# COVER SHEET FOR PROPOSAL TO THE NATIONAL SCIENCE FOUNDATION

PROGRAM ANNOUNCEMENT/SOLICITATION NO./DUE DA				DATE Special Exception to Deadline Date Policy			FOR NSF USE ONLY		
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#### PROJECT SUMMARY

#### Overview:

For the past 18 years, the Moorea Coral Reef (MCR) LTER program has sought to understand the long-term dynamics of oceanic coral reef ecosystems. Coral reefs have extraordinary biodiversity and provide profoundly important ecosystem services. Yet, reefs worldwide are faced with degradation by local human activities, a warming, rising and slowly acidifying ocean, and a changing disturbance regime. While cyclones have impacted coral reefs throughout their geological history, the first major episodes of coral 'bleaching' mortality caused by anomalously warm water occurred in the early 1980's. Episodes of mass bleaching from marine heat waves now occur on reefs worldwide and are growing in frequency and severity as mean ocean temperature continues to rise. Thus, the disturbance regime of coral reefs now includes recurrent heat waves in addition to powerful storms. Our new research is motivated by a recent heat wave that caused more coral bleaching mortality at our site than any other heat wave in recent decades, and it builds on our long-term measurements and accumulated knowledge, including dynamical responses after a powerful cyclone in 2010. The proposed research centers on how the changing disturbance regime is altering the dynamics, function, and resilience of coral reefs, and is organized around three core questions:

- How do material legacies from different disturbance types affect community dynamics, changes in state and resilience?
- How do local stressors interact with new disturbance regimes to drive spatial heterogeneity in community dynamics, ecosystem processes, and spatial resilience?
- How do disturbances generate information legacies in corals and coral reef communities that influence their resilience under current and future environmental conditions?

Our research integrates the collection and analysis of long-term data, process studies, long-term field experiments, analytical and statistical modeling, cross-LTER site integration, and ecological synthesis.

## **Intellectual Merit:**

The recent coral bleaching event on the fore reef, whose recovery from a cyclone that removed coral skeletons a decade earlier was intensely studied by the MCR, provides the opportunity to understand the causes and consequences of ecological responses to the two major disturbance types that are impacting coral reefs worldwide. Disturbances can trigger abrupt and persistent change in ecosystem state, and we are uniquely positioned to understand whether and why the coral state is more or less resilient to a mass coral mortality event that removes coral skeletons (cyclones) compared to a disturbance that leaves dead skeletons intact (severe heat waves). Further, our site is a model system for understanding how the impact of a disturbance is modulated by interactions among multiple local stressors (e.g., nutrient enrichment, fishing) that might amplify or lessen ecosystem responses, as well as for examining how spatial structure influences system dynamics, function and resilience. Finally, we will also explore whether repeated heat waves and warming water select for species or traits of corals that 'prime' them to respond in beneficial ways to further climate change effects as well as ocean acidification.

## **Broader Impacts:**

Degradation of coral reefs commands substantial public attention. This provides an effective platform for our findings to inform management actions to strengthen resilience of coral reefs in our rapidly changing world. MCR will continue to work with government entities, resource managers, fishers, and other stakeholders concerned with the health of coral reef ecosystems. MCR's education, training, and outreach efforts emphasize broadening participation in STEM fields and strengthening STEM literacy, particularly from groups historically underrepresented in marine field sciences. In addition to our ongoing Schoolyard and other efforts to promote diversity and inclusivity in science, we have initiated 2 new MCR IV activities to: (1) address barriers hindering underrepresented groups becoming scientific SCUBA divers (UCSB *DIVErsity in Diving Program*) and (2) enhance our multi-lingual, media-based outreach and education efforts to disseminate MCR findings to Pacific Islanders in Hawaii, American Samoa, Guam, Palau, the Federated States of Micronesia, Marshall Islands and French Polynesia.

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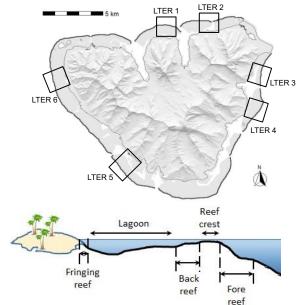
<sup>\*</sup>Proposers may select any numbering mechanism for the proposal. The entire proposal however, must be paginated. Complete both columns only if the proposal is numbered consecutively.

## SECTION 1 – MOOREA CORAL REEF LTER RESEARCH AND THE LTER CONTEXT

The Moorea Coral Reef (MCR) Long Term Ecological Research (LTER) site, like all sites in the network, addresses ecological phenomena that occur over multiple decades. The MCR site is an oceanic coral reef ecosystem, which encircles the ~50 km perimeter of Moorea, French Polynesia, and includes the fringing reef along the shore, the back reef in the lagoon, and the steeply sloping fore reef seaward of the reef crest (Fig. 1). MCR research activity is based at the University of California Gump Research Station and is motivated by patterns in our time series that collect data in the five LTER core areas: (1) primary production, (2) population studies, (3) movement of organic matter, (4) movement of inorganic matter, and (5) disturbance dynamics. These data are integrated with experiments and other process-oriented studies to inform ecological theory and to advance understanding of the long-term dynamics of

populations, communities, and ecosystems. Like many coral reefs, Moorea's reefs are impacted by acute disturbance events (e.g., cyclones, marine heat waves, outbreaks of coral predators) superimposed on a heterogeneous template of chronic local stressors (e.g., fishing, nutrient enrichment) and directionally changing climate drivers (e.g., ocean temperature, ocean acidification). A goal of the MCR is to gain predictive understanding of how these factors affect community dynamics, ecosystem function, and resilience. Of particular interest is understanding causes and consequences of state shifts from coral (the foundation species) to macroalgae (or other taxa), a phenomenon occurring on many tropical reefs.

In MCR I (2004-2010), we developed an island-scale understanding of community structure and ecosystem function and how these vary with physical forcing. We advanced understanding of coral biology to better project how reefs will respond to local and regional drivers of change. Beginning in MCR I, an outbreak of the corallivorous Crown-of-Thorns Seastar (COTS), *Acanthaster planci*, killed the majority of coral colonies on the fore reef and was followed by a cyclone in 2010 that removed the dead coral skeletons. These back-to-back perturbations focused MCR II research on ecological resilience of the fore reef community. The focus of MCR II (2010-2016) was on

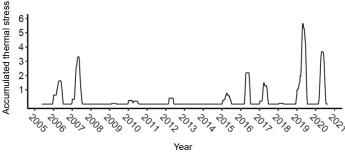


**Figure 1.** (**Top**) Map of Moorea with locations of MCR time series sampling sites around the ~50 km perimeter of the island. (**Bottom**) Schematic cross-section of the ecosystem, stretching from the shore (left) to 20 m depth on the offshore fore reef (right), illustrating the 3 habitat types (fore reef, back reef, fringing reef) sampled at each site around the island (top).

processes preventing the fore reef from undergoing a transition to macroalgal dominance, as well as those influencing the return of corals. We further explored the physiological and ecological mechanisms determining which corals are 'winners' or 'losers' under current and future ocean conditions. Our time series revealed that the fore reef was returning to the pre-disturbed, coral-dominated community, but at different rates across sites and depths. By contrast, lagoon communities displayed different dynamics where coral cover remained high at some sites, but at others, coral declined while macroalgae increased. Thus, the lagoon was less resilient than the fore reef and had more fine-scale spatial heterogeneity in community structure and dynamics.

Community dynamics revealed by our core time series motivated the focus of MCR III (2016-2022) on the causes and consequences of spatial heterogeneity in reef resilience. We also began to explore how future ocean conditions might impact resilience, community structure, and ecosystem function. On the





**Figure 2.** (**Top**) Coral bleaching on the fore reef during the 2019 marine heat wave. (**Bottom**) History of accumulated thermal stress in the MCR time series. Accumulated thermal stress is calculated as the weeks above 29°C, the temperature threshold that predicts thermal stress for corals in Moorea. Note the recent increase in frequency/intensity of heat waves.

fore reef where herbivory by fishes is high, variation in the recruitment of sexually produced coral propagules was the primary factor creating heterogeneity in the rate of coral recovery. In the lagoon where herbivory by fishes is much lower, some communities exhibited bistability, existing as either coral- or macroalgae-dominated habitats under identical conditions that are determined by their starting community state. Importantly, nutrient enrichment was a strong driver of heterogeneity in the lagoon that exacerbated coral bleaching and facilitated declines in coral and increases in macroalgae.

In 2019, Moorea experienced an intense marine heat wave (MHW, an episode of unusually warm water), resulting in widespread coral bleaching and mortality on the fore reef and at some locations in the lagoon (Fig. 2). This event left large numbers of dead coral skeletons in place and may result in fundamentally different post-disturbance dynamics than did the COTS/cyclone disturbance in MCR I, which

killed and then removed dead corals. Our time series also indicate that marine heat waves are becoming more frequent (Fig. 2), a pattern being observed worldwide. Thus, MCR IV (2022-2028) will explore ecological consequences of the changing disturbance regime, particularly how two different types of disturbances (heat waves vs. cyclones) affect ecological resilience.

#### **SECTION 2 - RESULTS FROM PRIOR SUPPORT**

MCR LTER III: Long Term Dynamics of a Coral Reef Ecosystem (2016-2022) OCE 1637396; Funding: \$7,070,118 (including supplements). The major goals of MCR III were to advance understanding of two general questions that remain poorly resolved for coral reef ecosystems:

- (1) What processes and attributes underlie the ability of coral reef ecosystems to buffer environmental perturbations to maintain or restore community structure and function?
- (2) How will changing environmental drivers alter resilience, community composition, and ecosystem functioning?

#### RESEARCH - PRIOR

<u>Major Findings.</u> Here we summarize major MCR III findings. To date (2016-present), this research has resulted in 180 publications, 25 MS theses, and 13 PhD dissertations. Citations in **bold** represent contributions from our **10 most significant papers** (Table 1).

<u>Unprecedented resilience of coral communities</u>: Our time series revealed that following the disturbances over 2007-2010 (a COTS outbreak followed by a cyclone), the denuded fore reef did not transition to macroalgae, but returned to a coral-dominated community because high rates of herbivory prevented macroalgae from proliferating (Adam et al. 2011, Holbrook et al. 2016). However, the rate of return of coral cover varied around Moorea and across depths, with the fastest coral recovery on the north shore and in shallow water (10 m) (**Holbrook et al. 2018**). Recovery was more strongly influenced by the

- 1. Adam, T.C. et al. (2021) Landscape-scale patterns of nutrient enrichment in a coral reef ecosystem: implications for coral to algae phase shifts. *Ecological Applications* 31:e2227
- 2. Burgess, S.C. et al. (2021) Response diversity in corals: hidden differences in bleaching mortality among cryptic *Pocillopora* species. *Ecology* 102:e03324
- 3. Clements, C.S. and M.E. Hay. (2021) Biodiversity has a positive but saturating effect on imperiled reefs. *Science Advances* 7:eabi8592
- Donovan, M.K. et al. (2020) Nitrogen pollution interacts with heat stress to increase coral bleaching across the seascape. PNAS 117:5351-5357
- 5. Edmunds, P.J. et al. 2018. Density-dependence mediates coral assemblage structure. *Ecology* 99:2605-2613

- 6. Holbrook, S. J. et al. (2018) Recruitment drives spatial variation in recovery rates of resilient coral reefs. *Scientific Reports* 8:7338
- 7. Maher R.L. et al. (2020) Coral microbiomes demonstrate flexibility and resilience through a reduction in community diversity following a thermal stress event. *Frontiers in Ecology and Evolution* 8:555698
- 8. Munsterman, K.S. et al. (2021) A view from both ends: shifts in herbivore assemblages impact top-down and bottom-up processes on coral reefs. *Ecosystems* 24:1702-1715
- 9. Schmitt, R. J. et al. (2019) Experimental support for alternative attractors on coral reefs. *PNAS* 116:4372-4381
- 10. Wegley Kelly, L. et al. (2022) Distinguishing the molecular diversity, nutrient content and energetic potential of exometabolomes produced by macroalgae and reef building corals. *PNAS* 119:e2110283119



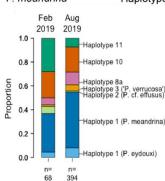


Figure 3. (Top) Three haplotypes (cryptic species) of *Pocillopora* in Moorea. (Bottom) Relative abundance of haplotypes in February 2019 (before coral bleaching) and August 2019 (after coral bleaching). Note the large decrease in thermallysensitive Haplotype 11.

supply of sexually produced coral recruits than by other factors such as coral growth, herbivory, or corallivory (Holbrook et al. 2018, Edmunds et al. 2018a). This 'supplyside' interpretation of recovery is supported by Integral Projection Modeling (IPM) that shows that fore reef sites re-assembled to predisturbance coral cover with a similar community structure (Kayal et al. 2018). Field experiments revealed that coral diversity may accelerate recovery (Clements and Hay 2021).

In 2019, Moorea experienced a marine heat wave (MHW) that was one of the most intense of the past several decades. This resulted in extensive bleaching of coral on the fore reef as their photosynthetic algal endosymbionts (Symbiodiniaceae) were lost (**Burgess et al. 2021**, Speare et al. 2022). Bleaching mortality

was most extensive for the largest corals and smallest recruits of the dominant genera of branching corals, *Acropora* and *Pocillopora* (Speare et al. 2022). Cryptic species of *Pocillopora* showed widely different patterns of bleaching and mortality, thus revealing a mechanism driving the positive association of colony size and bleaching (Fig. 3; **Burgess et al. 2021**). Resilience to bleaching might have been modulated by corallivorous fishes that consume, digest and egest coral tissues, thereby dispersing live Symbiodiniaceae symbionts across the reef and aiding in coral recovery (Grupstra et al. 2021). The 2019 bleaching left stands of dead coral skeletons intact on the fore reef, which contrasts with the effects of the previous COTS/cyclone disturbances that removed skeletons. A goal of MCR IV is testing the effects of disturbances that retain dead coral skeletons vs. those that do not on ecological resilience.

<u>Coral reefs are vulnerable to disturbance-induced regime shifts</u>: We tested a theoretical prediction that multiple basins of attraction could exist in an ecosystem where a large enough disturbance can induce a state shift without any change in an underlying driver. On coral reefs, the rise of coral-to-macroalgae 'phase shifts' (Fig. 4) suggests that a hysteretic dynamic could trap these systems in a macroalgae-dominated state. We tested for hysteresis in driver-response relationships that create the potential for bistability, and demonstrated that hysteresis existed under ambient conditions in the lagoon but not on the





**Figure 4.** Examples of lagoon reefs either in **(Top)** coral-dominated state or **(Bottom)** macroalgae-dominated state.

fore reef (Schmitt et al. 2019). These experiments showed that when a large disturbance removes the dominant macroalga (Turbinaria) from patch reefs, they remained macroalgae-free and were re-colonized by corals (Fig. 5; Schmitt et al. 2019, 2021). Thus, depending on their starting conditions, reefs could respectively either remain macroalgaedominated or return to a coral-dominated state, thus suggesting that macroalgae and coral can behave as alternative basins of attraction. Modeling revealed that reduced vulnerability of macroalgae to herbivory as macroalgae grow and mature could contribute to bistability (Briggs et al. 2018). The model shows that when macroalgae are palatable to herbivores as juveniles, but resistant as adults (e.g., for Turbinaria, Davis 2018), coral- and macroalgaedominated states are bistable. Bistability may contribute to the patterns in our time series where some back reef sites transitioned from coral to macroalgae (Adam et al. 2021). Regions of bistability also exist on the fore reef, but below ambient levels of herbivory (Holbrook et al. 2016, Schmitt et al. 2019), which helps explain the return to coral after the 2010 cyclone (Holbrook et al. 2018, Kayal et al. 2018).

Nutrient pollution, algal phase shifts, and coral bleaching: Our time series across 18 sites has shown heterogeneity in nutrient (nitrogen, N) availability, with higher N concentrations on the north shore, and closer to land vs. offshore (**Adam et al. 2021**). In 2016, we increased the

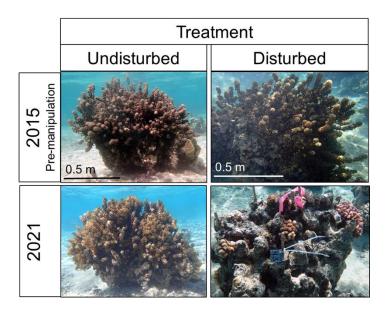
spatial resolution of our nutrient data by sampling 188 lagoon sites to quantify seascape-scale N enrichment. Nitrogen availability was associated with several factors, including rainfall, wave-driven circulation, and proximity to nutrient sources (**Adam et al. 2021**). Our time series shows that corals have decreased in abundance while macroalgae have increased at N-enriched sites compared to sites with lower nutrient enrichment. Transitions to macroalgal dominance were not associated with reduced fish herbivory (**Adam et al. 2021**). In fact, the degree of nutrient enrichment and intensity of fishing on herbivorous fishes are spatially decoupled due to the contrasting long- vs. cross- shore relationships between them (Holbrook et al. 2022). However, sites dominated by coral vs. macroalgae have different fish communities, resulting in altered ecosystem processes such as herbivory, detritivory, and nutrient cycling (**Munsterman et al. 2021**). Shifts from coral to macroalgae likely change reef biogeochemistry, as coral and algae exude significantly different types of dissolved organic matter (**Wegley Kelley et al. 2022**). Thus, nutrient-driven phase shifts result in cascading impacts on key ecosystem processes.

