marine Biology, Climate Change BiologyKeywords Coral reefs, Thermal stress, Dysbiosis, Climate change, Marine heatwaves

INTRODUCTION

Reviewing the causes and consequences of coral bleaching

Reef-building corals, the ecosystem engineers for tropical coral reefs, exist in a mutualistic symbiosis with photosynthetic dinoflagellate symbionts (Symbiodiniaceae; *LaJeunesse et al., 2018*) that support coral nutrition and growth (*Muscatine & Porter, 1977*). However,

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environmental stress—notably, marine heatwaves—can push this symbiosis into a state of dysbiosis, with the coral losing its symbionts in a process termed "coral bleaching". Bleaching increases a coral's vulnerability to complete or partial mortality, disease, and colony fragmentation, and can reduce coral growth and/or reproduction (e.g., Baird & Marshall, 2002; Brown, 1997; Buddemeier, Kleypas & Aronson, 2004; Hoegh-Guldberg, 1999; *Jokiel & Brown*, 2004). This can be exacerbated by prolonged duration (weeks to months) and/or increased magnitude of thermal stress (*Cook et al.*, 1990). However, corals can recover from bleaching once non-stressful conditions are restored (Jones & Yellowlees, 1997). During this period of dysbiosis and post-stress recovery, corals can compensate for the lack of symbiont-derived nutrition by feeding heterotrophically on suspended particles and plankton (Fox et al., 2019; Grottoli, Rodrigues & Palardy, 2006; Palardy, Rodrigues & Grottoli, 2008) or relying on the consumption of energy reserves, such as lipids, to sustain metabolism (Grottoli, Rodrigues & Juarez, 2004; Porter et al., 1989; Rodrigues & Grottoli, 2007; Wall et al., 2019). Ultimately, corals surviving bleaching events may undergo shifts in their endosymbiont community assemblages to promote thermal tolerance (e.g., Kemp et al., 2014; Jones et al., 2008). To better understand the dynamics of coral bleaching and recovery—as well as the individual, local, or regional factors contributing to bleaching susceptibility or tolerance-there is a need for more precise colony-level data incorporating the severity of bleaching responses and the trajectory of bleaching recovery in relation to local and regional environmental conditions.

Many environmental triggers aside from warming can result in (or exacerbate) coral bleaching, including reduced salinity (e.g., Goreau, 1964; Van Woesik, De Vantier & Glazebrook, 1995), solar radiation (e.g., Brown et al., 1994; Lesser et al., 1990), and bacterial infection (e.g., Brown, 1997; Kushmaro et al., 1996). However, widespread coral bleaching events are largely due to marine heatwaves that cause anomalously high seawater temperatures and are driven by global climate change (Heron et al., 2016; Hughes et al., 2017a; Spalding & Brown, 2015). Mass coral bleaching events (*i.e.*, multiple geographic locations experiencing bleaching simultaneously) occur in areas of high accumulated thermal stress, where sea surface temperatures (SST) have exceeded the local bleaching threshold (*i.e.*, one degree Celsius above maximum monthly mean) for multiple consecutive weeks. Mass coral bleaching was first described in scientific literature in 1984, following the severe El Niño-Southern Oscillation (ENSO) event from 1982–1983 (Glynn, 1984). As of 2011, regional bleaching has been documented over 7,000 independent times worldwide (ReefBase; Donner, Rickbeil & Heron, 2017). In the span of the past few decades, bleaching has been reported in nearly every location where coral reefs exist across the globe (Fig. 1, data obtained from ReefBase and Donner, Rickbeil & Heron, 2017). In an effort to catalog these bleaching events and their consequences, a historical coral bleaching database has been compiled (https://simondonner.com/bleachingdatabase/) which is currently the most comprehensive archive of bleaching records publicly available. This archive combines observations from the non-profit global information system, ReefBase (http://www.reefbase.org), with reports by researchers and reef managers. For instance, the Great Barrier Reef predominantly suffered from a regional coral bleaching event in 2002 while the 2005 event was centralized on the Caribbean (Fig. 2, data obtained from ReefBase



Figure 1 Mapping all areas historically affected by mass coral bleaching. World map showing the location and severity of mass coral bleaching events from 1963 to 2011 (*Donner, Rickbeil & Heron, 2017*). Colored circles indicate bleaching severity and light gray crosses indicate documented locations where coral reefs exist (ReefBase). Basemap source: Esri, DigitalGlobe, GeoEye, Earthstar Geographics, CNES/Airbus DS, USDA, USGS, AeroGRID, IGN, and the GIS User Community.

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and *Donner, Rickbeil & Heron, 2017*). To date, three global coral bleaching events were observed across all main tropical ocean basins in 1998, 2010, and 2015 (*Eakin, Sweatman & Brainard, 2019*; *Heron et al., 2016*). Since 1980, widespread bleaching has occurred most frequently in the western Atlantic, followed by the Indian and Pacific Ocean basins (*Hughes et al., 2018*). The 2015 global coral bleaching event lasted for an unprecedented three successive years of bleaching (2014–2017; *Eakin, Sweatman & Brainard, 2019*) in some locations and hit nearly every major tropical region on Earth (Fig. 3, data obtained from NOAA's Coral Reef Watch Program). Altogether, this has allowed for geographic explorations of patterns in bleaching prevalence.

Bleaching resistance and resilience at physiological and ecosystem scales

Resistance to thermal stress can be defined as the ability of individual corals to avoid bleaching or survive post-bleaching (*West & Salm, 2003*). It is generally accepted that corals have different susceptibilities to bleaching based on taxonomy (*Marshall & Baird, 2000*; *McClanahan et al., 2004*), life history strategy (*Darling, McClanahan & Côté, 2013*), morphology (*Loya et al., 2001*; *Van Woesik et al. 2012*), colony size class (*Shenkar, Fine & Loya, 2005*), symbiont type and/or density (*Berkelmans & Van Oppen 2006*), as well as any other distinguishing characteristics. 'Weedy' genera (*i.e.,* taxa that are fast-growing, opportunistic, and able to dominate post-disturbance, such as *Acropora* or *Pocillopora* spp.) may be more sensitive to bleaching yet quicker to regain their pre-bleaching benthic cover following substantial colony mortality (*Darling, McClanahan & Côté, 2013*; *McClanahan, Graham & Darling, 2014*). Morphology is also thought to play a role, though results are often contradictory. For instance, mounding corals show high (*Marshall & Baird, 2000*) or low (*Williams et al., 2010*) resistance to thermal bleaching. Branching corals may experience more bleaching-related mortality than massive or encrusting corals (*Hoegh-Guldberg & Salvat, 1995*; *Marshall & Baird, 2000*), presumably because the thinner tissues of branching



Figure 2 Mapping spatial distributions of mass coral bleaching events. Heatmaps showing the spatial distributions of each major bleaching event between 1982 and 2010. Basemap source: Esri, DeLorme, HERE, MapmyIndia.

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Data sources: NOAA Coral Reef Watch; Eakin et al. 2017

Figure 3 Mapping the impact of the third-ever global coral bleaching event. Maps showing over 75 total locations worldwide, represented by black circles, affected by the third-ever global coral bleaching event lasting between 2014 and 2017 (*Eakin, Sweatman & Brainard, 2019*). Each map is overlaid with maximum heat stress in that respective year from NOAA's Coral Reef Watch satellite data. Basemap source: NOAA Coral Reef Watch.

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corals expose symbionts to higher light intensities (*Loya et al.*, 2001). Larger colonies with more tissue area could hypothetically have an advantage over smaller colonies during bleaching due to their higher symbiont densities, although some studies indicate otherwise (*Brandt*, 2009; *Shenkar*, *Fine & Loya*, 2005; *Wagner*, *Kramer & Van Woesik*, 2010). Tissue biomass may also correlate with bleaching resistance and high symbiont density, as species with lower tissue biomass have been found to experience increased mortality following bleaching (*Thornhill et al.*, 2011).

Additionally, it has long been posited that certain Symbiodiniaceae assemblages may be more stress-tolerant and that colonies may change the relative abundance of different co-occurring symbionts in their tissues, thereby shifting dominance (or proportions) of the symbiont community following bleaching (Kemp et al., 2014; Mieog et al., 2007; Baker, 2003; Toller, Rowan & Knowlton, 2001). Studies have since found a high degree of specificity among coral-Symbiodiniaceae associations in the long term (Lee et al., 2016; Stat et al., 2009; Thornhill, Fitt & Schmidt, 2006), implying that the uptake of new symbionts with different stress tolerance may be transient (Coffroth et al., 2010), particularly for adult corals (but see: Scharfenstein et al., 2022; Boulotte et al., 2016). Further, some coral taxa exhibit higher flexibility in their Symbiodiniaceae assemblages than others (Goulet, 2006; Putnam et al., 2012) and individual colonies may have their own 'Symbiodiniaceae signature' (Rouzé et al., 2019). The dynamics of these symbioses are also affected by environmental regimes (Baker et al., 2013; de Souza et al. 2023; de Souza et al. 2022) and the symbionts' physiological traits (Wong, Enríquez & Baker, 2021), making it difficult to predict post-bleaching recovery or mortality based solely on changes in the composition of in hospite symbiont communities.

