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# The promotion of stress tolerant Symbiodiniaceae dominance in juveniles of two coral species under simulated future conditions of ocean warming and acidification

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The symbiotic relationship between coral and its endosymbiotic algae, Symbiodiniaceae, greatly influences the hosts' potential to withstand environmental stress. To date, the effects of climate change on this relationship has primarily focused on adult corals. Uncovering the effects of environmental stress on the establishment and development of this symbiosis in early life stages is critical for predicting how corals may respond to climate change. To determine the impacts of future climate projections on the establishment of symbionts in juvenile corals, ITS2 amplicon sequencing of single coral juveniles was applied to Goniastrea retiformis and Acropora millepora before and after exposure to three climate conditions of varying temperature and pCO<sub>2</sub> levels (current and RCP8.5 in 2050 and 2100). Compared to ambient conditions, juvenile corals experienced shuffling in the relative abundance of Cladocopium (C1m, decrease) to Durusdinium (D1 and D1a, increase) over time. We calculated a novel risk metric incorporating functional redundancy and likelihood of impact on host physiology to identify the loss of D1a as a "low risk" to the coral compared to the loss of "higher risk" taxa like D1 and C1m. Although the increase in stress tolerant Durusdinium under future warming was encouraging for A. millepora, by 2100, G. retiformis communities displayed signs of symbiosis de-regulation, suggesting this acclimatory mechanism may have speciesspecific thresholds. Whilst this study cannot specifically disentangle the individual effects of temperature and  $pCO_2$ , it does provide valuable insights into the impacts of both stressors combined. These results emphasize the need for understanding of long-term effects of climate change induced stress on coral juveniles, and their potential for increased acclimation to heat tolerance through changes in symbiosis.

#### KEYWORDS

coral reefs, acclimation, symbiosis, Symbiodiniaceae, recruit, warming, acidification, bleaching

### Introduction

Increasing global temperatures due to anthropogenic climate change is currently the greatest threat to coral survival and has resulted in three global mass bleaching events since the 1980s (1998, 2010, 2014–2017), with bleaching becoming ever more prevalent and extreme (Hughes et al., 2017b). Coral bleaching occurs when endosymbiotic dinoflagellates (family Symbiodiniaceae) are lost from the host coral tissue. This stress response is seen as a loss of the endosymbiont due to a breakdown of the symbiotic relationship (Brown, 1997). As Symbiodiniaceae support their host's energy demands through the provisioning of photosynthates, the prolonged loss of this relationship may cause starvation, and lead to coral mortality (Brown, 1997; Suggett et al., 2017).

Known stressors of coral symbioses include, but are not limited to, increased sea surface temperatures, and increased partial pressure of carbon dioxide  $(pCO_2)$ . Elevated temperatures are linked to damage of the photosystems of coral endosymbionts, shifting the energetic demands and outputs of the symbiont (Fitt et al., 2001; Robison and Warner, 2006). This can take on a similar form to "parasitism" (sensu Baker et al., 2018), as it reduces the photosynthates translocated to the host (Baker et al., 2018). As a result, the host physiology suffers as the coral works to make up for a lack of energy by reaching into other energy storages. While the coral host can turn to heterotrophy to meet some energy demands, there is variation across coral species as to the level to which it is able to accommodate symbiont loss (Anthony et al., 2009). In addition, the increase in  $pCO_2$  into the oceans has been predicted to impact various physiological responses in both the coral host and Symbiodiniaceae (Cohen and Holcomb, 2009; Schoepf et al., 2013). While decreased calcification rates have been well-studied, other responses such as changes in respiration, and metabolism of the host and symbiont may also be impacted by increases in pCO<sub>2</sub> similar, to other phenotypic measures when examined under predicted future climate scenarios (Anthony et al., 2008).

Both stressors have grave implications for coral early life history stages, where energy demands are potentially high during skeletal development and growth as well as during symbiosis establishment. For example, calcification may also be more critical and at-risk during this stage when a coral juvenile is first recruiting and secreting skeletal structures (Foster et al., 2016). The high rates of ocean warming and  $pCO_2$  coupled with the high incidence of bleaching events may be too rapid to allow for natural adaptation to occur (Hoegh-Guldberg et al., 2007; Schoepf et al., 2013; Hughes et al., 2017a). Understanding the effects of climate change on coral– Symbiodiniaceae interactions in early life stages is therefore critical for understanding growth and recovery potentials on reefs, and predicting coral reef resilience to future climate.

Due to the critical role of the endosymbiotic Symbiodiniaceae in energy translocation within the coral host, there has been an emphasis on increased taxonomic resolution of the Symbiodiniaceae present in the host using genetic markers such as the internal transcribed spacer 2 (ITS2) region (Pochon et al., 2014; LaJeunesse et al., 2018; Davies et al., 2022). Symbiodiniaceae are comprised of 9 currently identified genera (formerly clades), each of which is subset into species (formerly "types") (LaJeunesse et al., 2018). Host environmental sensitivity often varies according to the predominant algal symbiont or community (Rowan et al., 1997). For example, colonies with different dominant Symbiodiniaceae communities experienced different bleaching patterns in locations that correlated to predicted limits of symbiont distributions (Rowan et al., 1997; Quigley et al., 2017; Claar et al., 2020; Quigley et al., 2022). These predicted limits of coral symbionts are based on observations where some Symbiodiniaceae taxa are shown to out-perform others, e.g. Durusdinium showing greater thermal tolerance than Cladocopium. In one example, adults of Acropora millepora exhibited changes in Symbiodiniaceae relative abundance towards Durusdinium that corresponded to an increase in host heat tolerance by 1-1.5 °C (Berkelmans and van Oppen, 2006). Despite few studies assessing the independent role of  $pCO_2$  on Symbiodiniaceae communities, there have been indications of the physiological effects to coral hosts which may be attributed to differences in symbiont taxa and community composition (Howe-Kerr et al., 2020). Finally, the dominance of specific Symbiodiniaceae genera within the coral host can also promote greater resilience under environmental stressors like increased sea surface temperatures or to other stressors present in the environment (Baker et al., 2004; Berkelmans and van Oppen, 2006; Stat and Gates, 2008; Stat et al., 2008; Oliver and Palumbi, 2011).