One mechanism driving decline of corals in the lagoon may be the impact of N on thermal tolerance of corals. By quantifying coral bleaching during modest thermal stress in 2016, we showed that increased temperature and N availability were positively associated with bleaching prevalence in *Acropora* and *Pocillopora* (**Donovan et al. 2020**). Temperature and high N availability also affected bleaching severity, suggesting that increased N can cause more intense bleaching at a lower temperature. The type of N matters, with more human-derived forms of N (e.g., NO<sub>3</sub>-) exacerbating bleaching mortality (Burkepile et al. 2020). A key theme in MCR IV is to understand how nutrients, temperature, and other drivers influence spatial heterogeneity in abundance of coral and macroalgae across the lagoons.

<u>Winners and losers in coral communities on current and future reefs</u>: During MCR I, our time series indicated that virtually all corals were 'losers' (i.e., they declined in abundance) as a result of COTS and the cyclone in 2010 (**Holbrook et al. 2018**, Edmunds 2018). Yet, recovery from these events has revealed winners, with *Pocillopora* fueling recovery on the fore reef (**Holbrook et al. 2018**, Edmunds 2018). Its

rate of recruitment, while consistently high on the fore reef (Edmunds 2021), is influenced by biological and physical factors (Edmunds 2017, 2021, Edmunds et al. 2018a). Pocillopora species in Moorea are a complex of cryptic species that are differentially distributed across depth (Johnston et al. 2021) and respond differently to thermal stress (Burgess et al. 2021). Thus, while the last decade reveals *Pocillopora* as a winner on the fore reef (Holbrook et al. 2018, Edmunds 2018), a goal of MCR IV is to understand which cryptic species of Pocillopora are responsible for this effect and why.

Demographic analyses of coral genera have revealed mechanistic drivers of 'winning' on present-day reefs of Moorea, in particular the roles played by sexual recruitment for *Pocillopora* and tissue relics for *Porites* (Kayal et al. 2018). These analyses reveal the limitations of identifying coral winners only by instantaneous growth (Edmunds and Putnam 2020) rather than seeking the demographic or functional causes of elevated fitness (e.g., Edmunds and Putnam 2020, Leinbach et al. 2021).



**Figure 5.** Representative patch reefs (bommies) from two treatments of an experiment that tested whether a disturbance that removed macroalgae would trigger a regime shift back to a coral state without a change in herbivory. The bommie on the left was undisturbed, while the bommie on the right was cleared of macroalgae once to mimic a cyclone. (**Top**) Bommies just before macroalgae were removed. (**Bottom**) The same bommies 6 years later. Undisturbed bommies remained dominated by macroalgae but disturbed bommies stayed free of macroalgae and were transitioning back to a coral state (**Schmitt et al. 2019**, 2021).

Advances in understanding the coral holobiont (i.e., the association of the coral animal with a host of symbiotic microorganisms) (Sogin et al. 2017) are revealing the wide diversity of mechanisms through which corals can modify their performance (Putnam 2021). These mechanisms include changes in the taxa of algae and bacteria with which they associate (Thompson et al. 2015, **Maher et al. 2020**), and means by which information legacies can be transferred between generations (Eirin-Lopez and Putnam 2019). Importantly, restructuring their microbiomes to favor beneficial symbionts may be a key strategy for corals to cope with environmental stresses such as marine heat waves (**Maher et al. 2020**).

Synthesis, Integration, and Cross-site Products. The MCR has led numerous synthetic efforts to understand the ecology of coral reefs as well as to develop new approaches and techniques for data analysis. An MCR-led workshop at the Okinawa Institute of Science and Technology (OIST) focused on global patterns of temporal variation in coral recruitment (Price et al. 2019), and a second workshop (cofunded by NSF), addressed larval connectivity among reefs (Edmunds et al. 2018b) and latitudinal variation in coral growth (Nozawa et al. 2021). We led a 2016 workshop at the USGS Powell Center on coral reef oases (Guest et al. 2018, Courtney et al. 2021). A 2017 working group at USC's Boone Center explored cross-site contrasts in long-term coral reef community dynamics (Edmunds et al. 2019), followed in 2018 by an exploration of the role of coral demography in a changing world (Edmunds and Riegl 2020), and in 2019, by an international workshop on coral demography (Pisapia et al. 2020). MCR investigators also participated in synthesis and cross-site activities organized by others (e.g., Cinner et al. 2018, Gaiser et al. 2022, Safaie et al. 2018, Grottoli et al. 2021, Cowles et al. 2021, Reed et al. 2022). An ongoing cross-site collaboration involves a group of scientists from ETH Zurich (Switzerland), University of Modena (Italy), Florida State University, and Microsoft (Quantum Computing) to develop underwater

photogrammetric techniques and machine learning for habitat quantification. Five workshops were held during MCR III; test beds include the MCR site, and locations in the Caribbean and Mediterranean (Capra et al. 2017, Neyer et al. 2018, Nocerino et al. 2019, 2020, Rossi et al. 2020).

#### **BROADER IMPACTS - PRIOR**

MCR has made significant contributions to postdoctoral, graduate, and undergraduate training, to multinational public outreach, and to data dissemination. In the past 6 years, MCR has engaged 30 postdoctoral researchers, 101 graduate and 131 undergraduate (11 REU, 4 ROA) students, 2 ROA faculty researchers and 7 K-12 teachers (5 RET). They are involved in MCR research and outreach and participate in the annual MCR All-Investigator Meeting. MCR fosters a welcoming, supportive and inclusive community that embraces the diversity of our society. Thus, diversity, equity and inclusion are central pillars of our training and outreach efforts, and we have built a diverse, inclusive and empowered community.

The MCR Schoolyard program emphasizes connecting underrepresented groups in K-12 with the ocean. Our web resources include: (1) a Marine Life in Moorea Encyclopedia, (2) research pages for MCR graduate students, and (3) teaching resources developed by our RET participants. Our partner schools have large enrollments of underrepresented and/or economically disadvantaged groups. Teachers use curricula based on MCR research, participate in our professional development activities, and some travel to Moorea for summer research experiences (4 during MCR III, despite pandemic limitations). An important Schoolyard effort is an annual visit to UCSB by >100 fifth graders from Washington STEM Magnet School in Pasadena (98% minority enrollment, 90% disadvantaged, 40% English language learners) to learn about marine biology and participate in interactive lessons that are the basis for subsequent classroom activities. MCR graduate students and investigators lead K-12 activities at our coral reef booth at the annual Earth Day in Santa Barbara. Our undergraduates serve as docents at the REEF (Research Experience & Education Facility), which is an interactive marine educational facility at UCSB that serves over 10,000 K-12 and public visitors annually.

MCR has partnered with the UCLA Diversity Project, funded by NSF and the UC-HBCU Initiative (PI Barber, UCLA) that strives to increase participation of underrepresented students in marine biology. Diversity Project students visit UC Santa Barbara to meet MCR researchers, tour facilities, learn about LTERs, and get introduced to MCR research. MCR investigators and Diversity Project students overlap during the summer at the UC Gump Station in Moorea, which facilitates in-person interactions and mentoring, and results in a pipeline into graduate programs of MCR faculty investigators (5 Diversity Project alumni are currently graduate students in MCR investigator labs).

Outreach to Polynesians and Pacific Islanders is made through the Tahitian association *Te Pu 'Atiti'a*, which partners with the Gump Station, and through the University of Hawaii's Sea Grant Program TV series *Voice of the Sea* that airs in Hawaii and US territories in the Pacific. Examples of our outreach in French Polynesia include research presentations to the public and educators, working with the Teavaro School on Moorea to develop student-based monitoring for rivers and lagoons, and collaborations with the fisher community to exchange information about the status of reef resources.

MCR research has great relevance to resource managers, policy makers, and stakeholders in French Polynesia and beyond. MCR PIs annually brief the Ministry of the Environment of French Polynesia on MCR findings. This briefing has included information central to the sustainable management of nearshore reefs, including the importance of land-derived nutrient inputs to state shifts from coral to macroalgae (**Adam et al. 2021**) as well as the role nutrients play in bleaching and hindering reef recovery during heat waves (Burkepile et al. 2020, **Donovan et al. 2020**).

### SECTION 3 – RESULTS FROM SUPPLEMENTAL SUPPORT

**Equipment/Infrastructure.** The MCR received supplemental funds to repair, replace or upgrade oceanographic instrumentation (thermistor strings, PAR sensors, wave/tide recorders), for critical infrastructure for marine research operations (outboard engines, boat trailers), for MET station components and for associated expendables (e.g., lithium batteries). Funds also were used to ship the items to Moorea.

**RET – Research Experiences for Teachers.** Three RET awards supported the activities of 5 K-12 teachers from our partner schools; 4 traveled to Moorea for field research experiences.

**ROA** – **Research Opportunity Awards.** Two ROA awards enabled faculty from Cabrillo College and Santa Monica College, along with 4 undergraduate students, to conduct field research in Moorea alongside MCR researchers. An REU student also was funded from Cabrillo College.

#### SECTION 4 – RESPONSE TO MID-TERM REVIEW

The NSF summary of the 2019 Mid-term Report concurred with the Review Team's overall assessment that "the Moorea Coral Reef (MCR) Long Term Ecological Research (LTER) remains a stellar LTER ..." The three directives aimed at the MCR in the NSF summary are (verbatim):

Because of the positive nature of the review, the NSF comments will be brief and few.

- 1. Arguably, the major concern was extensive modeling efforts that were not well integrated to explain their role in furthering the specific research objectives. This was not viewed as a weakness in the modeling, but the panel recommendation for a clearer development in the renewal proposal is sound advice.
- 2. Similarly, while presentations made it clear that the outreach efforts were extensive and probably influencing under-represented students at several levels, this was not strongly developed in the proposal. While acknowledging that tracking and documenting the efficacy of education and diversity building activities requires some effort, this review criterion continues to grow in importance. As with modeling, the weakness was not in the activities but the documentation.
- 3. There were modest suggestions where sharing some of the data products might be improved.
- 1. The sole recommendation regarding MCR science was the need to better describe and integrate our modeling efforts with our time series and process studies. The Review Team and NSF noted that this was not a concern about the science but about the structure and integration of our MCR III proposal. We have taken this recommendation seriously and have integrated our modeling and synthesis efforts into each appropriate research theme in the MCR IV proposal. We agree that this improves clarity and understanding of the roles modeling efforts will play in advancing our specific research objectives.
- 2. The other major recommendation from the Review Team was to more effectively detail our efforts, successes, and challenges in broadening participation of groups underrepresented in science. We appreciated that the Review Team and NSF concurred that the weakness was in our documentation and not our efforts, as the MCR strives to create opportunities and promote diversity, inclusion, and equity in the marine sciences. Following the mid-term review recommendation, the MCR charged a standing DEI committee to evaluate current MCR efforts, recommend and implement enhancements, and identify needs and opportunities. Several new initiatives are planned for MCR IV (detailed below). We are currently working with the LTER Network Office to obtain the demographic information needed (via LTER Hub) to evaluate the efficacy of efforts to enhance diversity at all career stages within the MCR community.
- 3. With respect to suggestions regarding sharing of identified non-standard data products, after the review the MCR III Information Manager (Gastil-Buhl) engaged the LTER Network Information Managers Committee to develop best practices guidelines to increase consistency of these products across sites. Our new IM, Hillary Krumbholz, continues to work with the LTER Network towards these goals.

### SECTION 5 - PROPOSED RESEARCH

#### CONCEPTUAL FRAMEWORK

Anthropogenic climate change is altering the structure and function of ecosystems worldwide. The impact of climate change is from both directionally-changing drivers (e.g., increasing mean ocean temperature) as well as periodic weather anomalies that disturb ecosystems (e.g., marine heat waves, or episodes of unusually warm water) (McPhillips et al. 2018). Severe weather events are now a major threat as they increase in intensity and frequency (White and Jentsch 2001, Turner 2010, Hughes et al. 2017a, McPhillips et al. 2018). Thus, we need to better understand how these severe events contribute to

changing disturbance regimes (Trumbore et al. 2015, Turner et al. 2020). These climate-driven disturbances are occurring while a growing human footprint also intensifies local stresses to ecosystems. Consequently, the impact of a severe event can depend on interactions among multiple drivers that can amplify or attenuate an ecosystem's response (Rocha et al. 2018, Wong et al. 2021). For example, in Moorea, nutrient pollution can reduce the thermal threshold for coral bleaching during marine heat waves (Burkepile et al. 2020, Donovan et al. 2020). Due to their site-based, long-term perspective, LTER sites are ideal for exploring changing disturbance regimes, interacting drivers, and ecosystem dynamics.

An ecosystem's response to a severe event not only depends on the nature of the shock, but also on its history of disturbance and species attributes (Martin et al. 2015, Hughes et al. 2018, Ratajczak et al. 2017, 2018, Castorani and Baskett 2020, Turner et al. 2020). Past disturbances can generate persistent legacies that influence the trajectory of an ecosystem (Moorhead et al. 1999, Franklin et al. 2000, Monger et al. 2015, Johnstone et al. 2016, Hughes et al. 2019). Such legacies collectively are termed ecological memory and consist of two components. First, material legacies (sensu Jõgiste et al. 2017) are biotic or abiotic constituents left after a pulse event that influence post-disturbance dynamics. Material legacies such as standing dead trees in a forest after a drought or skeletons of dead branching corals on a tropical reef after a heat wave can either strengthen or weaken the capacity of the disturbed system to return to its initial state (Graham and Nash 2013, Johnstone et al. 2016). The second component of ecological memory, *information legacies*, arises from conditioning of the biological community as a longer-term outcome of a disturbance regime (Franklin et al. 2000, Johnstone et al. 2016, Safaie et al. 2018, Eirin-Lopez and Putnam 2019, Johnson et al. 2021). For example, on coral reefs repeated mortality from heat waves can select for coral taxa that may make coral communities less susceptible to future bleaching, or a heat wave may alter the physiology of surviving corals to make them less likely to bleach in the future (Wall et al. 2021, Sully et al. 2022).

Both components of ecological memory can influence the *resilience* of an ecosystem (Johnstone et al. 2016, Jögiste et al. 2017). In this context, resilience refers broadly to the capacity of a current ecosystem state to maintain or regain its structure and function in the face of perturbations without switching to a persistent alternative state with different structure and functions (Gunderson 2000, Standish et al. 2014, Lam et al. 2020, Van Meerbeek et al. 2021). Loss of resilience often leads to *abrupt change in ecological systems*, where shifts in state are rapid relative to the rate of change in underlying drivers (Turner et al. 2020). For example, combined disturbances of drought and fire can shift forested ecosystems to a persistent non-forest state as trees fail to regenerate (Stevens-Rumann et al. 2017, Davis et al. 2019). Indeed, ecosystems across the LTER network have experienced abrupt state shifts (e.g., McGlathery et al. 2013, Rocha et al. 2015, Cowles et al. 2021, Zinnert et al. 2021). These state shifts are difficult to anticipate (Scheffer and Carpenter 2003), can have profound effects on ecosystem services (Suding and Hobbs 2009), and can be difficult to reverse (Bestelmeyer et al. 2011, Graham et al. 2013), making them major concerns to scientists, resource managers, and other stakeholders.

Coral reef ecosystems are known for being at risk from changing disturbance regimes and interacting stressors such as fishing and nutrient pollution, often driving state shifts from the foundation species of coral to macroalgae or other space holders (Nystrom and Folke 2001, Bellwood et al. 2004, Graham et al. 2015, Lam et al. 2020, Mumby et al. 2021). Throughout their geological history, the primary disturbance to tropical reefs has been cyclonic storms that kill and remove large swaths of coral and other benthic organisms via strong hydrodynamic forces (Woodley et al. 1981, Scoffin 1993). Climate change may be increasing the strength of these storms, although substantial uncertainty remains in future projections (Trenberth 2005, Vecchi et al. 2021). By contrast, there is compelling evidence that climate change is increasing the frequency and severity of marine heat waves (MHWs), causing major episodes of mass coral bleaching and mortality since the 1980's (Glynn 1984, Baker et al. 2008, Lough et al. 2018, Sully et al. 2019). MHWs break down the critical mutualism between the coral host and its photosynthetic endosymbionts (dinoflagellates in the family Symbiodiniaceae). The coral and its associated microorganisms (i.e., the coral holobiont; Rohwer et al. 2002, Sogin et al. 2017) live near their upper thermal tolerance limit. Thus, a relatively small MHW can break down the coral-algae symbiosis, with corals turning pale (bleaching) as their photosynthetic algal endosymbionts are lost. If the MWH is

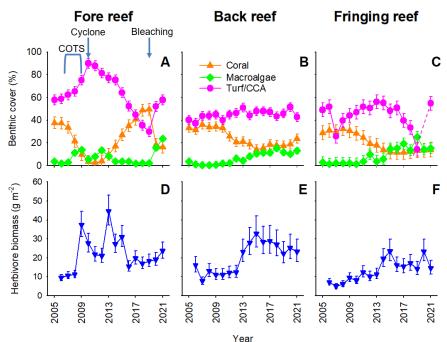


Figure 6. Island-wide community dynamics across habitats in the MCR time series (data are the means  $\pm$  1 SE). Dynamics of (A-C) coral, macroalgae, and turf algae/ crustose coralline algae (CCA) as well as (D-F) herbivorous fish biomass on the fore reef (left panels), back reef (center), and fringing reef (right) habitats. Note coral cover on the fore reef has declined in response to periodic disturbance from COTS/cyclone (2007-2010), from which it showed dramatic recovery, and coral bleaching (2019). In contrast, benthic communities on lagoon reefs have exhibited gradual declines in coral and increases in macroalgae.

intense and prolonged, corals will not recover their endosymbionts and may starve to death (Baird and Marshall 2002, Baker et al. 2008, Lough et al. 2018). The recent increase in bleaching-induced mass mortality of corals represents a profound shift in the disturbance regime to now include recurrent MHWs in addition to storms and other local pulse events. There is urgency to identify how this altered disturbance regime can lead to legacies that affect resilience (Graham et al. 2015, Hughes et al. 2017a,b, 2018, Leggat et al. 2019).