Physical factors such as location (*e.g.*, *Sully et al.*, 2019), reef habitat type (*e.g.*, *Wagner*, *Kramer & Van Woesik*, 2010; *Wall et al.*, 2021), human population density (*e.g.*, *Sandin et al.* 2008), and/or environmental variability (*e.g.*, *Bahr*, *Rodgers & Jokiel*, 2017; *Jokiel & Brown*, 2004) may also affect bleaching outcomes, along with prior bleaching history (*e.g.*, *Brown et al.*, 2002; *Pratchett et al.*, 2013), maximum heat stress (*Claar et al.*, 2018), and local disturbance (*Baum et al.*, 2023). Depth is thought to provide a refuge for corals from solar heating and light (*Baird et al.*, 2018; *Smith et al.*, 2014) as well as driving niche partitioning of functionally distinct Symbiodiniaceae communities (*Wall et al.*, 2020). However, depth does not always confer resistance to bleaching, as has been seen in both the Caribbean (*Neal et al.*, 2014) and Pacific (*Venegas et al.*, 2019). Factors that reduce thermal stress (*e.g.*, cold-water upwelling; *Goreau et al.*, 2000), enhance water flow and flush out cytotoxic ions (*Nakamura & Van Woesik*, 2001), and decrease light stress (*e.g.*, shading from cloud cover (*Mumby et al.*, 2001)) or light absorption by dissolved organic matter (*Anderson et al.*, 2001) can determine bleaching resistance.

While coral physiological resistance pertains to the ability to withstand or not be harmed by a disturbance, the physiological resilience of corals and the ecological resilience of coral reefs is the ability for the coral holobiont or the reef community to recover from or return to pre-disturbance physiological or ecological states, respectively (*West & Salm, 2003*). The speed at which this occurs, along with the magnitude of disturbance, can also be considered when defining resilience (*Gunderson, 2000*; *Nyström, Folke & Moberg, 2000*). Ecosystem resilience is determined by either intrinsic (*e.g.*, larval production capacity and recruitment success, or the presence of herbivorous grazers (*Heenan & Williams*, 2013; *Roff & Mumby*, 2012)) or extrinsic (*e.g.*, effective management and protection (*Mellin et al.*, 2016; *Salm & Coles*, 2001)) factors. Some remote, protected reefs such as the Phoenix Islands in the central Pacific have shown evidence of increased resilience following successive heatwaves, possibly due to adaptive thermal tolerance and localized recruitment by surviving colonies (*Fox et al.*, 2021). However, the 2016 heatwave also caused severe (>50%) mortality throughout the most remote sections of the Great Barrier Reef (*Hughes et al.*, 2017*b*) and in protected areas of the Northwestern Hawaiian Islands (*Couch et al.*, 2017), where the human impacts that may further exacerbate thermal stress (*e.g.*, urbanization, nutrient pollution) or degrade reef ecosystem function (*e.g.*, overfishing) are largely absent.

Thus, in the context of global climate change, there are perhaps no refugia where corals are not threatened by marine heatwaves and regional bleaching events. By the year 2050, bleaching is predicted to occur annually for all reefs globally (*Donner et al., 2005; Van Hooidonk et al., 2014*). By 2100, with a rise in global sea surface temperatures of about 3 °C under Representative Concentration Pathway 8.5 (*Pörtner et al., 2019*; Intergovernmental Panel on Climate Change), most reefs worldwide are projected to decrease in coral cover by over 40% (*Sully, Hodgson & van Woesik, 2022*). Post-bleaching recovery, however, might be more influenced by local stressors (*e.g.*, overfishing, pollution, sedimentation, or coastal development), the absence of which may facilitate the recovery of corals with more heat-adapted Symbiodiniaceae symbionts (see *Claar et al., 2020*) and reduce the extent of bleaching. While mitigating local stressors can potentially minimize climate impact (*Donovan et al., 2020*; but see: *Bruno, Côté & Toth, 2019*), local and global stressors could also act synergistically to magnify post-bleaching mortality (*Donovan et al., 2021*).

Coral bleaching visual assessment methods

Current methods for visually assessing bleaching usually involve satellite remote sensing, aerial surveys, underwater surveys, or image analysis of transects or quadrats. While all of these methods contribute to our knowledge of bleaching severity, they operate under varying levels of taxonomic and spatial resolution (reviewed in Van Woesik et al., 2022; Fig. 4) and present their own advantages and disadvantages. Satellite remote sensing, while informative and large-scale (e.g., 5 km or 50 km resolution), relies on predictions from temperature metrics rather than in situ bleaching data (Liu et al., 2014). Other complications with remote sensing include cloud cover and the fact that bleached corals can have a similar spectral signature as sand (*Elvidge et al., 2004*). Moreover, satellites can only provide bleaching forecasts whereas aerial surveys conducted via aircrafts (e.g., Hughes et al., 2017b) or small unmanned drones (e.g., Levy et al., 2018) can map entire reefs but quantify bleaching on a reef-wide basis. However, new technologies such as fluid lensing (*Chirayath & Earle*, 2016), which uses water-transmitting wavelengths to passively image underwater objects, are now being developed to improve the use of remote sensing tools and could potentially deliver centimeter-resolution data at regional scales. Similarly, airborne mapping combined with laser-guided imaging spectroscopy and deep learning models





(*Asner et al., 2020*) can provide regional-scale quantitative estimates of reef condition but these approaches often require optimal weather conditions.

Underwater surveys (e.g., SCUBA/snorkel surveys, tow-boards) offer the opportunity to make direct observations but are more time-intensive and vary in scale from focal colony assessments to towed-diver surveys at the community or reefscape level. Alternative approaches for surveying entire reef communities are diver-led surveys at the tens-of-meters scale (*i.e.*, point-intercept and transects), which can give insights into population or colonylevel bleaching responses. Corals are often categorized as "bleached", "unbleached", or another qualitative bleaching group (McClanahan, 2004) rather than quantifying percent of color change relative to an unaffected (*i.e.*, non-bleached) conspecific colony, although this can be subject to observer bias (Siebeck et al., 2006). A color reference card (e.g., Bahr et al., 2020; Siebeck et al., 2006) can also be used to visually compare coral pigmentation in situ to "healthy" representatives, however, these color references require local ground-truthing to capture the range of color for healthy and bleached corals in a specific region (Bahr et al., 2020). Image analysis, in which bleached coral planar areas within photoquadrats taken during underwater surveys are digitally traced using computer software (e.g., Neal et al., 2017), is arguably the most precise (albeit for a more rugose coral, planar area measurements are less representative of surface areas). Still, this method can be timeconsuming (Williams et al., 2019) and subjective, particularly in distinguishing natural paling, discoloration, or partial bleaching from thermal stress-associated bleaching. Image analysis is also traditionally small-scale at the colony level, which does not always reflect the population or community as a whole. Recent machine learning initiatives, such as exclusively-automatic bleaching detection, are now being attempted by the XL Catlin

Seaview Survey (https://www.catlinseaviewsurvey.com/). Other automated classification programs such as CoralNet (*Beijbom et al., 2015*, https://coralnet.ucsd.edu/), require extensive training data to achieve a sufficient level of taxonomic resolution and cannot measure bleaching within colonies (*Bryant et al., 2017*). In the future, a combination of human-validated, computer-annotated image analysis will likely optimize efficiency and allow for thorough examination of how corals bleach over time on an individual colony basis.

While bleaching observations across all scales have merit, in order to predict regional or taxonomic responses more accurately, it is also important to acknowledge underlying physical, biological, or contextual factors. Additionally, to gain a better understanding of trends in coral bleaching and recovery, there is a need to synthesize studies that have quantified responses from multiple scales, regions, taxa, and/or morphologies. In this paper we address the ways in which these data were collected or reported, and use a standardization approach to compare data among observational studies. Our goal was to determine how bleaching severity has varied spatially, taxonomically, and/or morphologically and identify potential patterns.

SURVEY METHODOLOGY

Literature search

In 2021, we conducted a literature search to identify peer-reviewed studies that focused on observational responses of corals to thermal stress (bleaching) in situ. We sought to determine how bleaching severity varied by (i) region and/or genus, and (ii) region and/or morphology. We used pre-defined search terms in Google Scholar and Web of Science (e.g., "coral bleaching", "coral*" and "bleach*", "bleaching severity", "bleaching index", "mass bleaching") to compile existing data from studies of all-time that visually assessed coral bleaching at the population or colony level, by genus and/or species. Our literature review consisted of 74 published scientific studies; in total, there were 2,137 bleaching observations from 87 coral genera and 250 species. We then recorded the geographic location for each study, reef habitat and depth, mass bleaching event(s) experienced, time of sampling with regard to the bleaching event as noted by the authors, their method of observing or analyzing bleaching, and the study's bleaching response metric. For each individual observation, we recorded the genus and species name as noted in the original study, the current taxonomic name (updated against the World Register of Marine Species, https://www.marinespecies.org/), the general morphology or growth form for that taxon, and the quantified bleaching response according to the original study. Since coral taxa often have more than one morphology (sometimes even within the same colony), morphological classifications were not mutually exclusive both among and within studies.