While the change in relative abundances (termed shuffling) of specific symbiont taxa may improve adult coral tolerance to environmental stress, it is less understood if symbiont shuffling is pervasive in coral early life-history stages (Reich et al., 2017; Quigley et al., 2019). Coral juveniles generally establish their initial endosymbiont community either through direct transmission from the maternal colony (vertical transmission), or via environmental acquisition (horizontal transmission) (Baird et al., 2009) or a combination of the two (mixed-mode transmission) (Quigley et al., 2018b). Vertical symbiont establishment provides the opportunity for larvae and subsequent juveniles to acquire a potentially advantageous community of endosymbionts best suited for the local, maternal environment through parental adaptation (Padilla-Gamiño et al., 2012; Quigley et al., 2016; Poland and Coffroth, 2017). Conversely, horizontal transmission can occur through other environmental sources, and it allows for more flexibility to acquire novel symbionts that could be advantageous under changing environmental conditions or after large dispersal distances (Lewis and Coffroth, 2004; Yuyama et al., 2016). Horizontal transmission can occur through the water column, sediment, or other environmental means (McIlroy and Coffroth, 2017; Ali et al., 2019; Umeki et al., 2020). Some research has indicated that coral larvae are capable of selecting and integrating new symbionts from their environment into their endosymbiotic community (LaJeunesse, 2002; Rohwer et al., 2002; Coffroth et al., 2006; LaJeunesse et al., 2009) which may promote greater rates of symbiont acquisition in early life stages (Nitschke et al., 2015;

Poland and Coffroth, 2017; Quigley et al., 2017). This ability of symbiont selection via environmental uptake allows for the transfer of beneficial symbiotic traits, and the improvement of coral tolerance to environmental stressors (Baker et al., 2004; Adams et al., 2009; Poland and Coffroth, 2017). Different Symbiodiniaceae taxa also provide the host with distinct benefits. For example, Durusdinium may provide increased survival to juveniles under simulated bleaching events (Quigley et al., 2020b; Quigley et al., 2020c). Further, growth rates vary in juveniles between those dominated by either Cladocopium or Durusdinium (Cantin et al., 2009; Yuyama and Higuchi, 2014; Quigley et al., 2020c), linked to differences in carbon translocation between genera (Cantin et al., 2009). Physiological differences also exist at finer taxonomic scales, for example, within Durusdinium "D1a" compared to "D1" might promote slightly greater photosystem II activity (Suggett et al., 2015).

Symbiont diversity varies across coral early life-history stages, in which the diversity of the symbiont community during coral juvenile development may also be important for growth, and survival. For example, there is some evidence that the acquisition of diverse communities of endosymbionts may promote higher growth rates, and increase survival (Yuyama and Higuchi, 2014). Compared to adult corals, early life-history stages (within 1 month of settlement) generally have more diverse endosymbiont communities (Quigley et al., 2017), which eventually winnow to a more stable, lower diversity community (Abrego et al., 2009; Lee et al., 2016; Rouzé et al., 2019). In some cases, symbiont communities in juvenile corals may be impacted by environmental factors. This includes the combined but not necessarily additive effects of temperature and pCO2, as well as increased temperature, and light (Abrego et al., 2012) or completely halted by increased temperatures with minimal impacts of pCO<sub>2</sub> (Sun et al., 2020). Moreover, the acquisition of symbionts during coral early life-history stages has been assessed only for a limited number of coral species (Cantin et al., 2009; Yorifuji et al., 2017; Quigley et al., 2019; Quigley et al., 2020a), and the effects of elevated temperature and pCO<sub>2</sub> on this process are poorly understood. Combined, these results highlight the importance of Symbiodiniaceae community diversity for the fitness of coral adult and early life-history stages, and highlight an increased need for a better understanding of fine-scale hostsymbiont interactions.

To assess changes in Symbiodiniaceae acquisition during coral developmental stages under future climate scenarios, two horizontally transmitting coral species, *Goniastrea retiformis* and *Acropora millepora*, were exposed to varying levels of temperature and  $pCO_2$  predicted for the years 2050 (+1°C offset,  $pCO_2$  685 ± 60ppm) and 2100 (+2°C offset,  $pCO_2$  940 ± 60ppm) under the IPCC RCP 8.5 pathway for projected greenhouse gas concentrations, and compared to present day levels (28.5°C,  $pCO_2$  400 ± 60ppm). These coral species represent different known stress tolerance levels of both stressors, as *G. retiformis* is recognized as being thermally tolerant compared to stress-sensitive *A. millepora* and so were selected to better understand how different coral species may

respond to future climate conditions. Juveniles were sampled and the ITS2 region of the symbionts was targeted using amplicon sequencing. The dynamics of symbiont community changes (prevalence, relative abundance, and diversity) were assessed under exposure to these multiple climate treatments for these coral juveniles and further assessed over time (0, 10 days and 4 weeks) for stress-tolerant *G. retiformis* or only at the final timepoint for *A. millepora*.

### Materials and methods

### Experimental design and coral sampling

In October 2017, gravid colonies of G. retiformis and A. millepora were collected from Geoffrey Bay at Magnetic Island (S 19°09.326', E 146°51.861'; Great Barrier Reef Marine Park Authority Permit Number: G13/36318.1), and transported to holding outdoor mesocosm tanks at the National Sea Simulator (SeaSim) at the Australian Institute of Marine Science as per details outlined in (Botté et al., 2020; Uthicke et al., 2020). Corals were acclimated to the following conditions (~27°C,  $pCO_2 400 \pm 60$ ppm) until spawning (G. retiformis: 8th of November 2017; A. millepora: 12<sup>th</sup> December 2017). Multiple colonies were collected, spawned during the spawning night, and mixed in bulk cultures (exact numbers per culture were not recorded). Following spawning, gametes were collected, mixed for fertilization, and larvae were reared in mass culture tanks for 3-4 weeks. Larval culturing followed established methods (Quigley et al., 2016; Pollock et al., 2017) after fertilization success was checked by visually inspecting embryos every hour for up to three hours under the magnification of a benchtop microscope. Larvae were maintained in 500 L flowthrough culture tanks at a density of 1-1.2 larva mL<sup>-1</sup>, filled with 0.2 µm filtered seawater (Pollock et al., 2017).