On Moorea, the history of disturbance and the responses of reefs have differed significantly between the fore reef and lagoon. On the fore reef (Fig. 1), major historical coral mortality events have come from outbreaks of the corallivorous Crown-of-Thorns Seastar (COTS), first in 1979-1983 and again in 2007-2010, and from a MHW and coral bleaching event in 1991 (Adam et al. 2011, 2014, Pratchett et al. 2011, Trapon et al. 2011). COTS outbreaks and bleaching both lead to similar mortality patterns in that corals are killed in place and their dead skeletons remain. However, in all three of these specific disturbance events on Moorea, cyclones followed shortly after the initial coral mortality, pulverizing and removing the dead coral skeletons and reducing the fore reef to a relatively planar structure. After these disturbances where dead skeletons were removed, coral recovered to its pre-disturbance cover without macroalgae becoming dominant (Trapon et al. 2011, Holbrook et al. 2016, 2018).

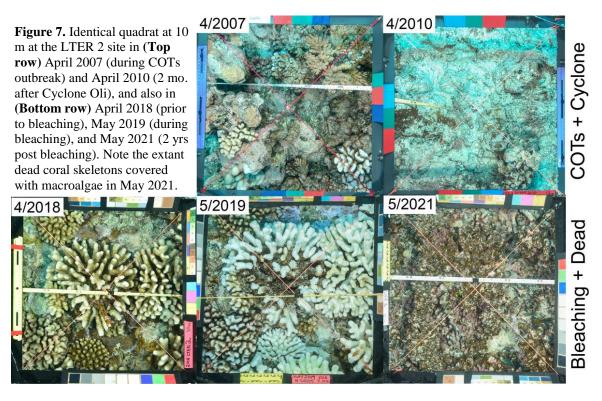
MCR III research showed that two key processes accounted for the observed high resilience of the coral state following the 2010 cyclone (Fig. 6). First, herbivorous fishes increased in biomass in response to increased food availability and, as a result, were able to prevent macroalgae from proliferating, thereby keeping the vast, newly-disturbed area of the fore reef surface suitable for re-colonization by corals (Adam et al. 2011, Holbrook et al. 2016). Second, there was a high rate of recruitment of sexually produced coral propagules, especially of the branching coral *Pocillopora*, likely coming from other locations, to these suitable surfaces (Edmunds 2018, Holbrook et al. 2018, Kayal et al. 2018).

In contrast to the fore reef, our time series data reveal that lagoon reefs suffered lower coral mortality than did the fore reef during the 2007-10 disturbances (Fig. 6). Yet, there has been much more spatial heterogeneity in community dynamics in the lagoon, with some lagoon reefs remaining dominated by coral while others have transitioned to high cover of macroalgae (Adam et al. 2021). Importantly, compared to the fore reef, reefs in the lagoon exist across a far more heterogeneous template of local stressors such as nutrient pollution and fishing. Our work in MCR III suggested that these local stressors may interact with climate drivers to impact spatial heterogeneity of dynamical responses in the lagoon.

For example, corals in lagoon areas with high nutrient enrichment had a higher probability of bleaching compared to corals in areas with low nutrients (Donovan et al. 2020), and higher nutrient availability was correlated with a rise in macroalgae and decline in corals (Adam et al. 2021). Lagoon reefs also tend to be more vulnerable than the fore reef to shifts to macroalgae because herbivores are less capable of keeping macroalgae under control (Schmitt et al. 2019), possibly due to nutrient enrichment that increases the probability that macroalgae will escape control (Adam et al. 2021). Further, less herbivory is needed to prevent the establishment of macroalgae than to remove mature plants, resulting in hysteresis in the herbivore-macroalgae relationship that enables coral and macroalgae to be alternative basins of attraction under some range of environmental conditions (Schmitt et al. 2019, 2021). Thus, if disturbances and/or local stressors drive shifts to macroalgae states in the lagoon, they may be difficult to reverse. The dynamics of the lagoon ecosystem appear strongly influenced by the disturbance regime and how it interacts with the template of local stressors to influence resilience.

Now, we appear to be undergoing a significant change in the disturbance regime in Moorea. The austral summers of 2019 and 2020 resulted in the two largest MWHs in the history of the MCR, and 3 of the 4 hottest MHWs have occurred since 2016 (Fig. 2). The MWH in 2019, the mid-point of MCR III, resulted in a substantial amount of coral bleaching and mortality on the fore reef and in parts of the lagoon (Fig. 6; Burgess et al. 2021, Speare et al. 2022). This disturbance followed a decade of MCR research focused on understanding the dynamical response of these same coral communities to disturbance from a powerful cyclone. The fundamentally different disturbance generated by the 2019 MHW provides the MCR with an extraordinary opportunity to address unresolved questions regarding dynamics of coral reefs from severe events that have substantially different material legacies by removing dead coral skeletons (e.g., cyclones) or leaving them intact (e.g., MHWs; Fig. 7). Further, the changing disturbance regime will allow us to study how local stressors shape the information legacies created by MHWs and how they impact corals at individual, population, and community levels. Our research is motivated by key patterns in our time series data and is organized around the following core question:

How is a changing disturbance regime altering the resilience of coral reefs and what are the ecological consequences of altered resilience?



#### THE MCR IV RESEARCH PROGRAM

Our proposed research is organized around three themes that have emerged from our time series, described next.

# **The MCR Time Series Component**

Our time series provides critical temporal and spatial information on three key aspects: (1) population and community dynamics of major functional groups, (2) rates of key ecosystem processes, and (3) patterns of environmental drivers of community structure and ecosystem function. This provides a framework for quantifying trends in ecosystem dynamics, including responses to and recovery from disturbance and consequences to ecosystem function, as well as the key abiotic factors that influence the ecosystem.

Time Series Focus 1: Community dynamics and long-term trends of key functional groups Abundances of corals, other macro-invertebrates, algae and fishes are estimated yearly on the fore reef, back reef, and fringing reef at six sites, two on each side of Moorea (Fig. 1). These data reveal different responses and rates of recovery of the reefs to disturbance as well as attributes that influence resilience (Adam et al. 2014, Edmunds 2018, Holbrook et al. 2018). Organisms (~500 taxa) are identified to the lowest taxon possible (typically species or genus). Estimates are made visually along permanent band transects or from permanent quadrats that are surveyed *in situ* by SCUBA divers (e.g., sea urchins, fishes) or using photo-quadrats (e.g., corals, macroalgae). Analyses of community structure based on digital images (i.e., photo-quadrats) are aided by image analysis tools (CoralNet, developed via a collaboration with MCR, Beijbom et al. 2012, 2015, Miller et al. In review). To better link coral abundances with the demographic causes of changing population size, early coral recruits are enumerated using tiles immersed for 6-month periods at locations on the north shore of the island (fore reef at 10 m and 17 m depth, and the back reef; Edmunds 2018, 2021). In addition, juvenile corals (colonies ≤ 40 mm diameter) on natural substrates are quantified *in situ* to augment the information obtained from the photo-quadrats.

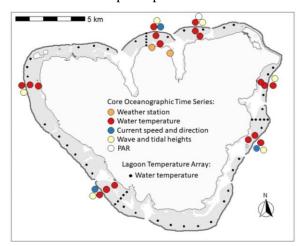
Time Series Focus 2: Spatio-temporal patterns in rates of key ecosystem processes Rates of reef metabolism (primary production and respiration) are estimated twice annually using a Lagrangian approach at two locations in the lagoon on the north shore and every 3 years on the other shores. Coral reefs typically have low production in the water column and high rates of gross benthic primary production (GPP). Because reef heterotrophs normally consume almost all of that production each day, the net primary production (NPP) of the community typically approaches zero (Atkinson 2011); our data fit this paradigm. Variation in gross production is driven largely by differences in light and water flow that determine the fluxes of dissolved inorganic carbon and nutrients (Comeau et al. 2017, Carpenter et al. 2018, Doo et al. 2019). Concentrations of nutrients in Moorea are low and near detection limits, making spot sampling of water column nutrients a poor proxy for long-term patterns in nutrient availability. Further, current velocity, rather than concentration alone, is typically the dominant component of nutrient flux (Atkinson 2011). Accordingly, we measure current velocities on appropriate spatial and temporal scales, and use estimates of % nitrogen in the tissues of a long-lived macroalga (Turbinaria) collected in all three habitats from our six permanent sampling sites as an integrated estimate of nutrient flux over longer periods (Adam et al. 2021). Variables related to ocean color (e.g., sub-surface Chl a concentration, light absorption by dissolved and detrital matter, particulate backscattering) are derived from satellite spectral radiometry (MODIS-Aqua, VIIRS on Suomi-NPP and JPSS1), and regional satellite sea-surface temperature data from the MODIS sensors are also assembled.

The ability of coral reefs to maintain net positive calcification is essential to their biological and physical functions, yet these foundational roles are challenged by changes in the benthic community structure (e.g., declining abundances of massive corals) and reduced seawater pH. Reef accretion (i.e., growth) is the net outcome of CaCO<sub>3</sub> deposition and dissolution. We will initiate a new time series in MCR IV to address these processes. Rates of net reef bioerosion will be evaluated through annual deployment of accretion-erosion blocks (Silbiger et al. 2016, 2017) left for a 2-year 'soak' time in four habitats near one of our north shore sites (LTER 1). These deployments will leverage the biological and physical environmental data we collect there, and allow CaCO<sub>3</sub> loss to be placed in an accretion context

estimated through coral cover and the ReefBudget module within CoralNet (Courtney et al. 2021). Replicate blocks (N = 5) will be placed in each habitat, and following their 'soak' time, they will be recovered and processed to quantify voids within the rock using  $\mu$ CT scanning (Silbiger et al. 2016).

<u>Time Series Focus 3:</u> Patterns of temporal and spatial variation in major physical factors
Reefs of Moorea are affected by several types of physical forcing (Leichter et al. 2013). Cyclones
physically damage coral and other reef organisms, marine heat waves trigger coral bleaching and
mortality, and currents transport nutrients and propagules such as coral larvae. We have instrumented the
reefs encircling Moorea with a range of physical oceanographic sensors to measure factors known to
influence coral reefs including abiotic conditions [PAR, ocean temperature, current speed and direction,
offshore wave statistics (height, direction, period), salinity, water levels]. Simultaneous measurements of
wave heights and currents on the offshore fore reef are critical given that water flow in lagoons and local
circulation patterns are driven primarily by the offshore wave climate (Hench et al. 2008, Monismith et al.
2013). We have one heavily-instrumented fore reef site on each side of the island, with additional
deployments at the other three fore reef sites and throughout the lagoons (Fig. 8). We have used these data
on physical factors to help explain patterns in community dynamics and ecosystem processes (e.g., Adam
et al. 2014, 2021, Donovan et al. 2020, Wyatt et al. 2020). In 2021, we greatly intensified our spatial
coverage of seawater temperature by deploying a grid of 48 additional high-resolution thermistors
throughout the lagoons for a multi-year study. These will reveal fine scale spatial patterns in seawater

temperature that will be critical for our ongoing studies of coral bleaching as well as for incorporation into our lagoon circulation models (see Question 2.1 for details). Data obtained from in situ oceanographic sensors and derived from satellite imagery (e.g., regional sea surface temperature) along with our highresolution bathymetric data from LIDAR surveys (Collin et al. 2018) provide critical input parameters and boundary conditions for our circulation models, as well as metrics of major disturbance events (e.g., cyclones, coral bleaching) and ongoing climate change. Oceanographic measurements are complemented by surface environmental data from our MET station at the Gump Station. Data on longterm changes in sea level are obtained through the Permanent Service for Mean Sea Level for the Papeete, Tahiti station, 20 km east of Moorea.



**Figure 8.** Map of Moorea showing the locations of the physical oceanographic sensors deployed on the fore reef and in the lagoons around the island.

## **Proposed Research**

Our three research themes (Fig. 9) are motivated by patterns in our time series and new questions sparked by our prior findings. We first provide a general motivation for each theme, and then state our specific research questions and give a description of the research approaches we will take to answer them.

# Theme 1: How do material legacies from different disturbance types affect community dynamics, changes in state, and resilience?

Coral bleaching events from marine heat waves (MHWs) are becoming the most frequent disturbance on coral reefs. Bleaching events leave dead coral skeletons in place, providing a very different material legacy from storm-driven disturbances that typically remove coral skeletons. Following the 2019 bleaching event, herbivores on the fore reef appear less capable of keeping macroalgae suppressed on the coral skeletons and disturbed surfaces compared to the 2010 cyclone (Figs. 6, 7). The macroalgae may slow or prevent a return to a coral state if the dead coral legacy remains for extended periods. In Theme 1, we will examine how the ecological legacies of different types of disturbances (MHWs vs. storms) shape

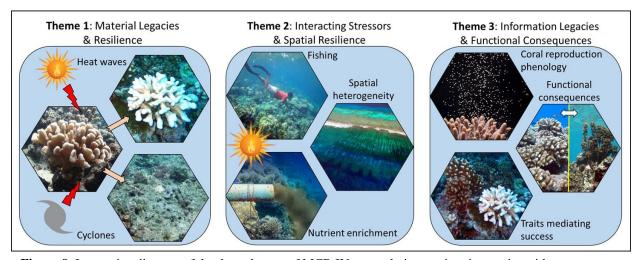
community structure, alter the probability of state shifts, and change ecosystem function (Figs. 9, 10). We will focus largely on the fore reef where coral mortality from storms and bleaching is the most severe.

# Theme 2: How do local stressors interact with new disturbance regimes to drive spatial heterogeneity in community dynamics, ecosystem processes, and spatial resilience?

Theme 2 will largely focus on the lagoon where there is high spatial heterogeneity in stress levels from multiple sources. In MCR III, we showed that spatial patterns in top-down (herbivory) and bottom-up (nutrient flux) forcing shape spatial heterogeneity in community dynamics on lagoon reefs. The MHWs that are increasing in frequency (Fig. 2) are also having variable spatial impact across the lagoon in triggering coral bleaching and mortality. In Theme 2, we will focus on understanding how MHWs interact with local anthropogenic stressors (e.g., nutrient enrichment, fishing) to drive shifts in community state that have profound implications for ecosystem processes such as primary production, nutrient cycling, and organic matter accumulation (Figs. 9, 16). Additionally, we will explore how feedbacks between coral- and macroalgae-dominated regions of connected landscapes may generate complex spatial patterns at intermediate scales and lead to more gradual shifts between states at the whole-reef scale.

# Theme 3: How do disturbances generate information legacies in corals and coral reef communities that influence their resilience under current and future environmental conditions?

The information legacies that disturbances and local stressors create by altering traits of species as well as species composition of communities can determine the future resilience of ecosystems. Understanding the responses of scleractinian corals, the foundation group of the coral reef ecosystem, to changing environmental conditions is of critical importance in determining whether the coral community can remain resilient. In Theme 3, we will explore the organismal responses of branching corals, mainly *Pocillopora* spp., to changing conditions, and how these effects scale up to modulate the structure and function of the reef community (Figs. 9, 21). Evaluating whether these responses ultimately can ensure their survival under changing disturbance regimes is central to the debate of whether (or not) coral reefs will persist.

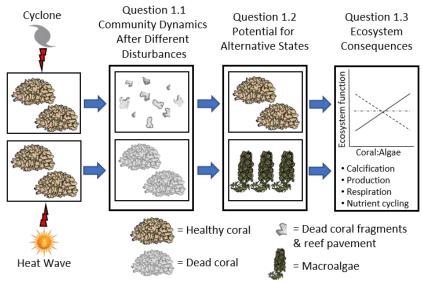


**Figure 9.** Integrative diagram of the three themes of MCR IV research, integrating time series with process-based studies to address patterns, processes, and future projections. **Theme 1** explores how material legacies left by different types of disturbances (cyclones vs. heat waves) impact community dynamics and ecosystem processes. **Theme 2** examines how heat waves interact with spatially varying local stressors (fishing, nutrient loading) to drive state shifts in communities and alter ecosystem function. **Theme 3** tests how information legacies from changing disturbance regimes impact individual to ecosystem-level functional consequences.

#### **Research Themes**

# Theme 1: How do material legacies from different disturbance types affect community dynamics, changes in state, and resilience?

<u>Question 1.1:</u> What factors drive heterogeneity in coral recovery across the landscape (among sites and depths) following coral bleaching? How does the presence of the dead coral skeleton material legacy alter community dynamics and influence the ability of coral to recover?



**Figure 10.** Conceptual diagram outlining the major questions in **Theme 1**. Inspired by the recent disturbances affecting the reefs of Moorea, we will quantify how the material legacies of different disturbances influence post-disturbance dynamics (**Q1.1**), potentially mediating switches to alternative states (**Q1.2**), and altering ecosystem functions (**Q1.3**).