Data collection and analysis

Each study-specific bleaching observation was assigned a relative bleaching severity category (*i.e.*, from "none" to "severe") based on the quantified bleaching response reported in the study itself. When data on the percentage of individual colonies covered in bleached tissue were provided, we designated >80% bleaching as "severe", 61-80% as "high", 41-60% as

"moderate", and <40% as "low". However, since not all studies used the same response metric or rating scale (*e.g.*, bleaching prevalence—defined as the proportion of colonies affected by bleaching, or Bleaching Index—a weighted average of the relative abundance of colonies within each category of bleaching severity, developed by *McClanahan* (2004)) while some studies established a new metric *ad hoc* (*e.g.*, Cross-Correlation Coefficient as a function of coral color and seawater temperature), bleaching responses in their original form were often incomparable quantitatively. To allow for adequate comparison across studies, we assigned a bleaching severity category to each non-standard bleaching observation relative to others in that particular study. For the purpose of data visualization and analysis, these were later converted to numerical scores for each bleaching severity category as follows: 0 = none, 1 = low, 2 = moderate, 3 = high, and 4 = severe.

Of all studies that quantified coral bleaching by taxon, 10 were from the Atlantic Ocean (including the Caribbean), 21 were from the Indian Ocean (including the Red Sea), and 43 were from the Pacific Ocean. Bleaching events studied ranged from 1987 to 2017, at shallow (<5 m depth) lagoon, terrace, or reef flat habitats to deeper (>15 m depth) fore reef and reef slope habitats (File S1). Results for bleaching severity, represented by the standardized numerical severity scores, were then plotted by region (*i.e.*, each of the three main tropical ocean basins), genus, and/or morphology. Since more than half of the studies did not identify corals to species, we did not have enough information to visualize bleaching severities on a taxonomic resolution finer than the genus level.

For statistical analysis, we conducted two separate aligned rank transform analyses of variance (ART-ANOVA) with Type-II sum of squares using the *ARTool* package in R software version 4.3.0 (*Kay et al., 2021; R Core Team, 2018*). Our fixed factors were either region and genus, or region and morphology, and our dependent variable was standardized bleaching severity score. We also tested for interactions between each pair of factors to see whether genera or morphologies bleached differently in different regions. We used the non-parametric ART-ANOVA rather than a standard two-way ANOVA because our response data were rank-based and thus non-continuous. Post-hoc multiple comparisons were performed using the stat_compare_means function in *ggpubr (Kassambara, 2020; Wickham, Chang & Wickham, 2016*) to identify the genera or morphologies for which regions responded differently in terms of bleaching severity. A combined three-way ANOVA with region, genus, and morphology as factors was not possible since not all morphologies were represented in all genera. Also, we only used a subset of the data since not all genera or morphologies exist in all regions, which otherwise would have led to an unbalanced design.

RESULTS

Variability in bleaching responses by genus, morphology, and/or region

The majority of bleaching observations were from the Pacific (n = 1,383 observations) followed by the Indian (n = 534) and Atlantic (n = 220) Oceans. We found that bleaching severity varied significantly by region (p = 0.001) and genus (p < 0.001; Table 1). Notably,

Table 1Aligned rank transform analysis of variance: region and genus. Statistical output from a two-
way ART-ANOVA for the effects of region and genus on bleaching severity, as well as their interaction.Only genera present in most or all regions were included. Significant (p < 0.05) factors are bolded.

Source	Df	Df.res	F value	Pr (> <i>F</i>)
Region	2	1407	6.901	0.001
Genus	19	1407	3.468	<0.001
Region * Genus	22	1407	2.868	<0.001

there was a significant interaction indicating that some genera, particularly Acropora (p = 0.0025), Favia (p < 0.001), Galaxea (p = 0.0095), and Porites (p = 0.003) responded differently by region. Acropora experienced less bleaching in the Atlantic Ocean than in the Indian or Pacific Ocean (mean bleaching severity score $= 0.8 \pm 0.3$ standard error compared to 2.4 \pm 0.2 and 1.6 \pm 0.1, respectively), where it is far more abundant and speciose (Richards, Berry & Van Oppen, 2016). Favia experienced more bleaching in the Atlantic than in the Indian or Pacific Ocean (mean bleaching severity score = 3.0 ± 0.6 compared to 1.4 ± 0.2 and 0.9 ± 0.2 ; Fig. 5). Porites bleached similarly in the Indian and Atlantic (mean bleaching severity score = 1.6 ± 0.2 and 1.6 ± 0.6 , respectively) but relatively less in the Pacific (mean bleaching severity score = 0.9 ± 0.2). Montastraea, the only other genus represented across all ocean basins, did not show differences in bleaching responses by region. Galaxea bleached significantly more in the Indian than in the Pacific Ocean (mean bleaching severity score = 1.8 ± 0.2 vs. 1.0 ± 0.2) whereas *Stylophora* was more bleached in the Pacific compared to the Indian Ocean (mean bleaching severity score $= 2.8 \pm 0.3$ vs. 1.9 ± 0.4), although the latter pattern was not found to be significant possibly due to lower sample sizes.

We also found significant effects of region (p < 0.001) and morphology (p < 0.001) on bleaching responses (Table 2). Again, there was a significant interaction between region and morphology indicating that some morphologies responded differently across regions. Specifically, massive (p = 0.002) and massive/encrusting (p = 0.004) corals bleached most in the Atlantic, followed by the Indian and Pacific Oceans (mean bleaching severity scores $= 1.9 \pm 0.1, 1.5 \pm 0.1, \text{ and } 1.4 \pm 0.1, \text{ or } 1.9 \pm 0.2, 1.4 \pm 0.1, \text{ and } 1.3 \pm 0.1, \text{ respectively}).$ In contrast, free-living corals (p = 0.004) bleached most in the Indian and Pacific Oceans compared to the Atlantic (mean bleaching severity scores = 1.8 ± 0.2 , 1.2 ± 0.3 , and 0.2 ± 0.1 , respectively). Branching corals showed particularly high variability in bleaching responses within regions (bleaching severity range = 0-4; Fig. 6) but not significantly among regions. Columnar corals (p = 0.002) bleached more in the Pacific compared to the Atlantic Ocean (mean bleaching severity score = 2.0 ± 0.3 vs. 0.7 ± 0.3). Encrusting, plating, and table/branching corals did not bleach more severely in one region over another. In general, for both morphology and genus, there was a large spread of responses within regions, suggesting that differences could have also been related to colony-specific factors such as size, symbiont community composition, previous exposure to thermal stress, or site-level local environmental variables.



Figure 5 Coral bleaching severity by genus and region. Violin plots showing the distribution of bleaching severity scores for each common coral genus across the Atlantic, Indian, and Pacific Oceans (0 = none, 1 = low, 2 = moderate, 3 = high, 4 = severe). The total number of observations by genus and region is indicated above each box. Asterisks indicate genera for which mean bleaching severity varied significantly by region.

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Table 2Aligned rank transform analysis of variance: region and morphology. Statistical output from atwo-way ART-ANOVA for the effects of region and morphology on bleaching severity, as well as their in-
teraction. Only morphologies present in most or all regions were included. Significant (p < 0.05) factors
are bolded.

Source	Df	Df.res	F value	Pr (> <i>F</i>)
Region	2	1792	16.923	<0.001
Morphology	7	1792	7.370	<0.001
Region * Morphology	13	1792	5.112	<0.001

Variability in bleaching quantification among studies

A total of 68.9% of studies (51 out of 74; Table S1) assessed bleaching *via* rapid *in situ* surveys either by snorkelers, SCUBA divers, or tow-board; whereas 18.9% of studies (14 out of 74; Table S1) used exclusively image analysis methods, either on a small scale (*e.g.*, quadrats) or larger scale (*e.g.*, transects, mosaics, or photostations). 5.4% of studies (4 out of 74; Table S1) used exclusively video analysis, while the remaining 6.8% used a combination of *in situ* surveys and image or video analysis methods.

Bleaching response metrics were widely inconsistent across studies (Table S2). For 62.2% of studies (46 out of 74; Table S2), colonies were categorized as either completely bleached, mostly, somewhat, or slightly bleached, pale or mottled, affected by bleaching, "healthy", or other *ad hoc* categories as denoted by authors. These studies used the proportion of colonies that fell within each category to quantify bleaching prevalence for a given genus and/or species. A similar approach used by 21.6% of studies (16 out of 74;



Figure 6 Coral bleaching severity by morphology and region. Violin plots showing the distribution of bleaching severity scores for each common coral morphology across the Atlantic, Indian, and Pacific Oceans (0 =none, 1 =low, 2 =moderate, 3 =high, 4 =severe). The total number of observations by genus and morphology is indicated above each box. Asterisks indicate morphologies for which mean bleaching severity varied significantly by region.

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Table S2) involved scoring colonies by their bleaching severity category (0% bleached, 1–20% bleached, 21–50% bleached, *etc.*) and calculating a weighted mean for each taxon representing bleaching index (also known as "BI", Bleaching Response, or Bleaching Mortality Index). Alternatively, rather than categorizing the bleaching state of an entire colony, 4.1% of studies (three out of 74; Table S2) estimated the percentage of surface area within a colony that appeared bleached, although these within-colony observations were much less common. 10.8% of studies (eight out of 74; Table S2) used qualitative observations (*e.g.*, "*Acropora* was more impacted than *Porites*") based on descriptions from the field. One study (*Knipp et al., 2020*) compared the Coral Watch health scores of individual colonies (*via* the color reference card from *Siebeck et al. (2006)*) against SST anomalies at the time of bleaching in order to rank taxa by their "cross-correlation coefficient". To our knowledge, this is the only study to incorporate both regional thermal stress and coral color response data.