Larvae (n = 20 per well, 60 per plate) were then distributed to sterile, 6-well plates filled with 0.2 µm filtered seawater containing autoclaved crustose coralline algae (CCA) to induce larval settlement. These plates were not exposed to flow-through conditions, instead they were filled with water, larvae added, and then lid replaced, and left overnight in the dark for larvae to settle. At the first sampling time point of newly settled recruits (T0), individuals were sampled using a sterile scalpel, preserved in absolute ethanol in Eppendorf tubes with minimal water transfer to ensure adequate preservation, and minimize any chance of transfer of symbionts in the water (n = 3 individuals per tube). Following initial sampling, the 6-well plates were placed in outdoor mesocosm tanks (n = 3 tank replicates per treatment;  $2 \times 6$ -well plates per tank for each species) representing ambient (present day ~28.5°C, pCO<sub>2</sub> 400 ± 60ppm), 2050 (+1°C offset, pCO<sub>2</sub> 685 ± 60ppm), and 2100 (+2°C offset, pCO2 940 ± 60ppm) conditions forecast under RCP 8.5 (Meinshausen et al., 2011; Collins et al., 2013) (Supplementary Table 1). As outlined in previous studies (Botté et al., 2020; Uthicke et al., 2020), these mesocosm tanks had a

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range of flora and fauna, including fish, corals, seagrasses, and benthic sediments. Sampling was repeated across each tank after 10 days for both of the coral species in this study, at T1 (*G. retiformis*, *A. millepora*), and 4 weeks (*G. retiformis*) or 5 weeks (*A. millepora*) (T2) of exposure to simulated climate conditions. All samples were stored at  $-80^{\circ}$ C prior to DNA extraction and ITS2 amplicon sequencing of Symbiodiniaceae communities. However, due to lack of gel electrophoresis bands present in T0 and T1 *A. millepora* samples following PCR amplification, these time points were not sequenced (see "DNA extraction and sequencing" section). No other samples (e.g. water or sediment samples) were collected for sequencing. Juvenile survival was not monitored in this study.

The ambient treatment in this experiment represented average reef conditions over the past ~20 years at a well-studied central Great Barrier Reef site (Davies Reef), allowing for comparisons of symbiont acquisition under elevated temperatures and  $pCO_2$  expected by 2050, and 2100 under RCP 8.5. Corals generally live close to their thermal maximums, and +1 and +2 degrees of temperature increases impact coral offspring physiology and that of their symbionts (Abrego et al., 2012) suggesting that these treatments represent a "stress" for coral offspring.

### DNA extraction and sequencing

Genomic DNA was extracted from *G. retiformis* and *A. millepora* samples across three sampling times (T0, T1 and T2), and treatments (ambient, 2050, 2100). Note that the T0 sampling timepoint occurred immediately before juveniles were placed into the three experimental treatments. DNA extractions were performed on individual coral juveniles using a KOH-EDTA method following (Sun et al., 2014), with increased incubation time (15 minutes at 70°C) to enhance cellular lysis.

Polymerase Chain Reaction (PCR) amplification of the ITS-2 locus were conducted using MyTaq DNA Polymerase (Bioline) following manufacturer's protocols with an addition of 1µl 50mM magnesium. The ITS-2 locus was amplified using ITS2alg-F (5'-T C G T C G G C A G C G T C A G A T G T G T A T A A G A G ACAGGTGAATTGCAGAACTCCGTG) and ITS2alg-R(3'-TTCG TATATTCATTCGCCTCCGACAGAGAATATGTGTAG AGGCTCGGGTGCTCTG-5') primers. PCR was performed in 25µl reactions (2µL template) per sample. PCR conditions were the following: initial denaturation at 95°C for 10 minutes, 32 cycles at 95°C for 30 sec, 59°C for 60 sec, 72°C for 30 sec, and a final elongation at 72°C for 7 minutes. PCR amplification products were delivered to the Ramaciotti Centre for Genomics (UNSW, Sydney) for Miseq amplicon sequencing of the 300 bp ITS-2 region (LaJeunesse, 2001; LaJeunesse, 2002). No bands were retrieved during PCR amplification in A. millepora samples at T0 and T1 although optimizations were attempted. This was likely due to the extremely low densities of symbionts in these first days of symbiosis establishment, as low density has been demonstrated in other studies of A. millepora symbiosis at 40 days (Quigley et al., 2018a). Sequencing was therefore only conducted on *A. millepora* samples for T2.

### Bioinformatics and data analysis

A total of 135 individual juvenile samples were successfully sequenced (some samples were removed if PCRs did not result in bands). Of these successfully sequenced juveniles, 27 samples belonged to *A. millepora*, and 110 belonged to *G. retiformis* (see Supplementary Table 2).