**Rationale:** Our time series showed that the 2019 MHW caused significant coral bleaching and mortality that varied around the island and across depths with highest mortality at shallower depths (Fig. 11) and on the north shore (Fig. 12). In MCR III, our time series and process studies showed that following the 2010 cyclone, the rates of coral recruitment strongly influenced the rate of coral recovery around the island and across depths. Importantly, the cyclone removed dead coral structure resulting in open substrates suitable for coral recruitment (Holbrook et al. 2018). By contrast, the 2019 MHW left dead coral colonies in place, thus providing rugose surfaces

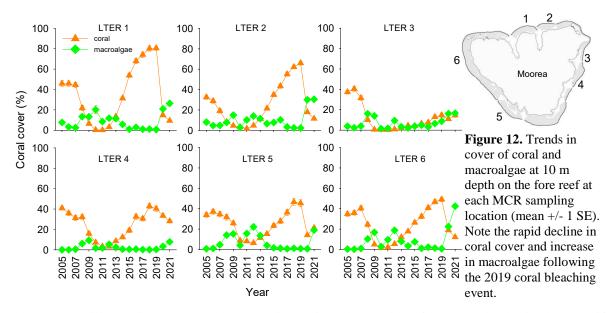
that rapidly were colonized by the macroalga *Lobophora* that deters coral settlement (Adam et al. In review). The material legacy of dead coral colonies potentially promotes a different community dynamic compared to the previous cyclone disturbance: now, the recovery of corals will be influenced by coral recruitment as well as the rate of erosion of dead coral colonies and the creation of suitable substrates for coral settlement. Our research will explore whether coral recruitment rates interact with erosion rates of

dead coral colonies to control the pace and trajectory of recovery of the coral community.

**Approach:** We are using three approaches to understand the factors driving heterogeneity in coral recovery following bleaching. *First*, we will use our core time series to quantify the trajectories of changing coral cover around the island. In 2020, we established additional benthic transects at 4 sites along the north shore at 5 m, 10 m, and 17 m depths (N = 4 transects per depth per site) to supplement our core times series transects and provide a platform for process studies. These new transects allow us to quantify coral recovery at shallow depths (5 m) where bleaching mortality was highest and where physical forcing

**Figure 11.** Island-wide mean ( $\pm$  SE, N = 6 sites) coral cover around Moorea at 10 m and 17 m depth.

is strongest compared to deeper depths. *Second*, data on coral recruitment, growth, and survivorship from our time series will be used to link demographic processes in corals to recovery rate across sites and



depths. We will examine how coral recovery is mediated by erosion of dead coral colonies by quantifying rates of colony erosion using a time series of photographs (Adam et al. 2014). Further, erosion rates will be related to wave climate using data from our core physical oceanographic time series. Process studies will explore how biotic processes such as herbivory and corallivory influence coral demographic rates and the trajectory of community dynamics across depths (e.g., Ladd et al. 2021). Given that coral diversity is an important determinant of coral growth and production (Clements and Hay 2021), we will use our time series data and *in situ* experiments to examine how different levels of coral diversity (including cryptic diversity of *Pocillopora* species; Burgess et al. 2021) affect recovery.

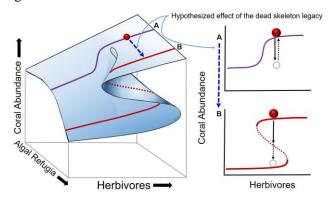
Third, we initiated a **Dead Coral Removal Experiment** to test how the presence of dead coral skeletons influences community dynamics. In this experiment, following the 2019 bleaching event dead coral skeletons were removed in 4 m² plots (N = 10 per removal and control treatments) at one 10 m site to address mechanisms underlying the influence of coral skeletons on community trajectories. We are using high-resolution 3D photogrammetry methods, which the MCR helped develop (Nocerino et al. 2019, 2020), to track the growth of surviving corals (at mm scales) and quantify how the presence of dead coral skeletons in the local neighborhood influences coral growth and mortality. The photomosaics also are being used to quantify coral recruitment, coral-coral competition, and coral-algal competition. Additional short-term process studies and assays will assess how rates of herbivory and corallivory in these plots influence community dynamics in the presence and absence of dead coral skeletons.

<u>Question 1.2:</u> Do structure-retaining disturbances increase the basin of attraction (region of bistability) of macroalgae-dominated states? Are the macroalgae states that arise from structure-retaining disturbances self-reinforcing?

Rationale: MCR III research revealed that macroalgae and coral states can behave as alternative basins of attraction when herbivores can prevent initial colonization of macroalgae but cannot extirpate established plants (Davis 2018, Schmitt et al. 2019, 2021). Further, life-stage-related decline in vulnerability of macroalgae to herbivory promotes alternative stable states in theoretical models of herbivore – macroalgae – coral interactions (Briggs et al. 2018, Rassweiler et al. 2021). These findings underlie our hypothesis that compared to a structure-removing disturbance, dead coral skeletons remaining after a structure-retaining disturbance increase the probability of a state shift from coral to macroalgae by shielding vulnerable young stages from herbivory. This mechanism facilitates survival and growth of macroalgae to herbivore-resistant stages and the establishment of positive feedbacks that promote self-replenishment (e.g., associational defenses; Bittick et al. 2010, Davis 2018). Our conceptual model (Fig. 13) is depicted as a response surface (left panel) showing how the equilibrium abundance of macroalgae

hypothetically varies as a function of herbivore biomass and the amount of spatial refugia for young macroalgae; the right panels illustrate how herbivore-macroalgae relationships at two locations on the resilience landscape can produce qualitatively different dynamical responses to a disturbance. Under conditions with few algal refugia (Fig. 13, purple line), only one equilibrium abundance of macroalgae exists for any given biomass of herbivores in the environment, and a system located anywhere along the purple line is highly resilient to a large disturbance (Fig. 13, top right). Hysteresis in the herbivore-macroalgae relationship when algal refugia are abundant (Fig. 13, red line) creates the potential for coral and macroalgal states to be bistable over some range of herbivore biomass (see Schmitt et al. 2019, 2021). A large disturbance to a system in the bistability portion can flip the community from one basin of attraction to the other (Fig. 13, lower right). We hypothesize that a skeleton-retaining disturbance moves the system along the 'Algal Refugia' dimension of the resilience landscape toward - and potentially into - the region of state space where hysteresis exists in the herbivore-macroalgae relationship, without a change in herbivore biomass (Fig. 13). As such, a structure-retaining disturbance could weaken resilience of the coral state and foster a regime shift to macroalgae.

**Approach:** The above questions will be addressed using long-term experiments, field process studies and modeling, together with data from core time series and relevant findings from Question 1.1. *First*, we will establish a Hysteresis Experiment on the fore reef to quantify the relationship between variation in herbivory and the resultant biomass of macroalgae as a function of two factors: the starting community (macroalgae vs. invasible turf algae) and disturbance type (presence vs. absence of dead coral skeletons). The starting community treatment will reveal whether the herbivore-macroalgae relationship for either disturbance type changed from before to after a shift to macroalgae, which is diagnostic of hysteresis (Bestelmeyer et al. 2011, Schmitt et al. 2019). Comparison of the relationships for the two disturbance types (skeletons present vs. absent) will reveal whether the location of



**Figure 13.** (Left) A hypothetical response surface showing how the equilibrium abundance of coral might vary as a function of herbivore biomass and amount of physical refugia that facilitate the proliferation of macroalgae. Skeletons of coral can provide vulnerable stages of algae protection from herbivores, thereby shifting the system into a region of state space where coral and macroalgae can be bistable, profoundly affecting resilience of the coral state (**Right**). See text for more detail.

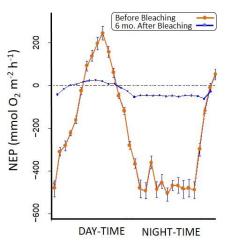
hysteresis differs between skeleton-retaining and skeleton-removing events under otherwise identical environmental conditions. The experiment will use the same techniques and design that we have employed in several previous multi-year probes for tipping points, hysteresis and effects of herbivory (Holbrook et al. 2016, Schmitt et al. 2019, 2021, Adam et al. In review). Briefly, a gradient in the biomass of herbivores that have access to focal benthic plots will be created using semi-permeable cages bolted to the reef framework; a series of exclosures that have different size holes sequentially will reduce the maximum body size of an herbivorous fish that can enter (Holbrook et al. 2016). We plan 5 herbivore (determined by hole size in cages) treatments (N = 5 per treatment), plus a cage control, which will create graded variation in herbivory ranging from ambient to almost none on a 0.25 m² plot. *In situ* videos of each hole size treatment will quantify the herbivory gradient (Holbrook et al. 2016, Schmitt et al. 2021). The experiment will run for 3 years, after which the composition and biomass of macroalgae will be quantified. Our hypothesis will be supported if the region of hysteresis in the herbivore - macroalgae relationship is (statistically) further away from ambient in the 'skeleton absent' treatment relative to the 'skeleton present' treatment.

*Second*, we will explore hysteretic dynamics via differential equation modeling. MCR researchers have developed an initial model that involves dead coral skeletons based on an established set of state

variables and interactions. Specifically, the model assesses the relative impacts of structure-removing and structure-retaining disturbances on the potential for coral to recover by comparing post-disturbance trajectories following varying intensities of each disturbance type. Preliminary analyses indicate that gradually eroding skeletons support bistability and increase the likelihood of transitions to macroalgae-dominated states. The amount of refuge space for macroalgae and the dissolution rate of dead skeletons determine transition likelihood and speed, and these will be quantified from the experiment and our time series transects (Question 1.1) and will be used to parameterize subsequent iterations of the model.

Third, a **Regime Shift Experiment** was initiated in August 2021. The experiment consists of 45 similar-sized patch reefs (bommies) all initially covered with the macroalga Turbinaria assigned haphazardly to one of 3 disturbance treatments (N = 15 per treatment). The first treatment represents a powerful structure-removing event (cyclone), the second mimics a bleaching event that left coral skeletons intact, and the third consists of unmanipulated controls. For the bleaching treatment, 10 intact dead *Pocillopora* skeletons were affixed to each bommie (after removal of macroalgae), spaced to replicate the dead coral cover following previous major bleaching events in 2019 (Fig. 11) and 1991 (Edmunds et al. 2015). The 15 bommies in the cyclone treatment were cleared of macroalgae to simulate storm scouring (Schmitt et al. 2019). Community trajectories on all 45 bommies and the erosion rate of bleached coral will be quantified 2 to 3 times per year using high resolution photogrammetry developed for this application (Nocerino et al. 2020). We anticipate it will take at least several years for the dead skeletons to erode (Swanson 2016); the experiment will be terminated a year after that point in order to assess whether macroalgae (if established) remains self-replenishing. At termination, benthic communities will be quantified and data analyzed using the same criteria and methods as in previous MCR state change experiments (Schmitt et al. 2019, 2021) to facilitate direct comparison. The hypothesis will be supported if a greater proportion of bommies in the bleaching disturbance treatment transitioned to a self-replenishing macroalgae community compared to the structure-removing disturbance treatment.

**Question 1.3:** How does post-disturbance coral recovery influence key ecosystem processes? How do different disturbance types differentially impact ecosystem processes?



**Figure 14.** Rates (mean  $\pm$  SE) of hourly net ecosystem production (NEP) at LTER 1 fore reef at 10 m depth before and 6 months after the coral bleaching event in 2019. Rates of NEP were measured using a gradient flux method that estimates NEP over a footprint of 10-50 m<sup>2</sup> of reef.

**Rationale:** The composition of the benthic communities on coral reefs influences ecosystem processes. For example, the abundance of live coral is strongly linked to calcification rates, while the ratio of corals to algae influences benthic production and respiration (Carlot et al. 2021). These differences in community composition and ecosystem metabolism drive biophysical feedback loops that further alter local biogeochemical conditions (Silbiger et al. 2018, Silbiger and Sorte 2018, Fields and Silbiger 2022). Fishes represent the largest pool of organic biomass and nutrients on coral reefs (Newman et al. 2006, Allgeier et al. 2017), and our time series shows that the amount of habitat structure provided by corals influences the abundance and diversity of fishes (Adam et al. 2014), which then affects a host of ecosystem processes such as herbivory and nutrient cycling (Burkepile et al. 2013, Munsterman et al. 2021). Thus, the two different disturbances in our system (cyclone vs. bleaching event) are likely to result in fundamentally different impacts on ecosystem processes.

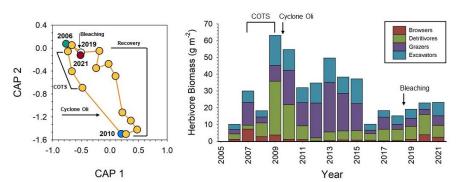
**Approach:** We will use three approaches to address the dynamics of ecosystem processes in response to coral-killing disturbances. *First*, to address benthic-associated ecosystem processes, we will continue our time series, begun during MCR III, using the gradient flux technique to measure reef

metabolism (primary production and calcification) on the fore reef (Fig. 14). This work was expanded after the 2019 bleaching event via a RAPID award (PI Carpenter). The gradient flux measurements are combined with photomosaics of the benthos to link changes in the benthic community with changes in reef metabolism. These data will allow us to quantify how the material legacy of dead coral skeletons influences reef metabolism, how these impacts change as dead corals erode, and how reef metabolism changes with future trajectories of the benthic community.

Second, to characterize the effect of coral-killing disturbances on biophysical feedback loops, we will pair the data described above with measurements of pH, dissolved oxygen (DO), temperature, and light taken just above the reef and at the ocean surface to characterize not only how changes in the environment affect reefs, but how altered reefs change the local biogeochemical conditions. Prior research found that loss of foundation species and/or a disturbance that changes their physiology led to immediate changes in local pH, DO, and light, in turn impacting organismal and community processes (Silbiger et al. 2018, Fields and Silbiger 2022). By pairing environmental data with community composition and community metabolism we can understand mechanisms that lead to altered biogeochemical conditions and thereby better predict the effect of disturbances on ecosystem function.

*Third*, to examine how disturbances impact fish-associated ecosystem processes, we will combine data from our fish time series (Fig. 15) with models estimating ecosystem process rates of fishes. Existing relationships between individual fish biomass and rates of ecosystem processes (N and P

excretion/egestion, C/N/P storage, herbivory, piscivory) will be used to generate community-wide estimates of these processes from our time series data on fish communities (e.g., Allgeier et al. 2021, Munsterman et al. 2021, Schiettekatte In press). These data will allow us to examine how changes to the fish communities driven by different types of disturbances (coral skeleton removing vs. coral skeleton retaining) affect ecosystem processes.



**Figure 15.** (Left) Ordination showing changes in the fish community observed at fore reef site LTER 2. The first two axes of the ordination, CAP1 and CAP2, accounted for 31% and 17%, respectively, of the variation in the community. Indicated on the graph are the first year, 2006, in the time series (green circle), the first year of Crown-of-Thorns Seastar (COTS) outbreak, the impacts of Cyclone Oli (blue circle), the coral bleaching event in 2019 (white circle), and the most recent year in the time series, 2021 (red circle). (**Right**) Trends in herbivore biomass by feeding guild at fore reef site LTER 2.

# Theme 1 Modeling and Integration: How disturbance, herbivory, and nutrients affect coral resilience

Ongoing modeling work has allowed us to: (1) use photogrammetric measurements to project the growth of coral communities using Integral Projection Models (IPMs; e.g., Kayal et al. 2018) and (2) integrate data on macroalgal herbivory into differential equation models for state shifts on Moorea's reefs (e.g., Briggs et al. 2018). During MCR IV, we propose to unite these successful (but, thus far, separate) modeling efforts using data collected as part of Theme 1 and MCR-associated work on how disturbance and nutrient availability interact to affect growth and competition between corals and macroalgae. This effort will occur via an ongoing **Resilience Working Group** that will be established in Year 1. Along with the other working groups proposed for Themes 2 and 3, it will meet in Santa Barbara after our annual All Investigator Meeting, and at other times (in person or virtually) through the year.

We will begin by expanding our existing community-level coral IPMs to include data on coral-skeleton and coral-macroalgae interactions, and by creating IPMs for macroalgae. We will use data from

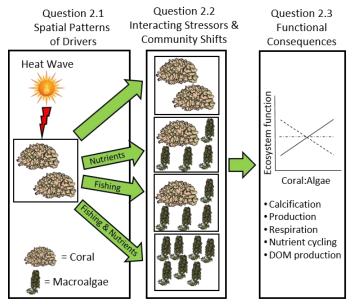
the *Dead Coral Removal Experiment* (Question 1.1) to estimate demographic rates (e.g., recruitment, growth rate, and mortality) of macroalgae and coral in the presence and absence of dead coral skeletons. To obtain similar data as a function of nutrients and herbivory, we will use data from another ongoing experiment where corals were removed to mimic a cyclone or corals remained intact. A gradient of herbivory was created with exclosures, and slow-release fertilizer (Osmocote) enriches half of the exclosures with N and P (sensu Schmitt et al. 2019, Burkepile et al. 2020). Fortuitously, this experiment experienced high loss of corals in the 2019 bleaching event, thus allowing us to assess how altering herbivory and nutrients impacts benthic dynamics in response to different disturbances.