58.1% of studies (43 out of 74; Table S3) designated bleaching observations only to coral genus rather than to the species level. Given that coral taxonomy is complicated, arbitrary whether through imagery or *in situ*, and continually changing (*Veron, 2011*), even species-specific studies sometimes grouped certain taxa by genus or species complex (*e.g.*, the *Montastraea annularis* species complex comprising *M. annularis*, *M. faveolata*, and *M. franksi*, which have since been moved to *Orbicella*). In terms of sampling time frame, observations were taken anywhere between immediately at the onset of bleaching (32.4% of studies), to weeks (27.0% of studies) or months (12.2% of studies) later, and up to a year post-bleaching (4.1% of studies; Table S4), although some of these studies also measured recovery or mortality. Only 24.3% of studies (18 out of 74; Table S4) had observations of coral bleaching at multiple time points before, during, or after the mass bleaching event.

DISCUSSION

The occurrence and magnitude of coral bleaching worldwide is increasing with the progression of climate change (Baker, Glynn & Riegl, 2008; Hughes et al., 2017a). While the field of coral reef ecology has advanced considerably in the last few decades, bleaching responses are still challenging to predict on a smaller scale (*i.e.*, taxon or colony-level, or even among adjacent conspecifics). Variability in bleaching responses is to be expected since corals have distinct bleaching thresholds related to temperature fluctuations in a given location (Carilli, Donner & Hartmann, 2012). Variability could also be linked to contextual environmental factors such as high human influence and proximity to urban areas (Sandin et al. 2008; Smith et al., 2016), although the relationship between isolation from local stressors and coral reef resilience has been contested (Baumann et al., 2022). Further, while corals with a prior history of bleaching may be more acclimatized to warmer temperatures (Coles et al., 2018; DeCarlo et al., 2019) or exhibit local adaptation (Barshis, 2015), climate change is interfering with the potential for coral adaptive mechanisms to support physiological resilience and thermal tolerance (Ainsworth et al., 2016). Indeed, cumulative and repeated thermal stress events can turn coral taxa previously deemed 'winners' into 'losers' (Grottoli et al., 2014), and responses at the population or community level can be related to the extent and intensity of prior heatwaves (Fox et al., 2021; Wall et al., 2021). Here, we reviewed the various ways in which observational bleaching measurements are taken and, after standardizing past measurements, we explored whether coral genera and morphologies showed differential bleaching responses among regions.

While coral genera have evolved independently over time and few genera are shared across regions, nor are they equally present within a given region, quantitative comparative studies such as this one can still reveal emerging patterns. Coral reefs are projected to decline in cover on a global scale (*Hughes et al., 2017a; Pandolfi et al., 2011*), yet different regions have been, and will likely continue to be, disproportionately affected by climate change impacts (*Shlesinger & Van Woesik, 2023; Sully, Hodgson & van Woesik, 2022*). Previously, coral genera were found to have contrasting susceptibilities to bleaching in different sites within Southeast Asia (*Guest et al., 2012*) and this was thought to correspond to each location's thermal history; less severe bleaching was associated with greater historical

temperature variability. Bleaching was also less common near the equator, where thermal variability is generally higher (*McClanahan et al., 2020; Sully et al., 2019*). Here, our finding that *Acropora* was less susceptible to bleaching in the Atlantic (Fig. 5) is interesting when considering Caribbean-wide mass declines of *Acropora* since the 1960s due to disease or local anthropogenic stressors (*Cramer et al., 2021; Cramer et al., 2020; Perry et al., 2015*). However, perhaps following the loss of less-resilient colonies, the remaining Atlantic acroporids are more stress-tolerant (whether through the physiological traits of the symbionts hosted, a post-disturbance shift to more thermally-tolerant symbionts, and/or acclimatization of the holobiont).

Nevertheless, given the inconsistencies in bleaching response metrics (Table S2), it is difficult to standardize results from observational studies on coral bleaching, as discussed by Grottoli et al. (2021) for experimental studies. For example, studies have reported bleaching "prevalence" (e.g., Williams et al., 2010), "susceptibility" (Chou et al., 2016; Dalton et al., 2020), "sensitivity" (Darling, McClanahan & Côté, 2013), "frequency" (Montano et al., 2010), or "severity" (Guest et al., 2016), yet these metrics are not necessarily interchangeable since they do not quantify the same aspect of bleaching. Moreover, percent bleaching can refer to either the tissue area that is bleached within a single colony (Glynn et al., 2001; *Montano et al.*, 2010) or the proportion of total colonies displaying signs of bleaching as opposed to those that were unaffected (Bruno et al., 2001; Carroll, Harrison & Adjeroud, 2017; Miller, Piniak & Williams, 2011). Thus, there is a need to consolidate not only our methods for measuring bleaching, which in themselves range in spatial scale and level of resolution (Fig. 4; Table S1), but also our terminology when reporting bleaching. A robust, consistent metric for bleaching and recovery is critical for correctly determining the factors driving these processes. Given that *in situ* observations are usually taken after the onset of bleaching (Table S4), the timing of surveys with respect to a bleaching event can also confound our interpretations of results (Claar & Baum, 2019). Further, most studies do not identify corals to the species level (Table S3) nor track colonies through time (but see: Ritson-Williams & Gates, 2020). Species-specific measurements at the individual colony level would minimize some of the uncertainty seen in bleaching responses.

Additionally, since bleaching incidence is more often observed in areas of higher accumulated thermal stress (Fig. 3), it may be necessary to take into account the magnitude and duration of thermal stress when characterizing bleaching responses. Such analyses are for the most part unprecedented (but see: *Knipp et al., 2020*, in which coral coloration was cross-correlated with temperature data) and would lend themselves to more accurate interstudy comparison. We also need to account for prior bleaching history and environmental legacies (*Bahr, Rodgers & Jokiel, 2017; Brown et al., 2002; Wall et al., 2021*), since thermal adaptation and resilience has been demonstrated in some cases (*Coles et al., 2018; Guest et al., 2012; Logan et al., 2014; Palumbi et al., 2014*). For a more nuanced perspective on bleaching, post-stress recovery, and the underlying factors contributing to resilience and/or resistance at physiological and ecosystem scales, it is important to continue monitoring the same individual coral colonies in the long term (>1 year) where possible.

CONCLUSIONS

Here, we show that *in situ* coral responses to thermal stress not only vary by region, genus, and morphology but also that some genera or morphologies have unique regional responses to thermal stress. This may be due to different regional stressors and adaptation, the duration of incurred thermal stress, and/or population or community-level differences in symbionts and holobionts. However, inconsistencies in bleaching measurements and reporting between studies can obscure specific findings as well as possible causes of this variability. Standardized, quantitatively-compatible bleaching response metrics that incorporate the severity of thermal stress and other contextual factors (*e.g.*, local stressors) would be more useful for predicting bleaching susceptibility, and will improve comparability across studies. It should be noted that this is inherently complicated since corals exist in different environmental contexts, each with their own thermal history experiencing distinct combinations of local and global stressors, and comparing one reef to another may not always be appropriate. Still, disentangling some of these discrepancies will lead to a better understanding of coral bleaching and recovery dynamics and could help to inform more effective management of coral reefs in the face of climate change.

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The authors declare there are no competing interests.

Author Contributions

- Adi Khen conceived and designed the experiments, performed the experiments, analyzed the data, prepared figures and/or tables, authored or reviewed drafts of the article, and approved the final draft.
- Christopher B. Wall analyzed the data, authored or reviewed drafts of the article, and approved the final draft.

• Jennifer E. Smith conceived and designed the experiments, authored or reviewed drafts of the article, and approved the final draft.

Data Availability

The following information was supplied regarding data availability:

The full literature review dataset (including metadata) and data subset compiled for this study as well as R code are available in the Supplementary Files.

Supplemental Information

Supplemental information for this article can be found online at http://dx.doi.org/10.7717/peerj.16100#supplemental-information.

REFERENCES

- Ainsworth TD, Heron SF, Ortiz JC, Mumby PJ, Grech A, Ogawa D, Eakin CM, Leggat
 W. 2016. Climate change disables coral bleaching protection on the Great Barrier
 Reef. Science 352:338–342 DOI 10.1126/science.aac7125.
- Anderson S, Zepp R, Machula J, Santavy D, Hansen L, Mueller E. 2001. Indicators of UV exposure in corals and their relevance to global climate change and coral bleaching. *Human and Ecological Risk Assessment: An International Journal* 7:1271–1282 DOI 10.1080/20018091094998.
- Asner GP, Vaughn NR, Heckler J, Knapp DE, Balzotti C, Shafron E, Martin RE, Neilson BJ, Gove JM. 2020. Large-scale mapping of live corals to guide reef conservation. *Proceedings of the National Academy of Sciences of the United States of America* 117:33711–33718 DOI 10.1073/pnas.2017628117.
- Bahr KD, Rodgers KuS, Jokiel PL. 2017. Impact of three bleaching events on the reef resiliency of Kāne'ohe Bay, Hawai'i. *Frontiers in Marine Science* 4:398 DOI 10.3389/fmars.2017.00398.
- Bahr KD, Severino SJ, Tsang AO, Han JJ, Richards Dona A, Stender YO, Weible RM, Graham A, McGowan AE, Rodgers KS. 2020. The Hawaiian Ko'a Card: coral health and bleaching assessment color reference card for Hawaiian corals. *SN Applied Sciences* 2:1–15 DOI 10.1007/s42452-019-1685-8.
- Baird AH, Madin JS, Álvarez-Noriega M, Fontoura L, Kerry JT, Kuo CY, Precoda K, Torres-Pulliza D, Woods RM, Zawada KJ. 2018. A decline in bleaching suggests that depth can provide a refuge from global warming in most coral taxa. *Marine Ecology Progress Series* 603:257–264 DOI 10.3354/meps12732.
- Baird A, Marshall P. 2002. Mortality, growth and reproduction in scleractinian corals following bleaching on the Great Barrier Reef. *Marine Ecology Progress Series* 237:133–141 DOI 10.3354/meps237133.
- Baker AC. 2003. Flexibility and specificity in coral-algal symbiosis: diversity, ecology, and biogeography of *symbiodinium*. *Annual Review of Ecology, Evolution, and Systematics* 34:661–689 DOI 10.1146/annurev.ecolsys.34.011802.132417.