Symbiodiniaceae taxonomy is currently undergoing an extensive revision (LaJeunesse et al., 2018) with substantial effort to understand how sequence diversity links with species, genus, and family designations, and most importantly, the functional significance of the symbiont within the coral. Presently, there are generally two analysis pipelines. The first groups sequences within genera (Symportal; Hume et al., 2019), and is generally good for high-abundance taxa and making broad inferences across treatments. The other is based on characterizing individual sequence variants using DADA2 (ASVs; Callahan et al., 2016; Quigley et al., 2019), and provides a higher resolution at the sequence level for exploration of potential diversity at both high and low abundances. The choice of method depends on the question being asked, where both will not render species - or functional - level designations with a formal taxonomic description. Here we chose to use the DADA2 method given our questions about the earliest uptake of symbiont cells and acknowledge that some of the ASVs discovered may be spurious sequence variants and may not represent actual Symbiodiniaceae "species" per-se. The pros and cons of each method and the justification for their use are outlined more fully in (Davies et al., 2022), and a formal comparison of the methods can be found in (Quigley et al., 2022). The DADA2 pipeline generates amplicon sequence variants based on ITS2 sequencing libraries. The ITS2 gene is highly replicated in Symbiodiniaceae and has high levels of intragenomic variation (see Quigley et al., 2014 for full discussion). The calling of ASVs therefore results in the recovery of a diversity of unique ASVs from each Symbiodiniaceae species, resulting in potentially artificially inflated diversity data (discussed in Davies et al., 2022), but offers a higher resolution approach compared to Symportal. Symportal (by design) collapses relevant species diversity when many congeneric Symbiodiniaceae species co-occur within many samples. This therefore represents an overall conservative approach, especially where we are principally focused on low-abundance, highly rare diversity given the life-stage and experimental question. However, to minimize the impact of spurious sequences, most of the analysis collapses diversity to higher levels and primarily focusses on the ten most abundant Symbiodiniaceae ASVs (>4.2% relative abundance cut-off). Neither the authors of this work nor the workshop participants formally endorse either pipeline. The full pipeline and scripts are described in (Quigley et al., 2019) and links therein. Briefly, fastq files were first filtered to

remove any reads with retained sequencing adapters using BBDuk (BBMap, package 38.63 http://sourceforge.net/projects/bbmap/) (Bushnell, 2017) in R (R Core Team, 2013). Based on quality filtering using BBDuk, reads were then assessed for low quality were trimmed by removing reads without an overlap of 30 bp and one expected error. Dereplication of reads grouped unique sequences, which eliminates any redundant comparisons in the pipeline. Culling spurious sequence variants by merging denoised forward and reverse reads and removing none-overlapping paired reads further helps to remove spurious sequences. Error rates for forward and reverse reads are learnt, both ends are merged and used as input into the DADA2 naive RDP's Bayesian classifier to assign amplicon sequence variants (hereafter ASVs). After chimera removal of 2 samples (135 remaining), the assigned taxonomy function within DADA2 was used to classify ASVs to known Symbiodiniaceae sequences from the updated GeoSymbio ITS2 database (Franklin et al., 2012). In essence, this procedure groupings are based on sequence similarity, with names derived from the literature as represented in the updated GeoSymbio database, but do not correspond with strict taxonomic designations, i.e. no binomial species name. Bootstrapping at a threshold of 50 allowed for maximum retention of sequences while minimizing low quality matches. Here we refer to ASVs when discussing the sequence level, and "types" when discussing multiple ASVs that are assigned to the same Symbiodiniaceae taxa (i.e "ASVs" ASV1\_C1 and ASV2\_C1 are collapsed into "type" C1). On average,  $100,801.90 \pm 4,212.15$  sequences were retained in each sample after quality filtering.

Percent relative abundances of each ASV given the total number of cleaned reads were calculated per sample using the abundance (compositional) function in the package "microbiome" (v. 1.10.0) (Lahti et al., 2017). Alpha and beta diversity metrics were calculated using the relative abundance data in "Phyloseq" (v. 1.30.0, McMurdie and Holmes, 2013). Alpha diversity was measured using the Shannon index, and linear mixed models were performed to test differences in diversity across time, treatments and species using the R package lmerTest (Kuznetsova et al., 2017). The assumptions of normality, homogeneity of variance and linearity were tested using the DHARMA (Hartig and Hartig, 2021). To test for differences in diversity across time (T0, T1, T2) and treatments (ambient, 2050, 2100) in G. retiformis, a linear mixed model that included time and treatment as fixed effects (and their interactions) and tank as a random effect were performed. For A. millepora, the effect of climate treatment on diversity was tested using a linear mixed model using treatment as fixed factor and tank as random factor on square-root transformed data. To test for differences in alpha diversity between species at T2, a linear mixed model with species and treatment (and their interaction) as fixed factors and tank as random factor was run. Post-hoc multiple comparisons adjusted by the False Discovery Rate (Benjamini and Hochberg, 1995) were run in case of significant interactions (or factors) using the R package multcomp (Hothorn et al., 2008). To test for significant differences in the relative abundances of each ASV across treatments, the packages DESeq (v. 1.39.0) and DESeq2 (v. 1.26.0) (Love et al., 2014) were used. Generalized linear models with time (T0, T1, T2) and treatment (ambient, 2050, 2100) as factors were run for 30 iterations, where then non-converging models were filtered prior to multiple test correcting. Significantly differential abundant ASVs were then aligned using Clustal Omega (Sievers et al., 2011).

### **Risk metric calculation**

A risk metric was developed to better understand how the loss or gain of different Symbiodiniaceae taxa could impact host functioning. Taxa of interest were selected based on their total average abundance, overall function profile that included significant shifts between timepoints (ranked redundancy value) and heat tolerance using a "thermal sensitivity" rating (Rk value) determined by (Swain et al., 2016). First, 16 most abundant ASVs were selected. Abundance was determined for each by taking the average sequence reads across the dataset and then selecting the highest average 16 scores.

The ranked redundancy profile was determined by first assigning a function profile for each of the 16 most abundant taxa. To do this, a review of the literature was performed for those selected 16 ASVs to determine a functional redundancy ranking. This literature review rendered health-associated measurements derived from 17 published experimental studies. Source of stress were calculated for each type based on measurements from the literature from these 17 publications (Supplementary Table 3). These health-associated measurements included: Fv/Fm, chlorophyll content, lipid assessment, Photosystem I function relative to photosystem II function, dark oxygen consumption, ratio of photosynthesis to respiration, DMSP concentration, DMSO activity, glutanthione activity, catalase-like activity, superoxide dismutase activity, bleaching response, light pressure response, rate of photosynthesis, experiment type, maximum excitation pressure, and growth. For those publications which measured a value both before and after a stress treatment, the average change across each measurement for each taxon was calculated to assign a rank value. For example, this rendered the difference in Fv/Fm values for D1a before and after a stress treatment. If the study associated this difference with a positive outcome for the symbiont or the host, this change in value was ranked positive ("healthy" or "resilient" host-symbiont interaction). Therefore, each measurement was associated with an average change value, where a change of -0.1 (the smallest change value calculated) was ranked as "1st" (less change) and a change of -0.51 (the largest change value calculated) was ranked as "13<sup>th</sup>" (more change). Therefore, we define a positive experimental outcome with a small change, compared to a large change, to indicate a greater resilience to stress. For publications with single measurements (only a before or after measurement), ranks were based on the value measurements only. For example, chlorophyll content (Chl a + c2) was ranked from high to low values. To address differences in the number of observations for each measurement and for each taxon, a "point" was given per observation and then the total number of observations for each measurement was divided by the total number of observations to render a relative point score. Taking the example of Fv/Fm and D1a above, this rendered a final