To synthesize our IPMs with models of benthic cover, we will use two approaches. *First*, we will use empirical data on macroalgal biomass and coral colony size to build statistical scalars that translate IPM outputs to areal footprint. This allows use of the mechanistic IPMs to drive the growth and mortality rates that are typically loosely defined as changes in areal extent in coral-macroalgae hysteresis models (e.g., Mumby et al. 2007, Baskett et al. 2014). *Second*, we will develop new, cellular automata models (e.g., Eynaud et al. 2016) that explicitly represent benthic space as an occupancy grid (where grid locations can be occupied by species of coral, macroalgae, or turf). We will use empirical data on how coral and macroalgal growth is affected by context (e.g., nutrient availability, neighboring coral skeletons or live individuals) to derive updating rules for this model, and contrast its predictions for individual expansion (e.g., the rate at which a *Pocillopora* colony extends to neighboring cells) with the IPMs and its predictions for benthic cover with state-shift models. These approaches complement modeling efforts described in Theme 2 that will explore the effects of spatial heterogeneity on resilience.

# Theme 2: How do local stressors interact with new disturbance regimes to drive spatial heterogeneity in community dynamics, ecosystem processes, and spatial resilience?

**Question 2.1:** How do key external drivers of benthic communities vary spatially within the lagoons?

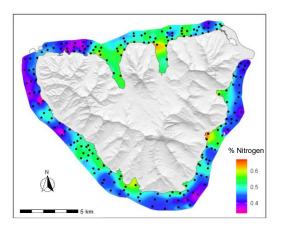
**Rationale:** Reefs in the lagoons of Moorea are influenced by a combination of natural physical forces (e.g., water flow, temperature) as well as exposure to chronic anthropogenic stressors such as fishing and



**Figure 16.** Conceptual diagram outlining the major questions in **Theme 2**. Motivated by our time series, we quantify patterns of spatial heterogeneity in interacting stressors (**Q2.1**) that create heterogeneous community responses to marine heat waves (**Q2.2**) with resulting effects on ecosystem processes (**Q2.3**).

nutrient pollution, all of which can be spatially heterogeneous. At the same time, these reefs are experiencing the effects of a warming climate, including an increase in the frequency and severity of marine heat waves (MHWs) that cause coral bleaching and mortality (Fig. 2). Spatial heterogeneity in temperature dynamics can result in divergent patterns of coral bleaching and mortality across small spatial scales (e.g., < 1 km; Safaie et al. 2018, Donovan et al. 2020). Temperature can also interact with other spatially heterogeneous physical factors and anthropogenic stressors to drive patterns of coral bleaching and mortality during a MHW. For example, during a MHW in Moorea in 2016, sites impacted by nitrogen enrichment from sewage and agriculture experienced increased coral bleaching, with excess nitrogen exacerbating the negative impacts of that moderate thermal stress event on corals (Donovan et al. 2020). Over longer time scales, our core time series data have

revealed that nitrogen enrichment is associated with coralto-macroalgae phase shifts in the lagoons (Adam et al. 2021). Spatial patterns of nitrogen enrichment are shaped by oceanographic processes that influence the delivery of nutrients from local anthropogenic sources by driving patterns of water flow (Adam et al. 2021). Water flow in the lagoons affects a range of additional processes, including primary production, the dispersal of propagules, accessibility of feeding locations to herbivorous and corallivorous fishes, temperature dynamics, and coral bleaching (Lenihan et al. 2008, 2015). Lastly, we have found significant heterogeneity in the structure, stability, and resilience of coral and water microbiomes across the lagoon, which suggests that variation in environmental factors influences coral holobiont features that, in turn, may affect their ability to resist or recover from disturbance. Here, we will quantify spatial patterns of key drivers of lagoon spatial heterogeneity, including physical processes (e.g., temperature) and local anthropogenic stressors (e.g., nutrient pollution, fishing) that interactively drive benthic community dynamics.



**Figure 17.** Location of sampling sites around Moorea (black dots) with spatial patterns of nitrogen enrichment (percent nitrogen in tissue from the macroalga *Turbinaria ornata*). Nitrogen is represented as a continuous surface where warmer colors represent higher nitrogen and cooler colors represent lower nitrogen.

**Approach:** To better understand spatial heterogeneity in physical factors and anthropogenic stressors that can influence benthic community dynamics, we will build on our existing core time series and current research campaigns to document, at high spatial resolution, how temperature dynamics, nutrient enrichment, and fishing pressure vary across the lagoons. During 2021, we installed an array of thermistors (SBE-56, resolution  $\pm 0.002$ °C) at 48 new sites in the lagoon, to expand on water temperature data from our core time series (collected on the fore reef, fringing reef and back reef at the six core MCR sites, Fig. 8). The new array consists of a ring of 36 sensors encircling the island (at ~1 km spacing), deployed 200 m shoreward of the reef crest plus 3 cross-shore transects (each consisting of 4 sensors) spanning from the reef crest to the shoreward edge of the lagoon (Fig. 8). This array will characterize how temperature dynamics within the lagoons vary both across-shore and along-shore around the island. With respect to nutrient enrichment, we will quantify inorganic nutrients in the water column and nitrogen tissue content in the brown macroalga Turbinaria ornata across our grid of 200 lagoon sites around the island annually at the end of the warm rainy season in April/May (Fig. 17). Water column nutrients provide a snapshot of nutrient conditions while nitrogen tissue content in *Turbinaria* yields a timeintegrated proxy of nitrogen availability during a time when nutrient enrichment from anthropogenic sources is likely to be high due to increased rates of surface water runoff and submarine groundwater discharge (Adam et al. 2021). In addition, given that ocean temperatures are at their peak during the rainy season, corals are most likely to be experiencing thermal stress and associated bleaching at this time, allowing us to link spatial patterns of nutrient enrichment with patterns of coral bleaching and associated mortality. The local-scale fishery in Moorea heavily targets the lagoons (Rassweiler et al. 2020). We will quantify spatial patterns of fishing intensity using data from our detailed surveys of fishing and fish consumption conducted around Moorea in 2018-2022, including focal fisher observations, market surveys, household surveys and socioeconomic data from the territorial census (Rassweiler et al. 2020, 2021, Nassiri et al. 2021, Holbrook et al. 2022).

<u>Question 2.2:</u> How do patterns of acute temperature stress during a marine heat wave interact with anthropogenic stressors to determine the overall vulnerability landscape to climate-driven disturbances?

**Rationale:** Chronic anthropogenic stressors such as nutrient pollution and fishing can exacerbate the impacts of climate-driven disturbances by impacting both the short-term responses of corals and longer-

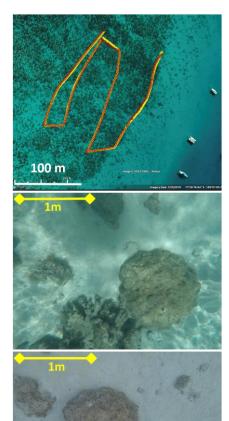


Figure 18. Our autonomous surface vehicle (ASV) can conduct photographic surveys of lagoon habitats at 1,800 m per hour. We have programmed it to repeat prior surveys (Top); black dots indicate locations surveyed by a diver in 2020, the yellow line traces the ASV repeating the same 700 m path. Bottom photos show images of the same coral bommie in 2020 (Middle) and 2021 (Bottom).

term responses of the benthic community. While the importance of these stressors has been demonstrated by our small-scale studies (e.g., Holbrook et al. 2016, Zaneveld et al. 2016, Schmitt et al. 2019, Burkepile et al. 2020), there is considerable controversy about their relative importance at the reef scale (Bruno et al. 2019) and even less clarity about their combined effects. Moorea's lagoons offer an opportunity to disentangle these effects, as stressors are differentially correlated across space (Holbrook et al. 2022), resulting in a variety of stressor combinations. By following outcomes of individual corals and benthic communities at sites with different stressor combinations, we can assess their relative importance.

**Approach:** Using the data collected for Question 2.1, we will create a 'vulnerability map' identifying locations exposed to high levels of nutrient pollution, fishing, and thermal stress both individually and in combination. We will assess the effect of these stress combinations on outcomes for individual corals (bleaching and death) and on the occurrence of transitions between benthic community states (particularly transitions in and out of macroalgae dominance). We will measure these responses in two ways. *First*, our autonomous surface vehicles (ASVs) will conduct annual surveys of benthic communities at 30 locations chosen to span a range of combinations of vulnerability. At each site, an ASV will survey a 200 m x 100 m area, driving exactly the same grid pattern each year, and taking photographs of the reef below it (Fig. 18). Recently developed computer vision approaches will enable us to quantify organisms and substrates from these large numbers of images (Miller et al. In review), revealing community state transitions as well as changes in the prevalence of bleached and dead corals. By covering exactly the same grid each year, the surveys will allow us to follow the individual fates (bleached and/or dead) of a large number of corals that can be identified in the images and test how the probability of each outcome depends on the combinations of stressors present. Second. surveys of corals. benthic communities, and water column microbiomes will be done at our 200 lagoon sites (Fig. 17) that we currently sample for nitrogen enrichment and coral bleaching annually at the end of the warm rainy season. These surveys are spatially extensive and involve rapid assessment of ecological state and rates of bleaching over a broad range of contexts. Using data from these sites that exist across a range of nutrient enrichment, temperature stress, fishing

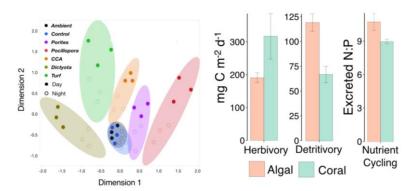
intensities, reef microbiome structure/function, as well as benthic community state, we will test predictions about how specific chronic anthropogenic stressors interact with variation in temperature during a MHW to shape coral bleaching responses and any subsequent change in the benthic community.

Question 2.3: What are the relationships between benthic community states and ecosystem processes?

**Rationale:** In Question 2.2, we will identify areas of the lagoon that exist in different community states functionally dominated by coral vs. macroalgae (Fig. 4). Here, we will examine the consequences of these states on key ecosystem processes as mediated by benthic communities, microbes, fishes, and environmental context. Primary production and calcification rates are influenced by whether reefs have

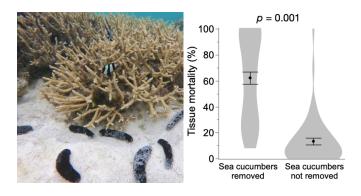
abundant corals or algae. Corals and algae are both significant sources of dissolved organic matter (DOM) but each produces different types and concentrations of dissolved organic matter (Fig. 19; Wegley Kelly et al. 2022). This differential DOM production has different effects on pelagic microbial communities and microbially-driven ecosystem processes (Haas et al. 2013, Nelson et al. 2013). Further, fishes process organic matter and recycle inorganic nutrients in different ways on coral- vs. macroalgae-dominated reefs (higher herbivory and ratio of N:P recycling but lower detritivory on coral-dominated reefs) due to fundamental shifts in the fish community with transition to macroalgal dominance (Fig. 19; Munsterman et al. 2021). We will assess how organisms from microbes to corals to fishes impact the dynamics of DOM, recycling of inorganic nutrients, and rates of primary production and calcification.

**Approach:** We will address how state shifts influence ecosystem processes using three approaches. First, we will focus on patterns in benthic metabolism as influenced by benthic state (coral or macroalgae). The goal is to obtain estimates from a much larger number of sites than we do currently, potentially allowing us to examine time series of ecosystem processes before, during, and after benthic state shifts as some of these locations transition between states. We have a time series of net ecosystem production (NEP), respiration (R), and net



**Figure 19.** (Left) Ordination of dissolved organic matter (DOM) molecules released from different benthic primary producers. Notice separation among taxa in the suite of DOM released as well as differences between corals (*Porites*, *Pocillopora*) and algae (*Dictyota*, turf, CCA) (From Wegley Kelly et al. 2022). (Right) Rates of herbivory, detritivory, and ratio of N:P in fish excretion on reefs in either coral or algaedominated state (From Munsterman et al. 2021).

ecosystem calcification (NEC) at two sites (LTER 1, LTER 2) on the north shore. Additional data include *in situ* measurements of light (PAR) and water flow, the two primary physical drivers of coral reef metabolism, as well as benthic community structure, allowing changes in benthic metabolism to be related to changes in community structure. We will continue to build these relationships along several



**Figure 20.** (**Left**) Sea cucumbers aggregated around a stand of the staghorn coral (*Acropora pulchra*). (**Right**) Violin plot of data on coral tissue mortality showing increased mortality in areas where sea cucumbers have been removed vs. those where sea cucumbers were left in place.

cross-reef transects at the 3 instrumented locations in the lagoon around Moorea (LTER 1, LTER 4, LTER 5). Three transects will be chosen at each location that vary in community structure and spatial complexity (coral, sand, pavement, macroalgae), and reef metabolism will be measured using established MCR methods. Community structure will be quantified from benthic photographs taken along the transects using our ASVs (described above). The main product from this campaign will be a set of algorithms that relate physical drivers to reef metabolism (NEP and NEC) for communities that vary in relative abundance of benthic components. These algorithms will allow

for estimates of reef metabolism across our 30 ASV sites on the north shore from combining data of benthic community structure from the ASV surveys with data on physical variables (light from *in situ* measurements and flow from our circulation model of the north shore lagoon). To augment the NEP and NEC data across a broader spatial scale and to test the efficacy of these models, we will sample total alkalinity (TA) and dissolved inorganic carbon (DIC) at all 30 ASV sites in concert with the water column sampling described next. This will allow rapid replication of ecosystem metabolism measurement and can be used as a proxy for NEP and NEC rates (Cyronak et al. 2018, Silbiger et al. 2020).

Second, we will explore the relationships between benthic state, dissolved organic matter (DOM) production, and microbially-driven ecosystem processes. At each of our 30 ASV sites, we will measure multiple components of DOM (DOC, DON, DOP, fDOM; e.g., Wegley Kelly et al. 2022) and inorganic nutrients (nitrate, ammonium, phosphate) from the water (1 m above the bottom) as well as examine water-column bacterial communities to assess how organic and inorganic nutrients are cycled differently across benthic state. To link organic matter and nutrient cycling to bacterial communities, we will assess both community structure (using 16S amplicons) and physiological function (using metagenomics) of the bacterial communities in the water column to examine how benthic state shifts relate to the functions of pelagic microbial communities. Third, the impact of mobile animals on ecosystem processes (herbivory, detritivory, nutrient cycling) will be quantified by combining data on fish community structure with models estimating ecosystem process rates of fishes (as described in Question 1.3). In addition, we have shown that sea cucumbers are important detritivores that help maintain healthy corals in the lagoon by altering microbial communities in reef-associated sediments (Fig. 20; Grayson et al. 2022). We will test how benthic state correlates with the abundance of sea cucumbers and use experiments to assess how sea cucumbers alter the dynamics of particulate organic matter and sediment microbial communities (using 16S sequencing).

# Theme 2 Modeling and Integration: Predicting ecological change and resilience across the lagoon

Theme 2 explores the spatial distribution of multiple stressors within Moorea's lagoons and the consequences for the benthic community and associated ecosystem function. A particular concern is that these stressors are eroding reef resilience, and enabling large-scale shifts from coral- to macroalgae-dominated states. Both theory and small-scale field experiments have demonstrated that strong positive feedbacks can reinforce and stabilize either ecological state in Moorea's lagoons (Buenau et al. 2007, Davis 2018, Briggs et al. 2018, Schmitt et al. 2019, 2021), raising the fear that shifts to macroalgae might be difficult to reverse. However, feedbacks that generate alternative ecosystem states at small scales often result in more complex self-organizing patterns on spatially extended landscapes (Gandhi et al. 1998, Rietkerk et al. 2021). Thus, ecological responses to stress and disturbance at the landscape scale may differ from those suggested by prior theory and experiments. Outcomes at the landscape scale depend on the strength of spatial feedbacks and the scales over which they occur (Rassweiler et al. 2021).

In Year 1, we will form a **Lagoon Resilience Working Group** that will meet in Santa Barbara after our annual All Investigator meeting and regularly throughout the year. It will develop a suite of spatially explicit models focused on understanding how the mechanistic feedbacks documented in small scale experiments will operate over spatial scales of 10<sup>3</sup>-10<sup>6</sup> m<sup>2</sup>. The models will explore several key questions: (1) As stressors alter the competitive balance between coral and macroalgae, how do the abruptness and reversibility of a transition from coral to macroalgal dominance differ at small vs. large spatial scales? (2) What is the role of processes such as feeding behavior of herbivorous fish in synchronizing benthic dynamics within the lagoons, and what are the consequences for spatial pattern and resilience? (3) How well do models reproduce empirical patterns of patch size and stability?