- **Baker AC, Glynn PW, Riegl B. 2008.** Climate change and coral reef bleaching: An ecological assessment of long-term impacts, recovery trends and future outlook. *Estuarine, Coastal and Shelf Science* **80**:435–471 DOI 10.1016/j.ecss.2008.09.003.
- Baker AC, McClanahan TR, Starger CJ, Boonstra RK. 2013. Long-term monitoring of algal symbiont communities in corals reveals stability is taxon dependent and driven by site-specific thermal regime. *Marine Ecology Progress Series* 479:85–97 DOI 10.3354/meps10102.
- **Barshis DJ. 2015.** Genomic potential for coral survival of climate change. In: *Coral reefs in the Anthropocene*. Dordrecht: Springer, 133–146.
- Baum JK, Claar DC, Tietjen KL, Magel JM, Maucieri DG, Cobb KM, McDevitt-Irwin JM. 2023. Transformation of coral communities subjected to an unprecedented heatwave is modulated by local disturbance. *Science Advances* 9:eabq5615 DOI 10.1126/sciadv.abq5615.
- Baumann JH, Zhao LZ, Stier AC, Bruno JF. 2022. Remoteness does not enhance coral reef resilience. *Global Change Biology* 28:417–428 DOI 10.1111/gcb.15904.
- Beijbom O, Edmunds PJ, Roelfsema C, Smith J, Kline DI, Neal BP, Dunlap MJ, Moriarty V, Fan T-Y, Tan C-J. 2015. Towards automated annotation of benthic survey images: variability of human experts and operational modes of automation. *PLOS ONE* 10:e0130312 DOI 10.1371/journal.pone.0130312.
- **Berkelmans R, Van Oppen MJ. 2006.** The role of zooxanthellae in the thermal tolerance of corals: a 'nugget of hope' for coral reefs in an era of climate change. *Proceedings of the Royal Society B: Biological Sciences* **273**:2305–2312 DOI 10.1098/rspb.2006.3567.
- Boulotte NM, Dalton SJ, Carroll AG, Harrison PL, Putnam HM, Peplow LM, Van Oppen MJ. 2016. Exploring the *symbiodinium* rare biosphere provides evidence for symbiont switching in reef-building corals. *The ISME Journal* 10:2693–2701 DOI 10.1038/ismej.2016.54.
- Brandt M. 2009. The effect of species and colony size on the bleaching response of reefbuilding corals in the Florida Keys during the 2005 mass bleaching event. *Coral Reefs* 28:911–924 DOI 10.1007/s00338-009-0548-y.
- Brown BE. 1997. Coral bleaching: causes and consequences. *Coral Reefs* 16:S129–S138 DOI 10.1007/s003380050249.
- Brown B, Dunne R, Goodson M, Douglas A. 2002. Experience shapes the susceptibility of a reef coral to bleaching. *Coral Reefs* 21:119–126 DOI 10.1007/s00338-002-0215-z.
- Brown B, Dunne R, Scoffin T, Le Tissier M. 1994. Solar damage in intertidal corals. *Marine Ecology Progress Series* 105:219–230 DOI 10.3354/meps105219.
- **Bruno JF, Côté IM, Toth LT. 2019.** Climate change, coral loss, and the curious case of the parrotfish paradigm: why don't marine protected areas improve reef resilience? *An-nual Review of Marine Science* **11**:307–334 DOI 10.1146/annurev-marine-010318-095300.
- Bruno J, Siddon C, Witman J, Colin P, Toscano M. 2001. El Niño related coral bleaching in Palau, western Caroline Islands. *Coral Reefs* 20:127–136 DOI 10.1007/s003380100151.
- Bryant D, Rodriguez-Ramirez A, Phinn S, González-Rivero M, Brown K, Neal B, Hoegh-Guldberg O, Dove S. 2017. Comparison of two photographic methodologies

for collecting and analyzing the condition of coral reef ecosystems. *Ecosphere* **8**:1–17 DOI 10.1146/annurev-marine-010318-095300.

- **Buddemeier RW, Kleypas JA, Aronson RB. 2004.** *Potential contributions of climate change to stresses on coral reef ecosystems.* Virginia: Coral reefs and global climate change. Pew Center on Global Climate Change.
- **Carilli J, Donner SD, Hartmann AC. 2012.** Historical temperature variability affects coral response to heat stress. *PLOS ONE* **7**:e34418 DOI 10.1371/journal.pone.0034418.
- **Carroll A, Harrison PL, Adjeroud M. 2017.** Susceptibility of coral assemblages to successive bleaching events at Moorea, French Polynesia. *Marine and Freshwater Research* **68**:760–771 DOI 10.1071/MF15134.
- **Chirayath V, Earle SA. 2016.** Drones that see through waves—preliminary results from airborne fluid lensing for centimetre-scale aquatic conservation. *Aquatic Conservation: Marine and Freshwater Ecosystems* **26**:237–250 DOI 10.1002/aqc.2654.
- Chou LM, Toh TC, Toh KB, Ng CSL, Cabaitan P, Tun K, Goh E, Afiq-Rosli L, Taira D, Du RCP. 2016. Differential response of coral assemblages to thermal stress underscores the complexity in predicting bleaching susceptibility. *PLOS ONE* 11:e0159755 DOI 10.1371/journal.pone.0159755.
- **Claar DC, Baum JK. 2019.** Timing matters: survey timing during extended heat stress can influence perceptions of coral susceptibility to bleaching. *Coral Reefs* **38**:559–565 DOI 10.1007/s00338-018-01756-7.
- Claar DC, Starko S, Tietjen KL, Epstein HE, Cunning R, Cobb KM, Baker AC, Gates RD, Baum JK. 2020. Dynamic symbioses reveal pathways to coral survival through prolonged heatwaves. *Nature Communications* 11:1–10 DOI 10.1038/s41467-019-13993-7.
- Claar DC, Szostek L, McDevitt-Irwin JM, Schanze JJ, Baum JK. 2018. Global patterns and impacts of El Niño events on coral reefs: a meta-analysis. *PLOS ONE* 13:e0190957 DOI 10.1371/journal.pone.0190957.
- **Coffroth MA, Poland DM, Petrou EL, Brazeau DA, Holmberg JC. 2010.** Environmental symbiont acquisition may not be the solution to warming seas for reef-building corals. *PLOS ONE* **5**:e13258 DOI 10.1371/journal.pone.0013258.
- **Coles SL, Bahr KD, Ku'ulei SR, May SL, McGowan AE, Tsang A, Bumgarner J, Han JH. 2018.** Evidence of acclimatization or adaptation in Hawaiian corals to higher ocean temperatures. *PeerJ* **6**:e5347 DOI 10.7717/peerj.5347.
- **Cook CB, Logan A, Ward J, Luckhurst B, Berg CJ. 1990.** Elevated temperatures and bleaching on a high latitude coral reef: the 1988 Bermuda event. *Coral Reefs* **9**:45–49 DOI 10.1007/BF00686721.
- Couch CS, Burns JH, Liu G, Steward K, Gutlay TN, Kenyon J, Eakin CM, Kosaki RK. 2017. Mass coral bleaching due to unprecedented marine heatwave in Papahānaumokuākea Marine National Monument (Northwestern Hawaiian Islands). *PLOS ONE* 12:e0185121 DOI 10.1371/journal.pone.0185121.
- Cramer KL, Donovan MK, Jackson JB, Greenstein BJ, Korpanty CA, Cook GM, Pandolfi JM. 2021. The transformation of Caribbean coral communities since humans. *Ecology and Evolution* 11:10098–10118 DOI 10.1002/ece3.7808.