relative score of 0.333. This resulted in a ranked redundancy score that included the functional profile, the relative change in measurements that make up the functional profile, and a positive or negative outcome associated with that change. We assume that if the experimental outcome was positive, a higher change is representative of a shift towards greater tolerance.

Thermal sensitivity scores (Rk values) were derived from Swain et al. (2016). The Borda Rank method (Borda, 1781) was used to calculate the final ranking of Rk values and averaged to result in a relative ranking per function per taxa (from "1" being an important taxon in terms of function to "21", being a less important taxa for function) (Supplementary Tables 4, 5). Finally, with these two derived metrics (ranked redundancy and Rk), taxa were categorized into 4 risk categories: High Function, High Sensitivity (High Risk, red points), Low Function, High Sensitivity or High Function (Medium Risk, green points), Low Sensitivity (Medium Risk, green points), and Low Function, Low Sensitivity (Low Risk, blue points). Therefore, a taxon that is considered high risk of loss (lower left) are those taxa that contribute to a large number of functions that are unique (low redundancy) in the coral and that also tend to undergo a large change in thermal sensitivity under heat stress. If lost from the coral, these taxa would potentially have the greatest impact on host function due to their low redundancy and high functional importance. Taxa colored in black were ranked based on only one value for the calculation of the Rk value.

# **Results and discussion**

# Changes in relative abundance of *Goniastrea retiformis* juveniles

Adult G. retiformis are typically dominated by Symbiodiniaceae of the genus Cladocopium with the lowered abundance of Durusdinium as "background" taxa (Leveque et al., 2019). However, studies conducted on other coral species suggest that under elevated temperatures, an increase in more thermally tolerant Durusdinium could occur (Baker et al., 2004; Claar et al., 2020; Quigley et al., 2022). Like conspecific adults, G. retiformis juveniles in this study were typically dominated by Cladocopium taxa, but only at T0, although the cumulative abundance of all Cladocopium taxa remained higher in juveniles through time under ambient conditions – compared to the higher temperature and  $pCO_2$  2050 and 2100 treatments (Figures 1, 2). At T1 and T2, Durusdinium (averaged across all taxa in that genus) were found at higher relative abundance (20-23%, Table 1), especially in the 2050 treatment, which was accompanied by a decrease in Cladocopium relative abundance (from 56% to as low as 2%, Table 1). This pattern was evident in both the T1 and T2 timepoints, which may be due to the extended duration of stress at both high temperature and  $pCO_2$  or juvenile ontogeny and winnowing of symbiont communities.

As the average relative abundance of *Cladocopium* decreased through time (from 56% to as low as 2%, Table 1), this genus was



#### FIGURE 1

Effects of elevated temperature and  $pCO_2$  on Symbiodiniaceae communities in coral juveniles of *Acropora millepora* and *Goniastrea retiformis*. Corals were sampled for ITS2 amplicon sequencing at 14 days post-settlement (T0; before exposure to treatment conditions), 10 days (T1) and four (*G. retiformis*) or five (*A. millepora*) weeks (T2) of exposure to 2050 (+1°C offset,  $pCO_2 685 \pm 60$ ppm) and 2100 (+2°C offset,  $pCO_2 940 \pm 60$ ppm) conditions. For *A. millepora*, only samples collected at T2 were sequenced, samples of *A. millepora* were not sequenced (NS) at T0 or T1 (see detailed information in Materials and Methods). The ten most abundant Symbiodiniaceae taxa (>4.2% relative abundance cut-off) across juveniles are shown here.

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replaced by Durusdinium or other ASV-identified taxa (e.g., B1g, I4) in the 2050 and 2100 scenarios at T2 (Figure 1). This could suggest that G. retiformis may shuffle their symbiont communities towards more heat or high  $pCO_2$  resistant taxa in the "shorter" term (up to 2050), taking on the classic shuffling pattern of Cladocopium to Durusdinium dominance. However, the future temperature and  $pCO_2$  conditions projected for 2100 may represent a threshold in which this acclimatory shuffling mechanism breaks down, manifesting as the lowered relative abundances of Cladocopium and Durusdinium and increases in potentially "non-symbiotic" taxa (Figures 1, 2). We also cannot exclude that the distinct Symbiodiniaceae communities observed at T0 (i.e. before recruits were exposed to treatment conditions) across treatments may have influenced the symbiont community dynamics under 2050 and 2100 conditions at the later time points. Further, a limitation to this study is the lack of survival data collected. It is therefore not known with certainty if juveniles with sub-optimal symbiont communities experienced mortality before sampling. Therefore, we cannot conclusively say that the 2050 or 2100 treatment caused any impact or mortality over our sampling period. However, given the vast literature on the impacts of heat and acidification on coral juvenile survival as well as the impacts of these treatments specifically on other reef organisms (Botté et al., 2020; Uthicke et al., 2020), it is likely that the 2050 and 2100 conditions had an impact on growth and survival in this study. Some of the changes seen here, which we ascribed to potential shuffling, could be due to juveniles with sub-optimal symbiont communities dying. Regardless, we were interested in characterizing climate change impacts on the symbiont communities across time and species, even if it was not the result of differential mortality. Additional assessment of survival could help in indicating at what stress levels corals experience shuffling or if the observed shifts were a result of survival of the fittest.