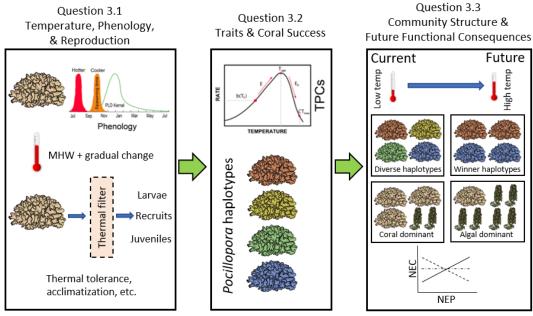
We will represent benthic and fish dynamics using complementary partial differential equation models and spatially explicit simulation models. At the local scale, these models will parallel non-spatial models developed in Theme 1; they will use similar parameters for coral and algae interactions and demographics, and will incorporate similar effects of herbivory and nutrient enrichment on the benthic community (e.g., Detmer et al. In press). At larger scales, these models will incorporate empirically-grounded spatial patterns of habitat availability, nutrients, temperature, and fishing. Habitat patterns, such

as the distribution of sand and hard substrates, will be parameterized based on georeferenced ASV surveys (Question 2.2). Spatial variation in nutrient and temperature stress will be based on data collected in Question 2.1. Spatial variation in fishing stress will be based on maps of fishing developed in a recent related project (Holbrook et al. 2022). Key spatial dynamics will be included, such as fishing behavior that redistributes effort across the lagoon (Rassweiler et al. 2021) and herbivore movement and behavior (based on the literature, e.g., Davis et al. 2017). These models will reveal how local dynamics scale up to spatially extended landscapes, and will predict how the spatial configuration of habitat and stressors will translate into spatial patterns of ecological state. They will extend the value of data collected in Theme 2 and complement the modeling proposed in Theme 1.

# Theme 3: How do disturbances generate information legacies in corals and coral reef communities that influence their resilience under current and future environmental conditions?

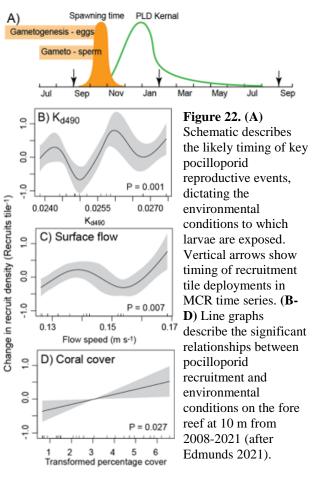
**Question 3.1:** How will rising ocean temperature and MHWs affect the phenology of coral reproduction and the thermal tolerance of coral recruitment to modulate coral community dynamics?

Rationale: One important information legacy of climate change and its impact on disturbance regimes is the alteration of temporal patterns of reproduction and recruitment in foundation species (Smith et al. 2012, Ernakovich et al. 2014, Giuliani et al. 2014, Ward et al. 2018, Piao et al. 2019). Pocilloporid corals are foundation species on the reefs of Moorea, where their populations have rapidly recovered after recent disturbances (Holbrook et al. 2018). Our work in MCR III has shown that high rates of *Pocillopora* recruitment from sexually produced larvae are vital to this recovery (Edmunds 2018, Holbrook et al. 2018, Kayal et al. 2018). Detecting this trend was possible because of our 16-year time series of coral recruitment. Yet, we know surprisingly little about the dynamics of reproduction, dispersal, or recruitment in *Pocillopora*, or how rising ocean temperature and periodic MHWs could change the timing and success of coral reproduction, recruitment, and, ultimately, coral resilience. Our data suggest that environmental conditions could operate through multiple pathways to influence reproductive resilience (e.g., effects of



**Figure 21.** Conceptual diagram outlining the major questions in **Theme 3**. Because *Pocillopora* is the dominant foundation taxon under current conditions, we will test how rising ocean temperature and marine heat waves affect reproduction and recruitment (**Q3.1**) thus mediating the abundances of *Pocillopora* haplotypes that likely have functional differences (**Q3.2**) and then explore the ecosystem consequences of changing community composition under current and future conditions (**Q3.3**).

temperature on gametogenesis, larval dispersal, and post-settlement success) (Fig. 22; Edmunds 2021). Climate change (i.e., rising ocean temperature) will likely affect reproduction and recruitment of *Pocillopora* by modifying the chronology of key reproductive events (Shlesinger and Loya 2019) as well as lowering fecundity (Johnston et al. 2020, Leinbach et al. 2021). These effects constitute an information legacy that could significantly impact the replenishment of coral populations following disturbances.



**Approach:** To better understand how rising seawater temperature mediates pocilloporid recruitment, and hence coral community resilience on the fore reef of Moorea, we will first begin a sampling program to describe the chronology of reproduction and recruitment in *Pocillopora*. Rising temperatures and MHWs alter the timing and extent of gametogenesis in many marine animals (Poloczanska et al. 2013) including corals (Shlesinger and Lova 2019, Leinbach et al. 2021). Given that spawning in Pocillopora corals in Moorea occurs around Oct/Nov (Edmunds 2021), monthly sampling of Pocillopora branches surrounding this time every year will be used to detect developing gametes through histological analyses (as in Johnston et al. 2020). Sampling for this purpose was recently initiated for *Pocillopora*, and has been expanded to select *Acropora* that appear to be increasing in abundance. In MCR IV, our use of settlement tiles (as in Edmunds 2021) will be expanded to enhance our understanding of where and when coral larvae settle. One key effort will be to build upon our time series to understand how gradually rising temperature and MHWs impact the timing and extent of coral recruitment. To develop more accurate estimates (i.e., with monthly resolution) of the timing of

recruitment, which is information necessary to test for the response of this vital rate to seasonally varying conditions, tiles will be deployed at monthly intervals at multiple sites between November and March, the period of peak coral recruitment (Edmunds 2021). Further, to evaluate spatial variation in recruitment in the back reef with respect to the water circulation cells that cross the reef (Hench et al. 2008, Leichter et al. 2013), settlement tiles will be deployed in a 24-month sampling program both along the margins of the circulation cells (perpendicular to the reef crest) and parallel to the crest, and they will be sampled every 6 months. These data will be critical for understanding how future changes in ocean conditions (e.g., rising sea levels, changing lagoon circulation) may impact the spatial and temporal dynamics of coral recruitment.

Second, we will use replicate outdoor flumes  $(5.0 \text{ m} \times 0.5 \text{ m})$  (Edmunds et al. 2020) to test the effects of high temperature on the information legacies created through the reproduction of broadcast spawning *Pocillopora* and *Acropora*. During months-long experiments we will measure the timing of reproduction (gametogenesis and spawning) as a function of seawater temperature (ambient vs. ambient  $+1^{\circ}$ C vs. ambient  $+2^{\circ}$ C), to test the hypothesis that high temperature temporally advances gametogenesis and spawning (Shlesinger and Loya 2019). Specifically, we predict that high temperature will advance the lunar day of spawning (using circular statistics sensu Fan et al. 2017) and reduce fecundity (Johnston et al. 2020). Changes in timing of spawning are important because they can create mismatches between

larval availability and the environmental conditions such as seasonal variation in waves and currents that are required for their dispersal and settlement. These effects can help explain why *Pocillopora* recruitment varies among years (Edmunds 2021), and provide an empirical context for modeling the interactive effects of seawater flow on coral recruitment (see Theme 3 Modeling and Integration).

**Question 3.2:** What are the traits mediating the success of coral species and their genetic variants?

Rationale: One of the important information legacies of disturbances arises through the differential performance of species that ultimately influence community structure and ecosystem function (Poloczanska et al. 2013). For example, our time series has revealed 'winners' and 'losers' in response to the recent MHW that caused bleaching in Moorea, with some cryptic Pocillopora species surviving better than others (Fig. 3; Burgess et al. 2021). Our time series suggests several Acropora species may also be increasing in abundance after this event. Here, we will explore the mechanisms that create these information legacies by testing for the traits (e.g., growth, respiration, microbiomes) characterizing winners and losers in response to changing seawater temperature. Further, given that our work has shown that the thermal biology of corals can vary depending on the nutrient regime to which they are exposed (Burkepile et al. 2020, Becker et al. 2021), we will examine how nutrients impact the information legacies that MHWs create. These experiments will help reveal mechanisms behind the island-wide relationships between nutrients, coral bleaching, and state shifts that we are addressing in Theme 2. Finally, a key question regarding the information legacies created by MHWs is how these effects may 'prime' corals to respond in beneficial ways to further climate change effects including ocean acidification (OA). To explore these effects, we will take advantage of our experience addressing the effects of OA on coral performance (e.g., Comeau et al. 2014) to test if the current impact of climate change (e.g., MHWs) creates information legacies with negative implications for responding to future conditions.

In Question 3.2, we will address the information legacies that occur at the organismal scale (i.e., changes to individual performance) in response to elevated temperatures. However, some of the information legacies are expressed at the genetic level, which MCR researchers are addressing using other sources of funding (see Related Research). Using *Pocillopora* as a model system, we have started to characterize the sensitivity of different life stages to environmental conditions and to describe the mechanisms by which cross-generational (genetic and non-genetic) effects can be mediated. Combined, the research on the information legacies that occur across levels of biological organization will present a powerful picture of how rising ocean temperature and MHWs are altering coral dynamics.

**Approach:** We will use our mesocosms consisting of twelve 150 L tanks to control environmental conditions (e.g., light, temperature, pH, nutrients) for weeks to months. This system will be used in factorial experimental designs to test for main and interactive effects of environmental conditions on coral performance, particularly as they might differ between species, host genetic variations, and corals differing in informational legacies (i.e., dissimilar histories of exposure to environmental conditions). We will address thermal effects administered both as: (1) a gradient of exposure using supporting tests of variation in thermal performance as captured through thermal performance curves (TPCs) (Silbiger et al. 2019) and described using the Arrhenius function (Brown et al. 2004), and (2) as a pulse disturbance (i.e., a MHW). TPCs will be prepared both through acute sequential thermal trials (e.g., 1–2 h at each temperature) to generate robust relative metrics of thermal performance (Silbiger et al. 2019), and through acclimated responses (e.g., ~2 weeks at each temperature) to test for absolute responses to thermal treatments. The experiments will compare cryptic species within the *Pocillopora* complex and several common Acropora (e.g., A. retusa, A. hyacinthus, A. cerealis), which showed variable responses to the 2019 MHW, and expose them to temperatures representing the decadal empirical range (including during the recent MHW). To test for variation in thermal performance among taxa, we will statistically extract key parameters from TPCs based on performance metrics characterizing the host (respiration, calcification), the algal symbionts (photosynthesis, symbiont densities), and the holobiont (growth) (Silbiger et al. 2019, Becker et al. 2021). Another key metric of coral response to thermal effects is in the microbiome, which our work shows often changes dramatically after thermal stress such as MHWs

(Maher et al. 2020), and can play a key role in determining the response to thermal stress (Torda et al. 2017). Thus, we will use 16S sequencing to examine how the microbiomes of different coral species respond to MHWs and test for associations with coral performance (e.g., growth). We will expand the mesocosm analysis of thermal effects to test for interactive effects with nutrient regimes for *Pocillopora* and *Acropora* as occurs during exposure to nutrient pollution that we will document in Question 2.2.

In MCR III, we showed that future OA conditions have significant, but variable, impacts on the physiological performance of different coral species (Comeau et al. 2014). In MCR IV, we will assess how cryptic species of *Pocillopora* respond to OA conditions and contrast this performance under OA conditions to their performance under MWHs as described above. This scenario of experiments will allow us to determine which taxa may be winners and losers under current and future impacts of climate change.

<u>Question 3.3:</u> How do information legacies of disturbances on benthic community structure impact ecosystem function and their capability to withstand additional MHWs?

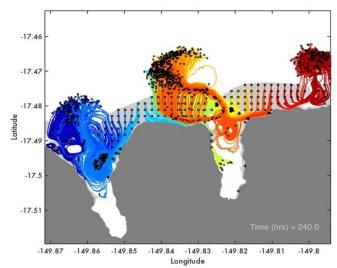
Rationale: Here, we will address how information legacies that MHWs generate on communities translate into functional consequences for ecosystem processes. We will focus on two information legacies of MHWs that are a focus of both Theme 2 and Theme 3 and test how they affect ecosystem metabolism before, during, and after a controlled MHW. The first legacy we will examine is when a MHW causes mass coral bleaching and mortality and acts as the trigger for a state shift from coral- to macroalgae-dominated communities. We will experimentally examine the impact of this state shift on ecosystem function as a complement to our descriptive approach in Theme 2 (Question 2.3). The second information legacy we will examine is when a MHW differentially impacts the cryptic species of *Pocillopora* and shifts coral community structure by selecting for a subset of cryptic species as 'winners' (e.g., Burgess et al. 2021). For both of these, we will examine impacts on net ecosystem calcification (NEC) and production (NEP), which are community metabolic rates assessing ecosystem functioning. Because NEC and NEP can be measured instantaneously, they can be used as early warning signs for how quickly reefs may respond to and recover from a disturbance. By following benthic communities composed of different taxa through a simulated MHW, we will advance our understanding of how reef ecosystem metabolism has changed in the past and will change in the future as a result of thermal stress.

Approach: Using replicate outdoor flumes (5.0 × 0.5 m), we will create ecologically relevant flow and temperature conditions that mimic those from our physical oceanographic time series (Carpenter et al. 2018). For Experiment 1, testing coral- vs. algae-dominated communities, we will create benthic communities that are representative of coral- or algae-dominated reefs that we identify in Question 2.2. The flumes will have benthic communities composed of amounts of coral, macroalgae, turf algae, bare substrate, and sand to create coral- or algae-dominated treatments. For Experiment 2, testing for the effects of different cryptic *Pocillopora* species, we will create benthic communities representing *Pocillopora*-dominated communities with contrasting relative abundances of different cryptic species identified as either 'winners' or 'losers' from the experiments in Question 3.2. These experiments will each run for 3 months during the Austral summer - the time in which MHWs typically occur in Moorea. We will measure NEP and NEC (e.g., Doo et al. 2019, Silbiger et al. 2018) multiple times including before, during, and after the simulated MHW. Additionally, we will assess how the different treatments in the two experiments impact the cycling of organic matter by sampling the different components of DOM (e.g., Wegley Kelly et al. 2022), as we did in Question 2.3, multiple times throughout the experiment.

<u>Theme 3 Modeling and Integration:</u> *Effect of information legacies on dispersal, retention and connectivity* 

Theme 3 explores how information legacies from MHWs influence population dynamics, community structure, and ecosystem processes. An important concern is how these patterns may change as climate change continues to alter ocean temperatures and, eventually, physical processes such as lagoon circulation that will affect larval transport and coral community dynamics. Marine organisms take advantage of persistent oceanographic features to maximize larval retention close to natal habitat (Black

et al. 1991, Sponaugle et al. 2002), through timed spawning during seasonal doldrums (Paris et al. 2005, van Woesik 2009) or through vertical larval movements that exploit stratified flow (Paris et al. 2007, North et al. 2008, Tay et al. 2011). It is unknown how rising sea surface temperatures and sea levels could influence the dispersion or retention of coral propagules in nearshore oceanographic features, and thus affect the spatial dynamics of coral reef replenishment. We will form a Connectivity Modeling Working Group to examine how information legacies and a changing physical environment due to climate change will affect the potential for connectivity among habitats. Biophysical models of coral larval dispersal (e.g., Limer et al. 2020) will be used to evaluate how information legacies of MHWs (e.g., altered spawning times or fecundities from Question 3.1) interact with physical oceanographic conditions (alongshore currents, waves, fore reef to back reef circulation cells,



**Figure 23.** Simulated Lagrangian dispersal trajectories of larval propagules on the north shore of Moorea, demonstrating the potential for retentive circulation features that could reduce dispersion away from natal habitats, and/or entrain immigrating propagules. Colors indicate spawning location, and points are propagules.

coastal jets, nearshore eddies, etc.) to modulate connectivity among habitats (Fig. 23). Hydrodynamic models with spatial extents useful for population studies (> several square km) and with grid sizes on the order of meters have only recently become more widely available and validated, and recent studies have shown that coastal areas are highly dynamic for dispersing larvae (e.g., Fujimura et al. 2014, 2017, Shanks et al. 2015).

Additionally, in Moorea sea level and wave climate determine hydrodynamic connectivity between the fore reef and the lagoon by determining the extent of reef crest overtopping (Hench et al. 2008) and, therefore the extent to which fore reef and back reef habitats remain ecologically distinct (Moritz et al. 2021). This biological and physical context provides a platform to explore how sea level rise will affect reefs in future decades, specifically by modulating cross-reef transport, boundary layers, and erosion of reef crest features that currently restrict cross reef transport. The Connectivity Modeling Working Group will convene a workshop in Year 3 to address the consequences of information legacies from MHWs and rising sea level for coral community dynamics.

# **Integration and Synthesis**

Our three research themes address different but related aspects of how the changing disturbance regime (increasing frequency of MHWs) coupled with rising ocean temperature will influence the dynamics, function, and resilience of coral reef communities. Our plan to consider our specific findings in a larger context and seek generality involves both within-site synthesis activities and cross-site comparisons.

Within-Site Synthesis Activities. First, the ongoing working groups associated with each of our three research themes will use appropriate modeling constructions, parameterized by data from our time series and process studies, to gain predictive understanding of the effects of multiple stressors and spatial heterogeneity on system dynamics and resilience. Additionally, several of the quantitative approaches will provide the capacity for scenario modeling of responses to future environmental change, targeting increasing mean ocean temperature, sea level rise, and changing ocean carbonate chemistry (ocean acidification). Second, as mentioned above, we will conduct a small number of workshops focused on themes emerging from MCR IV research. Participants from outside of the MCR community will be included, specifically to cover areas of expertise not represented by MCR investigators. Third, we will

convene an additional workshop to use MCR data and findings to address a broad, understudied issue: how to anticipate abrupt regime shifts triggered by a large stochastic (disturbance) event. Much of the early warning literature focuses on regime shifts that are triggered when a critical threshold (tipping point) in an underlying parameter is crossed (Scheffer et al. 2012). However, these types of early warning indicators have less utility for ecosystems subjected to large, punctuated disturbances such as heat waves, droughts, cyclones, or fires, suggesting different metrics may be needed to predict the likelihood of state shifts in disturbance-driven ecosystems. A more useful 'warning' metric for ecosystems with multiple attractors that are subjected to extreme disturbance events may be whether the system is approaching (or in) a region of state space that has more than a single basin of attraction.