- Cramer KL, Jackson JB, Donovan MK, Greenstein BJ, Korpanty CA, Cook GM, Pandolfi JM. 2020. Widespread loss of Caribbean acroporid corals was underway before coral bleaching and disease outbreaks. *Science Advances* 6:eaax9395 DOI 10.1126/sciadv.aax9395.
- Dalton SJ, Carroll AG, Sampayo E, Roff G, Harrison PL, Entwistle K, Huang Z, Salih A, Diamond SL. 2020. Successive marine heatwaves cause disproportionate coral bleaching during a fast phase transition from El Niño to La Niña. *Science of the Total Environment* 715:136951 DOI 10.1016/j.scitotenv.2020.136951.
- Darling ES, McClanahan TR, Côté IM. 2013. Life histories predict coral community disassembly under multiple stressors. *Global Change Biology* **19**:1930–1940 DOI 10.1111/gcb.12191.
- DeCarlo TM, Harrison HB, Gajdzik L, Alaguarda D, Rodolfo-Metalpa R, D'Olivo J, Liu G, Patalwala D, McCulloch MT. 2019. Acclimatization of massive reef-building corals to consecutive heatwaves. *Proceedings of the Royal Society B* 286:20190235 DOI 10.1098/rspb.2019.0235.
- de Souza MR, Caruso C, Ruiz-Jones L, Drury C, Gates R, Toonen RJ. 2022. Community composition of coral associated Symbiodiniaceae differs across fine-scale environmental gradients in Kāne'ohe Bay. *Royal Society Open Science* 9:212042 DOI 10.1098/rsos.212042.
- de Souza MR, Caruso C, Ruiz-Jones L, Drury C, Gates RD, Toonen RJ. 2023. Importance of depth and temperature variability as drivers of coral symbiont composition despite a mass bleaching event. *Scientific Reports* 13:8957 DOI 10.1038/s41598-023-35425-9.
- Donner SD, Rickbeil GJ, Heron SF. 2017. A new, high-resolution global mass coral bleaching database. *PLOS ONE* 12:e0175490 DOI 10.1371/journal.pone.0175490.
- Donner SD, Skirving WJ, Little CM, Oppenheimer M, Hoegh-Guldberg O. 2005. Global assessment of coral bleaching and required rates of adaptation under climate change. *Global Change Biology* 11:2251–2265 DOI 10.1111/j.1365-2486.2005.01073.x.
- Donovan MK, Adam TC, Shantz AA, Speare KE, Munsterman KS, Rice MM, Schmitt RJ, Holbrook SJ, Burkepile DE. 2020. Nitrogen pollution interacts with heat stress to increase coral bleaching across the seascape. *Proceedings of the National Academy of Sciences of the United States of America* 117:5351–5357.
- Donovan MK, Burkepile DE, Kratochwill C, Shlesinger T, Sully S, Oliver TA, Hodgson G, Freiwald J, Van Woesik R. 2021. Local conditions magnify coral loss after marine heatwaves. *Science* 372:977–980 DOI 10.1126/science.abd9464.
- Eakin CM, Sweatman HP, Brainard RE. 2019. The 2014–2017 global-scale coral bleaching event: insights and impacts. *Coral Reefs* 38:539–545 DOI 10.1007/s00338-019-01844-2.
- Elvidge CD, Dietz JB, Berkelmans R, Andrefouet S, Skirving W, Strong AT, Tuttle BT. 2004. Satellite observation of Keppel Islands (Great Barrier Reef) 2002 coral bleaching using IKONOS data. *Coral Reefs* 23:123–132 DOI 10.1007/s00338-003-0364-8.
- Fox MD, Cohen AL, Rotjan RD, Mangubhai S, Sandin SA, Smith JE, Thorrold SR, Dissly L, Mollica NR, Obura D. 2021. Increasing coral reef resilience through

successive marine heatwaves. *Geophysical Research Letters* **48**:e2021GL094128 DOI 10.1029/2021GL094128.

- Fox MD, Elliott Smith EA, Smith JE, Newsome SD. 2019. Trophic plasticity in a common reef-building coral: insights from δ 13C analysis of essential amino acids. *Functional Ecology* 33:2203–2214 DOI 10.1111/1365-2435.13441.
- **Glynn PW. 1984.** Widespread coral mortality and the 1982–83 El Niño warming event. *Environmental Conservation* **11**:133–146 DOI 10.1017/S0376892900013825.
- **Glynn PW, Maté JL, Baker AC, Calderón MO. 2001.** Coral bleaching and mortality in Panama and Ecuador during the 1997–1998 El Niño–Southern Oscillation event: spatial/temporal patterns and comparisons with the 1982–1983 event. *Bulletin of Marine Science* **69**:79–109.
- **Goreau TF. 1964.** Mass expulsion of zooxanthellae from Jamaican reef communities after Hurricane Flora. *Science* **145**:383–386 DOI 10.1126/science.145.3630.383.
- Goreau T, McClanahan T, Hayes R, Strong A. 2000. Conservation of coral reefs after the 1998 global bleaching event. *Conservation Biology* 14:5–15 DOI 10.1046/j.1523-1739.2000.00011.x.
- Goulet TL. 2006. Most corals may not change their symbionts. *Marine Ecology Progress* Series 321:1–7 DOI 10.3354/meps321001.
- Grottoli A, Rodrigues L, Juarez C. 2004. Lipids and stable carbon isotopes in two species of Hawaiian corals, *Porites compressa* and *Montipora verrucosa*, following a bleaching event. *Marine Biology* 145:621–631 DOI 10.1007/s00227-004-1337-3.
- Grottoli AG, Rodrigues LJ, Palardy JE. 2006. Heterotrophic plasticity and resilience in bleached corals. *Nature* 440:1186–1189 DOI 10.1038/nature04565.
- Grottoli AG, Toonen RJ, van Woesik R, Vega Thurber R, Warner ME, McLachlan RH, Price JT, Bahr KD, Baums IB, Castillo K. 2021. Increasing comparability among coral bleaching experiments. *Ecological Applications* 31:e02262 DOI 10.1002/eap.2262.
- Grottoli AG, Warner ME, Levas SJ, Aschaffenburg MD, Schoepf V, McGinley M, Baumann J, Matsui Y. 2014. The cumulative impact of annual coral bleaching can turn some coral species winners into losers. *Global Change Biology* 20:3823–3833 DOI 10.1111/gcb.12658.
- Guest JR, Baird AH, Maynard JA, Muttaqin E, Edwards AJ, Campbell SJ, Yewdall K, Affendi YA, Chou LM. 2012. Contrasting patterns of coral bleaching susceptibility in 2010 suggest an adaptive response to thermal stress. *PLOS ONE* 7:e33353 DOI 10.1371/journal.pone.0033353.
- Guest J, Tun K, Low J, Vergés A, Marzinelli E, Campbell AH, Bauman A, Feary D, Chou L, Steinberg P. 2016. 27 years of benthic and coral community dynamics on turbid, highly urbanised reefs off Singapore. *Scientific Reports* 6:36260 DOI 10.1038/srep36260.
- **Gunderson LH. 2000.** Ecological resilience—in theory and application. *Annual Review of Ecology and Systematics* 425–439 DOI 10.1146/annurev.ecolsys.31.1.425.

- Heenan A, Williams ID. 2013. Monitoring herbivorous fishes as indicators of coral reef resilience in American Samoa. *PLOS ONE* 8:e79604
 DOI 10.1371/journal.pone.0079604.
- Heron SF, Maynard JA, Van Hooidonk R, Eakin CM. 2016. Warming trends and bleaching stress of the world's coral reefs 1985–2012. *Scientific Reports* 6:1–14 DOI 10.1038/s41598-016-0001-8.
- **Hoegh-Guldberg O. 1999.** Climate change, coral bleaching and the future of the world's coral reefs. *Marine and Freshwater Research* **50**:839–866 DOI 10.1071/mf99078.
- Hoegh-Guldberg O, Salvat B. 1995. Periodic mass-bleaching and elevated sea temperatures: bleaching of outer reef slope communities in Moorea, French Polynesia. *Marine Ecology Progress Series* 121:181–190 DOI 10.3354/meps121181.
- Hughes TP, Anderson KD, Connolly SR, Heron SF, Kerry JT, Lough JM, Baird AH, Baum JK, Berumen ML, Bridge TC. 2018. Spatial and temporal patterns of mass bleaching of corals in the Anthropocene. *Science* 359:80–83 DOI 10.1126/science.aan8048.
- Hughes TP, Barnes ML, Bellwood DR, Cinner JE, Cumming GS, Jackson JB, Kleypas J, Van DeLeemput IA, Lough JM, Morrison TH. 2017a. Coral reefs in the Anthropocene. *Nature* 546:82–90 DOI 10.1038/nature22901.
- Hughes TP, Kerry JT, Álvarez Noriega M, Álvarez Romero JG, Anderson KD, Baird AH, Babcock RC, Beger M, Bellwood DR, Berkelmans R. 2017b. Global warming and recurrent mass bleaching of corals. *Nature* 543:373–377 DOI 10.1038/nature21707.
- Jokiel PL, Brown EK. 2004. Global warming, regional trends and inshore environmental conditions influence coral bleaching in Hawaii. *Global Change Biology* **10**:1627–1641 DOI 10.1111/j.1365-2486.2004.00836.x.
- Jones AM, Berkelmans R, Van Oppen MJ, Mieog JC, Sinclair W. 2008. A community change in the algal endosymbionts of a scleractinian coral following a natural bleaching event: field evidence of acclimatization. *Proceedings of the Royal Society B: Biological Sciences* 275:1359–1365 DOI 10.1098/rspb.2008.0069.
- Jones RJ, Yellowlees D. 1997. Regulation and control of intracellular algae (=zooxanthellae) in hard corals. *Philosophical Transactions of the Royal Society of London Series B: Biological Sciences* 352:457–468 DOI 10.1098/rstb.1997.0033.
- **Kassambara A. 2020.** ggpubr:'ggplot2' based publication ready plots. R package version 0.4.0. *Available at https://CRAN.R-project.org/package=ggpubr*.
- Kay M, Elkin L, Higgins J, Wobbrock J. 2021. ARTool: aligned rank transform for nonparametric factorial ANOVAs. R package version 0.11.0. DOI 10.5281/zenodo.594511.
- Kemp DW, Hernandez-Pech X, Iglesias-Prieto R, Fitt WK, Schmidt GW. 2014. Community dynamics and physiology of *Symbiodinium* spp. before, during, and after a coral bleaching event. *Limnology and Oceanography* **59**:788–797 DOI 10.4319/lo.2014.59.3.0788.
- Knipp A, Pettijohn J, Jadot C, Hertler H. 2020. Contrasting color loss and restoration in survivors of the 2014–2017 coral bleaching event in the Turks and Caicos Islands. SN Applied Sciences 2:1–11 DOI 10.1007/s42452-019-1685-8.