*G. retiformis* juveniles sampled from the ambient treatment at T0 (i.e. before recruits were exposed to treatment conditions) were dominated by *Cladocopium* (as discussed above), but more specifically, by C3k and C1f and background ASVs like C1m (mean relative of <1% of samples) (Figure 2). Interestingly, these abundances varied across the three treatments despite the T0 sampling occurring before treatment exposure. This may be due to high flexibility in early life stages (Coffroth et al., 2001; Little et al., 2004) in combination with a smaller sample size at T0 (see Supplementary Material). These may represent potential symbiotic partnerships and may be relevant to the changes seen at the later time points.

In the ambient treatment, there were also changes in Symbiodiniaceae relative abundances over time, including an increase in *Durusdinium* (from 0 to 11-23%, Table 1). The shuffling (i.e. change in the relative abundance) of specific Symbiodiniaceae were also observed in the ambient treatment, including D1, D1a, and C1m (present in >50% of samples), as well as in background ASVs (C50, C66, and B1g), observed from T0 to T1 (Figures 1, 2). After four weeks (T2) under ambient conditions, juveniles were dominated by D1, D1a and C1m, with background ASVs including C50, C66, and I4 (Figures 1, 2). At T0, before exposure to 2050 and 2100 conditions, juveniles were



FIGURE 2

Relative abundance of the dominant Symbiodiniaceae taxa in *Goniastrea retiformis* juveniles over time and across climate treatments. (A) Mean relative abundance of the top Symbiodiniaceae taxa at T0 (before exposure to treatment conditions), T1 (10-day exposure), T2 (4-week exposure) under ambient, 2050 and 2100 conditions. (B) Proportion of coral juveniles associated with each dominant Symbiodiniaceae taxa under climate treatments over time (T0, T1, T2).



FIGURE 3

Venn diagram incorporating only ASVs that significantly changed in relative abundance between treatments, time and species. A generalized linear model was run to determine which factors (time, treatment, species, or their interactions) explained the greatest variation in ASV abundance using the package DESeq and DESeq2 (v.1.26.0). Specifically, species\*time corresponds to: *A. millepora* (T2) and in *G. retiformis* (T0, T1, T2). There were no ASVs that were significantly associated with the time\*treatment interaction and are not illustrated in the figure.

dominated by C50, D1, and C3k in 2050 treatments, and C3k and D1 in 2100 treatments, with background ASVs of D1a (2050), and C1m, C50, C1f, and C3.14 (2100) (Figure 1). After 10 days (T1) under 2050 and 2100 and 4 weeks (T2) at the 2050 treatment, Cladocopium relative abundances dropped and were replaced by Durusdinium ASVs, which were present across >75% of samples (Figure 2). By T2 in the 2100 treatment, more background types were represented in higher relative abundance, including D1.1, B1g, B20, I4, and F3.1a (Figure 1). This change toward Durusdiniumdominance may have been driven by juvenile age (or duration of temperature and  $pCO_2$  stress exposure), although climate treatment was the main driver of the change in individual Amplicon Sequence Variants (ASVs). For example, a total of 70 ASVs were differentially abundant in relation to treatment or treatment\*species (Figure 3). Significant changes by ASVs and time were only related to changes in ASV abundance when the climate treatment interaction was included. This suggests that while juvenile age and duration of

climate exposure may result in changes in the relative abundance of ASVs within the Symbiodiniaceae communities, climate treatments likely represent the main driver of symbiont community changes in our study.

# Changes in relative abundance of *Acropora millepora* juveniles

Acropora millepora juveniles (sequenced only at five weeks, T2, see Materials and Methods), were dominated by *Durusdinium* (D1 and D1a) across climate treatments (Figures 1, 4). ASVs associated with *Cladocopium* decreased in relative abundances with increasing climate stress (from 64% to as low as 0% in the T1 2100 treatment, Table 1, Figures 1, 4). For example, the average relative abundance of *Cladocopium* C1m decreased with increasing stress in the 2050 and 2100 treatments (from as high as 25% at T1 ambient to close to

TABLE 1 Relative abundance of the dominant *Cladocopium* and *Durusdinium* taxa across both species, timepoints and stress exposures (note no data was available for *A. millepora* for T0 and T1).

	All treatments		Ambient		2050		2100	
	Cladocopium	Durusdinium	Cladocopium	Durusdinium	Cladocopium	Durusdinium	Cladocopium	Durusdinium
T0	$0.56\pm0.04$	0.13 ± 0.5	$0.64 \pm 0.17$	$0.00\pm0.00$	0.50 ± 0.11	$0.25 \pm 0.07$	$0.60\pm0.04$	0.13 ± 0.06
T1	0.02 ± 0.02	0.20 ± 0.14	$0.04 \pm 0.04$	0.11 ± 0.09	0.01 ± 0.01	0.27 ± 0.16	$0.00 \pm 0.00$	0.23 ± 0.19
T2	0.19 ± 0.2	0.23 ± 0.13	0.03 ± 0.02	0.23 ± 0.13	0.01 ± 0.01	0.24 ± 0.14	0.01 ± 0.01	$0.06 \pm 0.04$

The dominant ASVs used are the same as Figure 1. Average relative abundance of the Cladocopium ASVs and Durusdinium ASVs grouped at the genus level. Over the sampling timepoints, there was a decrease in the relative abundance of *Cladocopium* and increase in relative abundance of *Durusdinium*.



0% in other treatments, Figure 4). Likewise, other background ASVs were more abundant in the ambient treatment juveniles compared to those under 2050 and 2100 conditions, with 2100 samples comprising very few background ASVs.

impacts of acidification, to then go on to grow and reproduce and contribute to reef recovery.