Cross-Site Synthesis Activities. In the past, we have used funding by the MCR, LTER Network, national agencies (e.g., NSF and USGS), and international partners (e.g., Okinawa Institute of Science and Technology (OIST), ETH Zurich) to expand the temporal and spatial scale of our synthesis work. We will continue with this model in MCR IV and propose three types of efforts. First, we will network with other LTER sites to identify common interests in disturbance legacies, spatial resilience, and indicators of multiple attractors for possible topics for workshops at annual Science Council meetings, LNO-sponsored working groups, and symposia at LTER All Scientist Meetings. Second, we will pursue opportunities outside of the LTER community through the USGS Powell Center (that supported our synthesis focused on Coral Reef Oases in 2016) to address the ecosystem effects of structure-forming foundational taxa (e.g., trees, giant kelp, branching corals) in marine and terrestrial systems exposed to shifting disturbance regimes. This effort will integrate NSF and USGS researchers and address emergent properties with common functional origins in terrestrial and marine LTER sites (e.g., HFR, MCR, SBC). Third, we are developing plans for a joint US-Japan-Asia workshop focused on hydrodynamic larval connectivity among Pacific Rim islands. Planned workshop products include: (1) peer-reviewed publications addressing range expansion and connectivity of pocilloporid corals (the corals key to ecological resilience of the reefs of Moorea), (2) planning of field experiments to explore resilience of coral communities that can be conducted using the same methodological approaches at multiple locations throughout the Pacific Rim, and (3) catalyzing the submission of NSF AccelNET or RCN proposals to integrate regional-scale networks addressing coral reef science in human-coupled ecosystems.

### **Collaborative Research**

MCR investigators and collaborators are leveraging the site to obtain additional funding to conduct mechanistic studies and some of the modeling efforts relevant to MCR IV science. For example, Burkepile, Vega Thurber, and Adam (OCE-2023701/2023424) are addressing how reductions in herbivory and increases in nutrients impact coral and algal dynamics on the fore reef. The project is generating data to parameterize our models of community dynamics of the fore reef under different scenarios of anthropogenic stress and disturbance in Theme 1. Nelson and Silbiger, with Co-PI Donahue (U. Hawaii), are examining the spatiotemporal biogeochemistry of submarine groundwater discharge across Moorea and its influence on coral reef ecology, from organismal physiology to ecosystem processes (OCE-1923877/1924281). This work will be a key component in describing spatial heterogeneity in the lagoon (Theme 2) as well as understanding how abiotic forcing impacts coral physiology and performance (Theme 3). Additionally, Nelson, with co-PI Wegley Kelly (Scripps), is quantifying the diel dynamics of bacterioplankton and dissolved organic matter in the lagoons (OCE-1949033) and, with additional Co-PIs Aluwihare and Dorrestein (Scripps/UCSD) is resolving the composition and microbial transformation of coral reef DOM (OCE-2023298), dovetailing with central foci of both Themes 2 and 3. Burkepile, Adam, and Co-PI Donovan (Arizona State U.) are examining how land use change on Moorea has impacted near-shore nutrient dynamics and the subsequent impacts on coral reef communities (Zegar Family Foundation). This will complement Theme 2 by helping explain the spatial heterogeneity in coral and algal communities across the lagoon and how this heterogeneity is influenced by changes in land use. In addition, Hay and Co-PI Stewart (Montana State) are exploring the role of coral biodiversity (e.g., species, genotypes, etc.) in ecosystem function, informing Themes 1 and 3

(OCE-1947522). Hay is also funded (Teasley Foundation) to study the functional role of sea cucumbers as detritivores and their impacts on coral dynamics and ecosystem processes (Theme 2).

Several other collaborative efforts will work synergistically on the Theme 3 goal of understanding how changing patterns of anthropogenic stressors create information legacies in coral communities. Edmunds and Burgess are exploring the role of cryptic species diversity within the *Pocillopora* lineage to understand the contribution of genetic and phenotypic variation to resilience (OCE-1829898/1829867). Putnam and Moeller, funded by NSF Rules of Life Epigenetics Emerging Frontiers (EF-1921465/1921356), are examining how energetic shifts in the coral symbiosis under local (e.g., nutrients) and global stressors (e.g., temperature) influence epigenetics, ecology, and evolution. Their energetic and epigenetic findings are contextualized by MCR LTER ecological and oceanographic time series. This work supports Theme 3 by including a molecular mechanistic understanding of epigenetic triggers and their role in organismal acclimatization and adaptation, which is critical to understanding ecosystem function in a changing climate. Putnam (with Laetitia Hédouin, a French collaborator at CRIOBE) has received French funding to address effects of climate change on coral reproduction, working at the interface of developmental biology, epigenetic approaches, ecology, and inheritance to enhance predictive capacity for coral reef futures. MCR modeling efforts are being supported by NSF (OCE-2123708) and Duke University grants to Hench to examine how flow interacts with topography in shallow lagoon environments that will be key in Theme 2 as well as to develop models of circulation useful for understanding connectivity, which is an important element of Themes 2 and 3. Moeller is integrating genomics, bioinformatics, and dynamic energy budget (DEB) models to create a generalizable, predictive eco-evolutionary model that links nutritional interactions, metabolic states, and subsequent epigenetic effects to eco-evolutionary outcomes in the coral-algal symbiosis, key for understanding the information legacies that impact the success of corals (EF-1921356).

#### **BROADER IMPACTS**

Broadening Participation. The MCR remains committed to maintaining an accessible and safe environment where each participant's unique identity is valued and celebrated regardless of their race, gender identity, religion, sexual orientation, socio-economic status, nationality or career stage (see our Project Management Plan for the outline of our vision for inclusion). MCR's education, training, and outreach efforts emphasize broadening participation in STEM fields and strengthening STEM literacy, particularly from marginalized groups in marine science. We will continue to promote a more inclusive and equitable experience for all individuals engaged in MCR research, outreach, and science education. We strive to bring about enduring changes that accelerate and solidify the inclusion and advancement of marginalized scientists in our program, and marine science more broadly, by engaging diverse community members both locally and internationally.

Investigators, Leadership and Staff. With respect to site leadership and staffing, progress toward our demographic representation goal is reflected in the composition of the MCR IV Executive Committee (54% female, 23% URM) and 5 MCR staff (4 females, 1 URM); DEI is a major consideration when turnover of PIs and Senior Personnel occurs. A mechanism we use to enhance diversity and maintain a stable career-stage distribution of our team, is to recruit early career scientists, particularly from URM groups, to collaborate; we bring in individuals who become engaged formally on the project as Investigators at the next renewal (see Project Management Plan). The cohort of 7 new Investigators thus recruited to MCR IV (4 females; 2 URM) represents a 30% turnover of the MCR III investigator team.

Graduate Students. To enhance diversity of our graduate community, our MCR investigators have partnered with programs designed to increase participation of URM groups. We have partnered with the UCLA Diversity Project (DP) (PI Paul Barber), which increases participation of URM students in marine biology through an integrated undergraduate research experience at the Gump Station. Prior to traveling to Moorea, DP students participate in a research seminar series given by MCR investigators and graduate students, and visit UC Santa Barbara to meet MCR scientists. In addition, MCR investigators and graduate students overlap with DP students at the Gump Station, facilitating interactions and mentoring of

DP students. As a result, several DP alumni have entered graduate programs with MCR faculty, including four PhD and one MS so far in the MCR IV cohort of students. Further, eleven institutions are involved in MCR IV, with researchers converging at the Gump Station, which provides a mechanism for recruitment as it enables students to move to another MCR institution for training. For example, CSUN is a Hispanic Serving Institution that has a MS but not a PhD program, and CSUN MS students have moved to other MCR institutions for their PhD. MCR uses a tiered mentoring structure where graduate students are mentored by post-docs and faculty and, in turn, mentor undergraduates.

Undergraduate Students. MCR will continue to actively recruit a diverse and inclusive group of REU students, building on our success in MCR III in mentoring an REU group that included URM, veterans, and self-identified members of the LGBTQ+ community. UCSB, which administers the MCR and SBC LTERs, is a Hispanic Serving Institution, and this year we initiated a new partnership with SBC and the UCSB Marine Science Institute (MSI) to address the chronic underrepresentation of UCSB Latinx students in the AAUS scientific diving community. Our past assessment of our summer REU applicants revealed that the low number of Latinx students who apply for these field research internships was due almost entirely to the financial burden of becoming an AAUS Scientific Diver (required for conducting SCUBA diving-based research at US Institutions). As a consequence, we secured private funding to support training and equipment for up to 4 financially-disadvantaged URM undergraduates annually; the first cohort of the DIVErsity in Diving Program begins AAUS dive training this year. Our mission is to engage more diverse and underserved community members who are just beginning to explore field ecology as a career option but may not have the necessary resources to do so.

MCR continues to actively participate in NSF Research Opportunity Awards (ROAs) and associated REUs to engage faculty and undergraduates from Primarily Undergraduate Institutions that have a majority of URM students. In addition to continuing our partnership with Cabrillo College (student body 52% UMR), in MCR IV we will explore ROA/REU opportunities with Santa Barbara City College (61% URM), a local 2-year institution that has an agreement with UCSB for junior-level transfer students who seek a Bachelor's degree, and Santa Monica College (54% URM) that has close ties with CSUN.

**Public Outreach and Schoolyard.** The MCR website is a primary source of public information and resources. We will augment our online collection of inquiry-based curricula (see below) and our Online Encyclopedia of Marine Life website, which highlights >125 reef organisms. Our online content describing MCR graduate research continues to grow as students provide media (videos, pictures) and 'plain language' descriptions of their research, which is a grass-roots effort led by the students.

Local K-12 Outreach & Education. The MCR Schoolyard Program includes a long-running partnership with the K-6 Washington STEM Magnet School in Pasadena, California (student body 93% URM, 90% low income). Each year, 120 5th grade students are brought to UCSB, situated directly on the ocean, and engage in a day of educational talks by MCR graduate students, exploring marine life in touch tanks and coral reef displays, and conducting active learning exercises with MCR scientists. The field trip is preceded and followed by classroom lesson plans on coral reef science developed jointly by MCR Education staff, STEM teachers from Washington STEM Magnet School and Research Experience for Teachers (RET) participants; the initial lessons were tested and refined based on internal assessments by STEM teachers, and Washington Magnet School considers the field trip and lesson plan module to be highly effective. A former RET recipient continues to collaborate with the MCR Education and Outreach staff to translate MCR research and RET experiences to the classroom. This has resulted in a series of science lesson plans for six different K-12 grades that are compliant with Next Generation Science Standards and California Common Core State Standards. In 2022, the MCR will submit to the LTER Educational Digital Library a 10-lesson plan module targeted at students in Grade 3 that features three MCR female PhD researchers to highlight marine ecology research by diverse women scientists. MCR targets diverse representation among the K-12 teachers who participate in MCR field research and who teach at schools with low income, high minority student populations [Pasadena Unified School District (77% URM), Los Angeles Unified School District (88%) and Goleta Union School District (64%)].

MCR continues to partner with UCSB's Research Experience & Education Facility (REEF) to expose

> 10,000 K-12 students/y (pre-Covid19) to MCR science and the living fishes and invertebrates found on reefs of Moorea. The REEF draws K-12 class visits mainly from the Goleta, Santa Barbara and Carpinteria school districts, whose student bodies are primarily from URM groups. MCR graduate students run a booth at the annual Santa Barbara Earth Day and World Ocean Day with bilingual (English - Spanish) educational materials to raise awareness about MCR research and the ocean.

Tahitian K-12 Outreach & Education. In Moorea, we work with local partners to enhance science literacy of Tahitian school children through experiential learning. The MCR partners with the Tahitian educational NGO Te Pu 'Atiti'a to incorporate MCR science into local classrooms, and MCR graduate students run a Marine Biology Research Camp at the Gump Station each summer, which engages Tahitian grade school students in hands-on science exercises using MCR research findings relevant to daily lives of local citizens. During MCR III, a graduate student-led effort with teachers at a middle school led to the establishment of a program where students monitor the health of the stream and coral reef adjacent to their school. During MCR IV, MCR scientists will be involved in expanding these existing school-led watershed monitoring programs in collaboration with Ati Vai, a citizen science organization based at Te Pu 'Atiti'a, and the Teavaro primary school. MCR graduate students and local educators will take K-12 students into local watersheds to collect water samples, make site observations, and discuss ridge-to-reef connections from both scientific and traditional knowledge perspectives. Expansion of this program during MCR IV will involve new schools, and MCR personnel will help develop standardized curricula, and provide materials and assistance with data analysis. The MCR also aims to incorporate the water chemistry data and student-collected metadata and analysis as an MCR database.

Media–based Outreach to Pacific Islanders. In MCR II and III, we partnered with the TV series Voice of the Sea, which is associated with the University of Hawaii, to produce 13 episodes that highlight MCR research and researchers. Voice of the Sea is in its 9th season, and the 30-min episodes they produce air in Hawaii, American Samoa, Guam, Palau, the Federated States of Micronesia, and the Marshall Islands. In MCR IV, narration of existing MCR episodes will be translated into French and Tahitian for local dissemination, and we plan to develop new episodes (with Hawaiian, French and Tahitian translations) that highlight recent MCR findings and early career scientists. Additionally, in collaboration with Te Pu 'Atiti'a, the Teavaro Primary School, and a group of US-based filmmakers and animators, MCR graduate students have begun developing a series of 2-3 minute videos explaining cornerstone coral reef ecosystem processes. The first two videos are currently in production and focus on (1) the water cycle and ridge to reef connectivity and (2) the life cycle of corals. Further videos will utilize a combination of footage shot on location in Moorea and animation to illuminate more complex processes related to each subject. Audio and subtitles will be recorded in English, French, and Tahitian, and videos will be hosted on the MCR website and broadly available to both US and Polynesian partner schools.

Application of Findings to Policy & Management. The MCR annually reports its scientific findings to the Head of Research of the Territorial Government of French Polynesia, who in turn briefs relevant ministers of the Territorial Government (e.g., Minister of the Environment) and the High Commission of France. MCR findings were included in a recent process that resulted in a major revision of the Maritime Space Management Plan (PGEM) for Moorea, which was ratified in 2021. One modification was to expand shared governance via a PGEM committee composed of all relevant stakeholders. We plan to report MCR IV findings regularly to the PGEM Committee to assist in developing policy and management decisions intended to sustain the health and multiple uses of Moorea's reefs. In addition, we will continue our relationship with local fisher associations to engage citizen scientists on development of potential means to control macroalgae and quantify ecological effects of rotational closures of protected reef areas they plan to implement. We also are developing information exchanges with scientists associated with the Moorea Coral Gardeners, an NGO that seeks to restore degraded reefs.

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## SUPPLEMENT 2. DATA MANAGEMENT PLAN

Introduction. The MCR LTER Information Management System (IMS) is designed to serve both site needs and LTER Network goals. Information Management should not only facilitate the archival cataloging of data for long term preservation, but also enable the discovery of data and enhance its suitability and usability for synthesis. To achieve these goals, the MCR IMS subscribes to the FAIR Data Principles which stress that MCR site data should be Findable, Accessible, Interoperable and Reusable. MCR IM staff members are involved at all stages in the data pipeline from advising MCR faculty, postdocs, and graduate students on effective methods of data input, storage and back-up, to the generation of accurate and complete metadata in accordance with established standards, the secure archiving of data, and the continued development of software and web-based tools to enhance capabilities for data acquisition, exploration, sharing, and synthesis. The LTER Network's capabilities supported by the Environmental Data Initiative (EDI) continue to grow, maintaining the lead in ecological data curation, publishing, and synthesis. MCR will draw upon and contribute to these benefits and advances from the broader community's increasing interest in data sharing and citation.

The MCR IMS. The MCR has chosen cross platform internet standards designed for the LTER Network exchange specification to simplify our data presentation and delivery and to increase awareness of LTER data-sharing practices. The MCR IMS staff closely collaborate with EDI personnel and the MCR IMS meets or exceeds all LTER Network best practice recommendations. The MCR long-term, core datasets are uploaded to the EDI repository on a regular basis, typically annually for biological census data and semi-annually for oceanographic sensor data, where they receive a citable Digital Object Identifier (DOI). Data from shorter-term censuses, process-oriented studies and student projects are uploaded to EDI on an as needed basis. We anticipate the standards for data publication in the LTER network and the larger community will continue to evolve in response to emerging technologies and information needs. We have been very active in the planning and development of the original LTER Network Information System, which is now the EDI repository and continue to be involved to ensure that the MCR IMS is well positioned to understand and meet future expectations. To prepare for this during MCR IV, we will continue to streamline the MCR IMS and converge on standard practices, particularly those that will enable us to facilitate and improve data integration with other sites in the LTER Network.