- Kushmaro A, Loya Y, Fine M, Rosenberg E. 1996. Bacterial infection and coral bleaching. *Nature* **380**:396–396 DOI 10.1038/380396a0.
- LaJeunesse TC, Parkinson JE, Gabrielson PW, Jeong HJ, Reimer JD, Voolstra CR, Santos SR. 2018. Systematic revision of Symbiodiniaceae highlights the antiquity and diversity of coral endosymbionts. *Current Biology* 28:2570–2580 DOI 10.1016/j.cub.2018.07.008.
- Lee MJ, Jeong HJ, Jang SH, Lee SY, Kang NS, Lee KH, Kim HS, Wham DC, LaJeunesse TC. 2016. Most low-abundance background *Symbiodinium* spp., are transitory and have minimal functional significance for symbiotic corals. *Microbial Ecology* 71:771–783 DOI 10.1007/s00248-015-0724-2.
- Lesser M, Stochaj W, Tapley D, Shick J. 1990. Bleaching in coral reef anthozoans: effects of irradiance, ultraviolet radiation, and temperature on the activities of protective enzymes against active oxygen. *Coral Reefs* 8:225–232 DOI 10.1007/BF00265015.
- Levy J, Hunter C, Lukacazyk T, Franklin EC. 2018. Assessing the spatial distribution of coral bleaching using small unmanned aerial systems. *Coral Reefs* 37:373–387 DOI 10.1007/s00338-018-1662-5.
- Liu G, Heron SF, Eakin CM, Muller-Karger FE, Vega-Rodriguez M, Guild LS, De La Cour JL, Geiger EF, Skirving WJ, Burgess TF. 2014. Reef-scale thermal stress monitoring of coral ecosystems: new 5-km global products from NOAA coral reef watch. *Remote Sensing* 6:11579–11606 DOI 10.3390/rs61111579.
- Logan CA, Dunne JP, Eakin CM, Donner SD. 2014. Incorporating adaptive responses into future projections of coral bleaching. *Global Change Biology* 20:125–139 DOI 10.1111/gcb.12390.
- Loya Y, Sakai K, Yamazato K, Nakano Y, Sambali H, Van Woesik R. 2001. Coral bleaching: the winners and the losers. *Ecology Letters* **4**:122–131 DOI 10.1046/j.1461-0248.2001.00203.x.
- Marshall P, Baird A. 2000. Bleaching of corals on the Great Barrier Reef: differential susceptibilities among taxa. *Coral Reefs* **19**:155–163 DOI 10.1007/s003380000086.
- McClanahan T. 2004. The relationship between bleaching and mortality of common corals. *Marine Biology* 144:1239–1245 DOI 10.1007/s00227-003-1271-9.
- McClanahan T, Baird A, Marshall P, Toscano M. 2004. Comparing bleaching and mortality responses of hard corals between southern Kenya and the Great Barrier Reef, Australia. *Marine Pollution Bulletin* **48**:327–335 DOI 10.1016/j.marpolbul.2003.08.024.
- McClanahan TR, Graham NA, Darling ES. 2014. Coral reefs in a crystal ball: predicting the future from the vulnerability of corals and reef fishes to multiple stressors. *Current Opinion in Environmental Sustainability* 7:59–64 DOI 10.1016/j.cosust.2013.11.028.
- McClanahan TR, Maina JM, Darling ES, Guillaume MM, Muthiga NA, D'agata S, Leblond J, Arthur R, Jupiter SD, Wilson SK. 2020. Large geographic variability in the resistance of corals to thermal stress. *Global Ecology and Biogeography* 29:2229–2247 DOI 10.1111/geb.13191.

- Mellin C, Aaron MacNeil M, Cheal AJ, Emslie MJ, Julian Caley M. 2016. Marine protected areas increase resilience among coral reef communities. *Ecology Letters* 19:629–637 DOI 10.1111/ele.12598.
- Mieog JC, Van Oppen MJ, Cantin NE, Stam WT, Olsen JL. 2007. Real-time PCR reveals a high incidence of *Symbiodinium* clade D at low levels in four scleractinian corals across the Great Barrier Reef: implications for symbiont shuffling. *Coral Reefs* 26:449–457 DOI 10.1007/s00338-007-0244-8.
- Miller M, Piniak G, Williams D. 2011. Coral mass bleaching and reef temperatures at Navassa Island, 2006. *Estuarine, Coastal and Shelf Science* **91**:42–50 DOI 10.1016/j.ecss.2010.10.005.
- Montano S, Seveso D, Galli P, Obura DO. 2010. Assessing coral bleaching and recovery with a colour reference card in Watamu Marine Park, Kenya. *Hydrobiologia* 655:99–108 DOI 10.1007/s10750-010-0407-4.
- Mumby PJ, Chisholm JR, Edwards AJ, Andrefouet S, Jaubert J. 2001. Cloudy weather may have saved Society Island reef corals during the 1998 ENSO event. *Marine Ecology Progress Series* 222:209–216 DOI 10.3354/meps222209.
- Muscatine L, Porter JW. 1977. Reef corals: mutualistic symbioses adapted to nutrient-poor environments. *Bioscience* 27:454–460 DOI 10.2307/1297526.
- Nakamura TV, Van Woesik R. 2001. Water-flow rates and passive diffusion partially explain differential survival of corals during the 1998 bleaching event. *Marine Ecology Progress Series* 212:301–304 DOI 10.3354/meps212301.
- Neal B, Condit C, Liu G, Dos Santos S, Kahru M, Mitchell B, Kline D. 2014. When depth is no refuge: cumulative thermal stress increases with depth in Bocas del Toro, Panama. *Coral Reefs* 33:193–205 DOI 10.1007/s00338-013-1081-6.
- Neal BP, Khen A, Treibitz T, Beijbom O, O'Connor G, Coffroth MA, Knowlton N, Kriegman D, Mitchell BG, Kline DI. 2017. Caribbean massive corals not recovering from repeated thermal stress events during 2005–2013. *Ecology and Evolution* 7:1339–1353 DOI 10.1002/ece3.2706.
- Nyström M, Folke C, Moberg F. 2000. Coral reef disturbance and resilience in a human-dominated environment. *Trends in Ecology & Evolution* 15:413–417 DOI 10.1016/S0169-5347(00)01948-0.
- **Palardy JE, Rodrigues LJ, Grottoli AG. 2008.** The importance of zooplankton to the daily metabolic carbon requirements of healthy and bleached corals at two depths. *Journal of Experimental Marine Biology and Ecology* **367**:180–188 DOI 10.1016/j.jembe.2008.09.015.
- Palumbi SR, Barshis DJ, Traylor-Knowles N, Bay RA. 2014. Mechanisms of reef coral resistance to future climate change. *Science* 344:895–898 DOI 10.1126/science.1251336.
- Pandolfi JM, Connolly SR, Marshall DJ, Cohen AL. 2011. Projecting coral reef futures under global warming and ocean acidification. *Science* 333:418–422 DOI 10.1126/science.1204794.
- Perry CT, Steneck RS, Murphy GN, Kench PS, Edinger EN, Smithers SG, Mumby PJ. 2015. Regional-scale dominance of non-framework building corals on Caribbean

reefs affects carbonate production and future reef growth. *Global Change Biology* **21**:1153–1164 DOI 10.1111/gcb.12792.