Our study examined the combined impacts of temperature and pCO2. However, our results parallel studies that looked at these stressors singularly. For example, the dominance of Durusdinium in our study from the combined climate stressors was consistent with other studies conducted on A. millepora juveniles, which showed a change towards Durusdinium-dominance at higher temperatures (Abrego et al., 2012). Similar patterns were also reported in adult corals of the same species, with an increased abundance of Durusdinium observed in corals exposed to elevated sea surface temperatures and/or human disturbances (Oliver and Palumbi, 2011; Sully et al., 2019; Claar et al., 2020; Quigley and van Oppen, 2022). It is important to note that although community changes towards Durusdinium may increase host thermal tolerance or a more generalized stress tolerance, it may concomitantly decrease growth rates (Little et al., 2004). Hence, there may be limited benefits of hosting Durusdinium for the coral A. millepora. Finally, the increased relative abundance of D1 and D1a in conjunction with the decreased abundance of background types in both the high temperature and high pCO<sub>2</sub> 2050 and 2100 treatments (for example, at T2, from <40% to >60%) suggests that A. millepora juveniles may have the ability to acclimate to these combined future climate conditions for at least short experimental periods. This demonstrated potential, if applicable in the wild, may promote greater survival under future climate scenarios, thereby increasing the opportunity for some coral species to survive through disturbance, like mass bleaching events combined with the

### Changes in the diversity of Symbiodiniaceae occurred across time, treatment, and coral species

Changes in the symbiont community in coral early life history stages have been observed in both field and lab-based experiments (Abrego et al., 2009; Quigley et al., 2017; Quigley et al., 2020a), in which the overall symbiont community diversity and composition can strongly influence host performance such as growth, survival and thermotolerance (Mieog et al., 2009). Endosymbiotic community diversity may also vary in response to environmental conditions, including temperature and nutrients (Gong et al., 2018). In our study, climate treatments did not impact diversity (as measured by the Shannon diversity index) within each coral species (p > 0.001; Figure 5). However, diversity in G. retiformis juveniles changed significantly over time, with an overall lower diversity at T1 compared to T2 (Lmer:  $F_{2,97} = 11.2$ , p < 0.01), though there were no significant differences between T0, and the later life stages. When comparing diversity between species at T2, mean diversity was higher in A. millepora compared to G. retiformis in juveniles under 2100 conditions (Lmer, species:  $F_{1,54} = 6.0$ , p = 0.02; species\*treatment:  $F_{2,54} = 3.4$ , p = 0.04; G. retiformis 2100 – A. *millepora* 2100: p = 0.03). Taken together, these results suggest that at least at the final timepoint under 2100 conditions, Symbiodiniaceae communities in A. millepora were more diverse



and more evenly distributed across individual juveniles compared to within *G. retiformis*, and importantly, they were shuffling towards a community of *Durusdinium* dominance.

# Changes in specific Symbiodiniaceae taxa driven by coral species-specific responses to temperature and $pCO_2$

*Durusdinium* are of particular ecological interest due to their relative tolerance to stress compared to other symbionts (Morikawa and Palumbi, 2019). In our study, an increased abundance of *Durusdinium* (generally from 13% to 20–23%, Table 1) was

observed through time (*G. retiformis*) and under climate stress (*G. retiformis* and *A. millepora*), and *Durusdinium* ASVs were the taxa most likely to change across climate treatments, including *D. glynnii* (15 ASVs to D1), and *D. trenchii* (9 ASVs to D1a). These shifts towards a *Durusdinium*-dominated community may be a consequence of the decrease in *Cladocopium* relative abundance, leaving available niches for *Durusdinium* through time or *via* competitive exclusion. *Cladocopium* ASVs also changed in abundance and included a total of 12 *Cladocopium* ASVs across our treatment conditions (Figure 4). The most common taxa that changed included C50 (4 ASVs), C1 (3 ASVs), and C1m (3 ASVs), mostly driven by climate treatment effects (Figure 3, Supplementary Figure 1). Interestingly, communities within the *G. retiformis* 



### FIGURE 6

Risk metric quantifying the potential risk associated with the breakdown of host functioning due to Symbiodiniaceae loss. The metric included the 16 most highly abundant Symbiodiniaceae ASVs and included rankings of the likelihood of shifts (x-axis;  $R_k$  score) and functional redundancy of each taxon (y-axis).  $R_k$  values are from Swain et al. (2016) which measure the thermo-sensitivity of taxa. Redundancy rankings were calculated based on multiple health-associated measurements (e.g. Fv/Fm, chlorophyll content, lipid assessment) derived from 17 published experimental studies. The 16 ASVs were selected because they were the most abundant and were the ASVs which overlapped in both our study and those assessed for ranking. For each taxon, measurements were averaged across all studies per trait, with each function per taxa ranked from smallest to largest change, where a small change is indicative of greater redundancy and potential resilience of the host against stress. Final rankings were scored using a Borda Rank method and averaged to result in a relative ranking per function per taxa (from 1: important taxa for function – 21: less important taxa for function). Based on these two metrics, taxa were broken up into High (red points), Medium (green points), and Low (blue points) risk categories. For example, taxa in the High risk (lower left quadrat) identifies taxa which lost would have the greatest risk to impact host functioning due to their low redundancy and high functional importance. Taxa placed along the axis and colored in black only have one  $R_k$  value.

juveniles sampled from the 2100 treatment group changed over time from C50 (eight ASVs in T0 and T1) to C66 dominance (one ASV in T2 detected through outlier analysis). However, changes in C50 were more directly related to treatment effects whilst C66 changed by treatment\*species interaction (Figure 3). While *Cladocopium* C66 has not been previously identified in *Goniastrea* adults (Leveque et al., 2019), it has been found at low abundance in corals (LaJeunesse et al., 2003). However, C66 has been reported from *A. tenuis* juveniles, with an increase of C66 over 71 days in the wild (Quigley et al., 2020a). This suggests that our T2 treatment may represent the initial establishment of a *Cladocopium* taxon containing the C66 marker and not an experimental artifact.