- **Porter JW, Fitt WK, Spero HJ, Rogers CS, White MW. 1989.** Bleaching in reef corals: physiological and stable isotopic responses. *Proceedings of the National Academy of Sciences of the United States of America* **86**:9342–9346 DOI 10.1073/pnas.86.23.9342.
- **Pörtner H-O, Roberts DC, Masson-Delmotte V, Zhai P, Tignor M, Poloczanska E, Weyer N. 2019.** The ocean and cryosphere in a changing climate. IPCC special report on the ocean and cryosphere in a changing climate.
- Pratchett MS, McCowan D, Maynard JA, Heron SF. 2013. Changes in bleaching susceptibility among corals subject to ocean warming and recurrent bleaching in Moorea, French Polynesia. PLOS ONE 8:e70443 DOI 10.1371/journal.pone.0070443.
- Putnam HM, Stat M, Pochon X, Gates RD. 2012. Endosymbiotic flexibility associates with environmental sensitivity in scleractinian corals. *Proceedings of the Royal Society B: Biological Sciences* 279:4352–4361 DOI 10.1098/rspb.2012.1454.
- **R Core Team. 2018.** R: a language and environment for statistical computing. *Available at https://www.R-project.org/*.
- Richards ZT, Berry O, Van Oppen MJ. 2016. Cryptic genetic divergence within threatened species of *Acropora* coral from the Indian and Pacific Oceans. *Conservation Genetics* 17:577–591 DOI 10.1007/s10592-015-0807-0.
- Ritson-Williams R, Gates RD. 2020. Coral community resilience to successive years of bleaching in Kāne'ohe Bay, Hawai'i. *Coral Reefs* **39**:757–769 DOI 10.1007/s00338-020-01944-4.
- Rodrigues LJ, Grottoli AG. 2007. Energy reserves and metabolism as indicators of coral recovery from bleaching. *Limnology and Oceanography* 52:1874–1882 DOI 10.4319/lo.2007.52.5.1874.
- Roff G, Mumbay PJ. 2014. Global disparity in the resilience of coral reefs. Trends inEcology & Evolution 27:404–413 DOI 10.1016/j.tree.2012.04.007.
- Rouzé H, Lecellier G, Pochon X, Torda G, Berteaux-Lecellier V. 2019. Unique quantitative Symbiodiniaceae signature of coral colonies revealed through spatio-temporal survey in Moorea. *Scientific Reports* 9:1–11 DOI 10.1038/s41598-018-37186-2.
- Salm RV, Coles SL. 2001. Coral bleaching and marine protected areas. The Nature Conservancy, Asia Pacific Coastal Marine Program. 1–96. *Available at https://portals.iucn.org/library/efiles/documents/2001-054.pdf*.
- Sandin SA, Smith JE, De Martini EE, Dinsdale EA, Donner SD, Friedlander AM, Konotchick T, Malay M, Maragos JE, Obura D. 2008. Baselines and degradation of coral reefs in the Northern Line Islands. *PLOS ONE* 3:e1548 DOI 10.1371/journal.pone.0001548.
- Scharfenstein HJ, Chan WY, Buerger P, Humphrey C, Van Oppen MJ. 2022. Evidence for de novo acquisition of microalgal symbionts by bleached adult corals. *The ISME Journal* 16:1676–1679 DOI 10.1038/s41396-022-01203-0.
- Shenkar N, Fine M, Loya Y. 2005. Size matters: bleaching dynamics of the coral Oculina patagonica. Marine Ecology Progress Series 294:181–188 DOI 10.3354/meps294181.

- Shlesinger T, Van Woesik R. 2023. Oceanic differences in coral-bleaching responses to marine heatwaves. *Science of the Total Environment* 871:162113 DOI 10.1016/j.scitotenv.2023.162113.
- Siebeck U, Marshall N, Klüter A, Hoegh-Guldberg O. 2006. Monitoring coral bleaching using a colour reference card. *Coral Reefs* 25:453–460 DOI 10.1007/s00338-006-0123-8.
- Smith JE, Brainard R, Carter A, Grillo S, Edwards C, Harris J, Lewis L, Obura D, Rohwer F, Sala E. 2016. Re-evaluating the health of coral reef communities: baselines and evidence for human impacts across the central Pacific. *Proceedings of the Royal Society B: Biological Sciences* 283:20151985 DOI 10.1098/rspb.2015.1985.
- Smith TB, Glynn PW, Maté JL, Toth LT, Gyory J. 2014. A depth refugium from catastrophic coral bleaching prevents regional extinction. *Ecology* 95:1663–1673 DOI 10.1890/13-0468.1.
- Spalding MD, Brown BE. 2015. Warm-water coral reefs and climate change. *Science* 350:769–771 DOI 10.1126/science.aad0349.
- **Stat M, Loh W, LaJeunesse T, Hoegh-Guldberg O, Carter D. 2009.** Stability of coral– endosymbiont associations during and after a thermal stress event in the southern Great Barrier Reef. *Coral Reefs* **28**:709–713 DOI 10.1007/s00338-009-0509-5.
- Sully S, Burkepile D, Donovan M, Hodgson G, van Woesik R. 2019. A global analysis of coral bleaching over the past two decades. *Nature Communications* 10:1264 DOI 10.1038/s41467-019-09238-2.
- Sully S, Hodgson G, van Woesik R. 2022. Present and future bright and dark spots for coral reefs through climate change. *Global Change Biology* 28:4509–4522 DOI 10.1111/gcb.16083.
- Thornhill DJ, Fitt WK, Schmidt GW. 2006. Highly stable symbioses among western Atlantic brooding corals. *Coral Reefs* 25:515–519 DOI 10.1007/s00338-006-0157-y.
- Thornhill DJ, Rotjan RD, Todd BD, Chilcoat GC, Iglesias-Prieto R, Kemp DW, LaJeunesse TC, Reynolds JM, Schmidt GW, Shannon T. 2011. A connection between colony biomass and death in Caribbean reef-building corals. *PLOS ONE* 6:e29535 DOI 10.1371/journal.pone.0029535.
- **Toller WW, Rowan R, Knowlton N. 2001.** Repopulation of zooxanthellae in the Caribbean corals *Montastraea annularis* and *M. faveolata* following experimental and disease-associated bleaching. *The Biological Bulletin* **201**:360–373 DOI 10.2307/1543614.
- Van Hooidonk R, Maynard JA, Manzello D, Planes S. 2014. Opposite latitudinal gradients in projected ocean acidification and bleaching impacts on coral reefs. *Global Change Biology* 20:103–112 DOI 10.1111/gcb.12394.
- Van Woesik R, De Vantier L, Glazebrook J. 1995. Effects of Cyclone 'Joy' on nearshore coral communities of the Great Barrier Reef. *Marine Ecology Progress Series* 128:261–270 DOI 10.3354/meps128261.
- Van Woesik R, Irikawa A, Anzai R, Nakamura T. 2012. Effects of coral colony morphologies on mass transfer and susceptibility to thermal stress. *Coral Reefs* 31:633–639 DOI 10.1007/s00338-012-0911-2.

- Van Woesik R, Shlesinger T, Grottoli AG, Toonen RJ, Vega Thurber R, Warner ME, Marie Hulver A, Chapron L, McLachlan RH, Albright R. 2022. Coralbleaching responses to climate change across biological scales. *Global Change Biology* 28:4229–4250 DOI 10.1111/gcb.16192.
- Venegas RM, Oliver T, Liu G, Heron SF, Clark SJ, Pomeroy N, Young C, Eakin CM, Brainard RE. 2019. The rarity of depth refugia from coral bleaching heat stress in the western and central Pacific Islands. *Scientific Reports* 9:1–12 DOI 10.1038/s41598-018-37186-2.
- **Veron JCE. 2011.** Coral taxonomy and evolution. In: *Coral reefs: an ecosystem in transition*. Cham: Springer, 37–45.
- Wagner DE, Kramer P, Van Woesik R. 2010. Species composition, habitat, and water quality influence coral bleaching in southern Florida. *Marine Ecology Progress Series* 408:65–78 DOI 10.3354/meps08584.
- Wall CB, Kaluhiokalani M, Popp BN, Donahue MJ, Gates RD. 2020. Divergent symbiont communities determine the physiology and nutrition of a reef coral across a light-availability gradient. *The ISME Journal* 14:945–958 DOI 10.1038/s41396-019-0570-1.
- Wall CB, Ricci CA, Wen AD, Ledbetter BE, Klinger DE, Mydlarz LD, Gates RD, Putnam HM. 2021. Shifting baselines: physiological legacies contribute to the response of reef corals to frequent heatwaves. *Functional Ecology* 35:1366–1378 DOI 10.1111/1365-2435.13795.
- Wall CB, Ritson-Williams R, Popp BN, Gates RD. 2019. Spatial variation in the biochemical and isotopic composition of corals during bleaching and recovery. *Limnology and Oceanography* 64:2011–2028 DOI 10.1002/lno.11166.
- West JM, Salm RV. 2003. Resistance and resilience to coral bleaching: implications for coral reef conservation and management. *Conservation Biology* 17:956–967 DOI 10.1046/j.1523-1739.2003.02055.x.
- Wickham H, Chang W, Wickham MH. 2016. Package 'ggplot2'. Create Elegant Data Visualisations using the Grammar of Graphics Version 2:1–189.
- Williams ID, Couch CS, Beijbom O, Oliver TA, Vargas-Angel B, Schumacher BD, Brainard RE. 2019. Leveraging automated image analysis tools to transform our capacity to assess status and trends of coral reefs. *Frontiers in Marine Science* 222:1–14 DOI 10.3389/fmars.2019.00222.
- Williams GJ, Knapp IS, Maragos JE, Davy SK. 2010. Modeling patterns of coral bleaching at a remote Central Pacific atoll. *Marine Pollution Bulletin* **60**:1467–1476 DOI 10.1016/j.marpolbul.2010.05.009.
- Wong JC, Enríquez S, Baker DM. 2021. Towards a trait-based understanding of Symbiodiniaceae nutrient acquisition strategies. *Coral Reefs* **40**:625–639 DOI 10.1007/s00338-020-02034-1.