Further to consider is how different ASVs matching to *Cladocopium* species responded to different stress treatments (see Supplementary Figure 1). For instance, of the 4 ASVs designated

C50, two reflected an increase in the relative abundances in response to increased thermal and  $pCO_2$  stress in *A. millepora*, with increases in *G. retiformis* corresponding more to time (up to ~12.5%, Figure 1). This could be a factor of variable host-symbiont interactions between species, however this would require sequencing of *A. millepora* at earlier timepoints, which was not deemed feasible due to a lack of PCR bands. In addition, *Fugacium* sp. (formerly clade F) is recognized as being a potentially important thermally tolerant taxon (Cunning et al., 2015). While only one ASV matching *Fugacium* (F5.2) was identified as significantly changing in response to treatment factors, this change was seen in the species\*treatment factor (p = 0.025). F5.2 was present in the greatest relative abundance in *G. retiformis* juveniles under ambient conditions and were alternatively at the lowest relative abundances in ambient *A. millepora*. This finding demonstrates the species-

specific nature of host-symbiont relationships and further emphasizes the need to investigate symbiosis establishment across multiple coral taxa.

# The loss of specific Symbiodiniaceae taxa may impact coral host function

Symbiodiniaceae taxa are functionally diverse (Suggett et al., 2015; Swain et al., 2016) with different taxa performing diverse functions within the coral host (Muscatine, 1990). The loss or gain of particular taxa could, as a result, cause physiological changes in host functioning. This change of function may include changes to nutrient transfer (e.g. carbon translocation) or the increase or decrease in tolerance of the host to a stressor. To infer potential consequences on host functioning due to the taxonomic changes measured here, we developed a risk metric that incorporated 16 of the most highly abundant symbiont ASVs in our coral juveniles and their functional roles from the literature, to calculate a "risk" metric that would result from the loss of taxa relative to the redundancy of their functional roles (Figure 6). This metric also incorporates the metric R<sub>k</sub> (sensu Swain et al., 2016, Supplementary Table 5), where a higher Rk value is indicative of increased thermal tolerance. This metric shows that Cladocopium ASVs vary in their sensitivity to high temperatures. For example, Cladocopium goreaui (C1) are more thermally-sensitive ( $R_k = 21.72$ ) compared to C40 ( $R_k =$ 55.32), which are more tolerant. This was combined with relative abundance data from this study, for example, in ASVs like C40 that experienced dramatic changes in relative abundance between ambient and climate stress treatments ( $R_k$  shift = 55). Redundancy within juveniles for this taxon was also relatively low (redundancy rank = 6). Combined, this resulted in the assignment of this taxon to a "medium risk" category if lost (green points, Figure 6). This suggests that given C40's relatively high heat tolerance and potential ability to provide the coral host with greater stress resilience, the loss of this symbiont could be detrimental to host health given its low functional redundancy.

This same analysis was repeated for each of the 16 most highly abundant symbiont ASVs. *Durusdinium trenchii* (D1a), also generally known as a stress tolerant symbiont, had a correspondingly high  $R_k$  (37.03) and experienced relatively large changes in relative abundance between treatments. However, functional redundancy was high (~13), suggesting that there is a diminished risk to host health if this taxon is lost. Other ASVs like C1, C1b, and D4 have low thermal tolerance, experienced large changes in relative abundance, and had low functional redundancy, suggesting the loss of these ASVs are of greater risk to the host. Combined, this novel risk framework suggests that the loss or gain of different symbionts may not be functionally equivalent across these simulated future climate treatments and that each loss of particular symbionts may impact the host through downstream impacts on host function.

These outcomes may also be species-dependent, where some coral species may rely more heavily upon specific Symbiodiniaceae

taxa to fulfill certain functions. It is also important to note that the majority of data for the  $R_k$  metric used in this risk assessment is derived from coral adults. Given we focus here on juveniles, we underscore those functions may be different across life-stages. Despite this, the use of the risk metric to understand the potential implications of loss and gain of symbiont taxa under future climate scenarios opens up the opportunity to better predict coral reef function in the future. The loss of high-functioning and low redundancy taxa, in particular, highlight the need to better protect reefs in order to minimize loss of these critical symbionts at critical early life stages.

### A note on Symbiodiniaceae taxonomy

As alluded to in the Materials and Methods, Symbiodiniaceae taxonomy is challenging given the Symbiodiniaceae ITS2 gene is multicopy with high intragenomic variation (see Quigley et al., 2014 for full discussion). The choice of the DADA2 pipeline may therefore overinflate diversity but minimizes the chance of falsenegatives that would be possible from the Symportal pipeline. To address these challenges, a workshop was convened to discuss strategies to move forward amongst experts in the field (Davies et al., 2022). In this work, the pros and cons of the ASV vs. DIV methods were presented, including how the methodology relates to how sequence and species diversity are being treated. Other work has undertaken formal comparisons of these two methods (during the review Quigley et al., 2019; published Quigley et al., 2022), and in both, we confirmed that the results are largely consistent between the ASV and DIV methods. However, and most importantly, we specifically chose the ASV method here for its superior ability to detect novel, low-abundance sequences (Davies et al., 2022).

# Conclusion

Overall, we observed an increase in relative abundance of *Durusdinium* over time in relation to juvenile age and duration of climate stress exposure. In addition, we found a significant capacity for coral juveniles to take up D1 and D1a symbionts at treatments with increasing temperature and  $pCO_2$ , which generally corresponded with a decrease in *Cladocopium*. These results support the idea of "shuffling" algal symbiont communities for increased acclimation to stress, as seen in studies of adult corals. Longer-term observations of coral juveniles are required to understand the ontogenic consequences of temperature and  $pCO_2$  on symbiosis as it may provide coral offspring with an increased capacity for heat tolerance and survival.

### Data availability statement

The datasets presented in this study can be found in online repositories. The names of the repository/repositories and accession number(s) can be found in the article/Supplementary Material.

# Author contributions

AT and KQ wrote manuscript. AT performed the lab work. KQ and NW developed the research idea; KQ and EM designed the experiment and sampling strategy and performed the experiment. AT ran the data analysis. NW and KQ provided funding. All authors contributed to the article and approved the submitted version.

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### Conflict of interest

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

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# Supplementary material

The Supplementary Material for this article can be found online at: https://www.frontiersin.org/articles/10.3389/fevo.2023.1113357/ full#supplementary-material

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