The MCR website (http://mcr.lternet.edu/) is the most publicly visible part of the IM system and provides access by MCR researchers and the public to MCR resources including datasets, site personnel, educational materials and the site bibliography that is searchable by document type, investigator name, key word, and LTER core research areas. The MCR website meets or exceeds the current Guidelines for LTER Website Design and Content. We use hierarchical navigation to provide single-click access to the data catalog, publications, and research foci. All recommended links and features are implemented. We are in the process of upgrading the MCR website including its companion educational website (mcrlter.msi.ucsb.edu/education) from Drupal 7 to Drupal 8.

Local IT Resources and Data Security. Data generated by MCR-affiliated researchers are managed in coordination with the General Research Information Technology (GRIT) group at UC Santa Barbara. GRIT provides technical support, web hosting, data management and High-Performance Computing (HPC) for several Organized Research Units, including the Marine Science Institute, the home institute for the MCR LTER. All digital data and imagery collected in the field are stored on redundant external hard drives and then uploaded from the field via the internet to GRIT servers on the UCSB campus. Paper datasheets are scanned, and digital copies stored on external hard drives before being uploaded in the field to GRIT servers. Data stored on GRIT servers are backed up in duplicate, with off-site copies stored in a separate building on the UCSB campus providing disaster recovery. With the growing use of imagery, both photo and video, in our research, we anticipate generating much larger data sets, with storage requirements increasing by a factor of 10 over previous performance periods. However, these volumes of data are well within the storage capacity already under management by GRIT. The MCR IMS is co-

located with the IMS of the Santa Barbara Coastal LTER project and closely collaborates with them, and with data curators at EDI. These close collaborations provide redundancy to cover absences and afford increased return on investment in training assistants.

Dataset Management (Data Life Cycle). Coral reef data are both expensive to collect and much sought after, which warrants considerable effort to preserve their value through data curation for maximal discoverability, accessibility, and fitness for synthesis. MCR core data encompass biotic surveys, biological and chemical samples collected in the field, data downloaded from a large variety of oceanographic sensors, e.g., ADCPs, ADVs, ADPs, wave/tide recorders, thermistors, CTDs, pH recorders, the MCR met station, etc., and imagery derived from permanent photo quadrats and downloaded/derived from remote sensing satellites. Datasets vary in update frequency, e.g., semi-annually for met station and physical oceanography, and annually for the biotic surveys. The MCR IMS utilizes a pre-defined system for the naming of files of all types and files are placed into subdirectories on the MCR internal data server based on data type or source and whether the file contains raw, processed or the final Quality Controlled (QC) version of the data. This enables the use of customizable scripts for the processing, QC, and local archiving of the data files.

Data associated with MCR Core datasets are collected, and if necessary post-processed, by MCR technicians following standardized written protocols. Abundance, size, and point contact data collected during biotic surveys by divers or snorkelers are recorded by hand in the field onto preprinted, underwater datasheets to minimize recording errors. These data then are entered into Excel spreadsheets by MCR field technicians and checked for accuracy by a second technician. Final QC is done first automatically within the database using a set of customized scripts, flagging any further QC issues requiring human inspection. Photographic imagery of coral percent cover obtained from permanently marked photo quads is analyzed to determine the percent cover of corals using a variety of software packages including CPCe (Coral Point Count with Excel extensions, https://hcas.nova.edu/tools-and-resources/cpce/index.html), and CoralNet (https://coralnet.ucsd.edu/). MCR was an original contributor to the development of CoralNet, providing thousands of coral photoquadrat images used in the initial training and testing of the software's deep neural networks. Biological and chemical samples collected by MCR field technicians in the field are returned to the laboratory at the UC Gump Research Station for processing before being analyzed on site or prepared for return to various labs in the U.S. MCR follows all French, French Polynesian and U.S. laws governing the exportation and importation of biological and chemical materials from French Polynesia into the United States including CITES. Data are downloaded from oceanographic sensors and the MCR met station in the field by MCR technicians using instrument-specific, proprietary software provided by the sensor's manufacturer, e.g., SeaBird Electronics, Teledyne RD Instruments, RBR, Campbell Scientific. Satellite imagery is downloaded from the web and then post-processed and aggregated using standardized protocols and customized scripts written primarily in R. While collection and most processing of data associated with MCR Core datasets are done by MCR technicians, oversight of data collection protocols and data QC are performed in consultation with MCR IM staff by one or more MCR PI/Co-PIs or Associate Investigators assigned to each dataset.

Data reach the MCR Information Management (IM) staff in different stages of maturity depending on their type. Physical oceanographic data are fully processed including QC in Matlab and R before submission to the IMS. A subset of our core time-series datasets, primarily those associated with biotic surveys, are further controlled by maintaining these data in a relational database where taxonomy, location and observation metadata are constrained to controlled vocabularies and value bounds. Biotic surveys require reformatting within the IMS prior to uploading to the database to ensure maximum ease of use by researchers outside of the MCR and the public. We continue to refine this process by scripting more of the quality assurance metrics and incorporating feedback from data users. While scripting takes substantial investment of time because each dataset requires knowledge of the expected characteristics and custom definition of the quality control criteria and quality assurance metrics, the return on

investment is high and immediate. Data generated by process-based observations and experiments as well as data generated by student projects are submitted to the MCR IMS as comma separated text files accompanied by a completed metadata form (word document). MCR IM staff work closely with MCR personnel to ensure that submitted metadata are complete, accurate, fully descriptive, and compliant with the latest metadata standards. These datasets are stored as csv files on the MCR data server and uploaded to EDI after metadata conversion to EML.

Each new proposed research project at MCR requires a data management plan. Investigators provide an outline of expected data products and the relationships to ongoing projects. The MCR Information Manager provides advice on naming conventions for sites and taxonomy, guidance for file organization and format, and designates space on the server to backup raw files from the field. The MCR Deputy Program Director (MCR Investigator A. Brooks), ensures that the MCR Information Manager is aware of new projects and coordinates with investigators before projects are initiated. Continued participation in core activities is contingent upon timely contribution of collected data to the MCR catalog. The Deputy Program Director is responsible for ensuring all data are added to the catalog in a timely fashion

**Metadata.** All MCR data packages are described in the most recent version of Best Practices for LTER Dataset EML. Metadata for each dataset currently are managed in a relational database (Metabase2 format) using custom management approaches. The metadata workflow includes entering and assembling metadata for each dataset, followed by export and Ecological Metadata Language (EML) generations. Field and lab methods are documented and are available in the form of protocols and as part of the metadata for each dataset. This approach has greatly reduced duplication of information and effort and has produced results that are highly FAIR.

In this proposal we are planning for a new approach in which EDI will take over metadata management and, in collaboration with the MCR Information Manager and researchers, generate EML metadata for all submitted data (Figure 1). The MCR Information Manager will be responsible for providing necessary information to EDI data curators who will then use in-house approaches to generate EML.

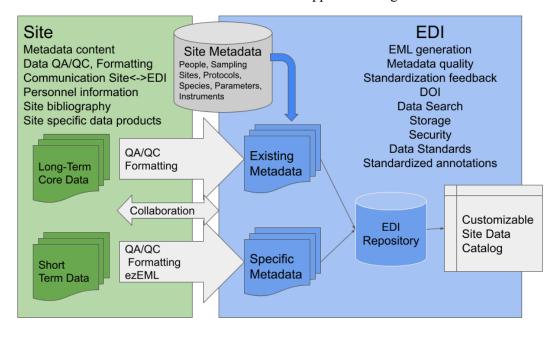


Figure 1. General division of labor for MCR-EDI data management collaboration.

The EDI data repository provides a data package quality checker which is applied at every data package upload. Many new quality rules have been implemented since its inception and MCR's metadata standard has always met these requirements. Our currently generated EML files pass the check without warnings, meaning they have a high level of completeness as defined by the community.

Data Access, Release, and Use Policies. MCR strives to make site data maximally accessible and useful within and beyond the LTER Network for synthesis, education, and other purposes. To be fully accessible, data must be discoverable. To this end, MCR data packages are thoroughly described with appropriate keywords, geo-location, taxonomy, and authorship. These metadata fields improve results from faceted searches such as from the DataONE, EDI, BCO-DMO data catalogs where MCR LTER data is aggregated with other contributors. MCR data use policy and data release policy are consistent with the LTER Network policies. Core data sets are collected and managed centrally as opposed to being collected and managed by individual PIs. Our longstanding policy is that all core data sets are publicly available as soon as possible, usually in less than one year. Non-core data that are not restricted for access also are made available publicly as soon as they have completed required QC protocols. Generally, these data are published in EDI within a few days of receipt by the MCR IMS office. We have noted an increase in urgency for this process as the publication of papers becomes dependent on data publication. Very few data sets have restricted access, and the reasons for access restrictions are almost always due to their proprietary nature (e.g., produced by another source, contain unpublished student thesis or dissertation data) or they have human subject confidentiality issues. Our data access/data use policy is the Creative Commons license CC BY 4.0 (https://creativecommons.org/licenses/by/4.0/). The user is free to use and adapt the data while giving appropriate credit without any other restrictions. In our data use policy, we make a few additional recommendations for collaboration and suggest that users contact the appropriate MCR personnel if they have any questions or concerns about the data, but these recommendations do not change the general license text.

**Staffing.** Because information management is a top priority at MCR, we are committed to supporting a strong IMS team to maintain and provide access to our diverse datasets and to seek out the best ways to facilitate research through data management and access.

Ms. Hillary Krumbholz was hired as the new MCR Information Manager in November of 2021 succeeding Ms. M. Gastil-Buhl who retired after almost 15 years as the MCR Information Manager. Ms. Gastil-Buhl continues to work with the MCR IM staff in a volunteer advisory role. Ms. Krumbholz leads all MCR IMS efforts and is the primary point of contact between MCR IM staff and EDI. She also provides graduate and undergraduate training in a variety of areas related to the MCR IMS. Dr. Li Kui performs data analysis and quality control for the physical oceanographic and meteorological data. Dr. Kui performs many of these same tasks in her role as SBC LTER Information Manager. High-level system administration is provided by Mr. Brian Emory and other members of the GRIT support staff. Dr. Andrew Brooks provides oversight and logistical support to the MCR IM staff.

## Plans for MCR IV

**Technology Upgrades.** Although we are not expecting any major changes in the general data management workflows beyond those mentioned above concerning our planned collaboration with EDI, the underlying infrastructure will always evolve, reach their end of life, or require upgrades. For example, data processing routines will have to evolve along with their respective programming languages, take advantage of newly developed third party packages, and may change entirely when new technological approaches become available. Although our current approach is very robust, transparent, and in line with general best practices, it may become apparent that a change is needed in the future. Our lightweight and modular system design will allow for such adaptations to be phased in according to staff skill sets, developing best practices, or appearance of new disruptive technology. The recent change in MCR IM

staffing and our new partnership with EDI provide an opportunity for the streamlining of current custom programming and the generation of new custom programming to increase efficiencies in data package publication. In collaboration with EDI and other colleagues, we will consider advancements in Artificial Intelligence, the continued development of Deep Machine Learning algorithms, and new Data Mining techniques which can improve data processing flow and the current manual processes of information linking for better discovery. Examples are the continuation of exploring image analysis methods for counting and measuring of organisms, particularly stony corals, and employing text mining for improved data description.

During the first half of MCR IV, we will continue our efforts to upgrade the MCR main and educational websites. While the MCR website (http://mcr.lternet.edu) currently meets or exceeds all recommendations of the LTER community, improvements will be made to modernize security, accessibility, languages, and design. We will eliminate duplication of metadata in our data catalog by using a generic community-developed catalog and EDI web services. The new website will also provide space for several custom data visualizations (see below, Support for Science). The MCR IM staff will continue work on developing a ticketing system within the GitHub platform to improve communication between MCR IM staff, allow for more efficient workflow planning, flag issues of concern, and follow data from the time of collection to dataset publication.

**Data and Metadata Upgrades.** MCR is already prepared to support the newly proposed data collection initiatives, which will result in new data types, datasets, and larger amounts of data. Data will be included as appropriate and will be documented and published as for existing MCR datasets. EML version 2.2 was recently released and now includes structures to formally annotate terms used in the metadata. This permits metadata to be enhanced with semantically well-defined concepts to improve dataset discovery and allow uniquely defined measured variables.

The collaboration between MCR and EDI represents a new model for the publication of LTER site data. As information management technologies have become more complex, the amount of knowledge required to create and maintain metadata and data objects has increased considerably. Our collaboration takes advantage of EDI's already centralized expertise in metadata tools, EML and repository interactions, while still relying on site personnel's close familiarity with the data tables themselves, and the local science. EDI will be better able to standardize certain aspects of data description (such as annotation), freeing the site personnel to focus on issues directly tied to data production, visualization, and synthesis.

**Support for Science.** Many researchers, MCR and others, are using our data. The data we provide are well known in the community. Internal EDI metrics show that over 2300 MCR data entities have been downloaded from EDI over this past year. This includes data accessed from 91 datasets with each data entity downloaded between 1 and almost 250 times. Because EDI filters most internal web traffic, these numbers can only serve as a proxy for data use. A better measure for data use is dataset citation as verified by a DOI, dataset URL or author confirmation. During the period covered by MCR III, EDI has registered 69 journal articles and 9 theses that are citing 52 MCR datasets. We expect these numbers to increase during MCR IV as new MCR Information Manager H. Krumbholz has a strong background in the field of data visualization, allowing us to present MCR data in more easily digestible formats thereby encouraging its use by other researchers around the world.

## SUPPLEMENT 3. PROJECT MANAGEMENT PLAN

Site Governance. The MCR is governed by an Executive Committee that consists of the Lead PI (Schmitt), four cover page Co-PIs [Burkepile (Lead PI designee), Carpenter, Holbrook, Edmunds], five Associate Investigators (Hench, Moeller, Putnam, Silbiger, Vega Thurber), and three ex-officio members (Deputy Director Brooks; IM Krumbholz; Director of Education & Outreach Davis). This diverse and inclusive Executive Committee has representation from the major science and programmatic elements of the site and includes Investigators across the spectrum of career stages. The Committee addresses science and budgetary priorities, advises on program policy issues, reviews progress on major program elements, identifies potential new science initiatives, and helps with communication to the broader MCR community. The cover page PIs typically make funding and personnel decisions by consensus, with the ultimate decision-making authority resting with the Lead PI. The Executive Committee develops and implements policies regarding: data access and sharing; use of MCR field infrastructure (e.g., vehicles, boats, instrumentation, mesocosm facilities); collaborative activities with groups outside the MCR; and conduct of all MCR personnel and compliance with Title IX and other guidelines. MCR policies are posted on the internal MCR website. The MCR DEI Committee (see below) develops recommendations for enhancing equity and opportunity, and undertakes assessments of MCR DEI efforts.

In addition, MCR graduate students are empowered by a self-governing association that facilitates communication with MCR Leadership on the graduate student experience in the MCR community, including DEI issues. As an example, the DEI Committee formalized and expanded a mentoring program connecting incoming graduate students to more senior graduate students in an effort to create a more welcoming and safer environment while also encouraging cross pollination among different research groups. Also throughout MCR III, one or both of the Co-Chairs of the MCR Graduate Student Association were from URM groups. A designated Co-Chair also serves on the MCR DEI Committee. Graduate students centrally contribute to the regular community building and information exchange events the MCR holds annually such as twice a year All Investigator Meetings. Graduate students self-assemble into all MCR synthesis workshops, and are encouraged to propose workshop topics.

**Project Management.** The MCR is administered by UC Santa Barbara and field operations are based at the UC Richard B. Gump South Pacific Research Station on Moorea, French Polynesia. A formal agreement between the University of California and Territorial Government of French Polynesia enables scientists from US institutions to conduct research from the Gump Station. The Station is administered by UC Berkeley and governed by a consortium of UC campuses; Lead PI Schmitt and Co-PIs Holbrook and Carpenter serve on the Gump Station Oversight Committee, which reports to the Vice President for Research and Innovation at the UC Office of the President and the Vice Chancellor for Research at UC Berkeley. Co-PI Edmunds and Deputy Director Brooks serve on the Gump Station Diving Control Board that oversees compliance with AAUS scientific diving regulations. US scientists must hold a research permit issued by the Territorial Government, and the Gump Station handles the paperwork.

The Lead PI serves as the Project Director and is responsible for the overall direction of the research and all other programmatic elements. The Lead PI is the point of contact with the NSF Program Officers, serves as a member of the LTER Science Council, and is the liaison between the MCR, the Gump Station and the UC administration. The Lead PI also is the liaison with French Polynesian entities such as the High Commission of France and the Territorial Government. In close cooperation with the four Co-PIs, the Lead PI oversees day-to-day operations of the project and implementation of all of its components. The five cover page PIs meet several times a month. Deputy Program Director Brooks is in daily contact with the PIs, assists with all aspects of project management, and is the liaison between MCR investigators and the Information Management team, various University safety committees (e.g., Diving Control Board, Small Boat Safety, Title IX), and the Gump Research Station. Brooks serves as the MCR Diving and Boating Safety Officer (DBSO) to ensure that MCR scientific diving and boating operations comply with all relevant UC, UNOLS and AAUS boating and diving regulations. In his capacity as unit safety officer, Brooks reports to the Lead Diving and Boating Safety Officer at the Office of Environmental Health and Safety at UCSB and not to the MCR Lead PI.

Information exchange within the MCR community is emphasized because individuals are located at eleven universities; considerable effort goes into maintaining open channels of communication and maximizing the input of all participants. During MCR IV, 2 All Investigator Meetings (AIMS) will be held annually - a virtual multi-day meeting in the Spring focused on research presentations by early career MCR scientists (graduate students, post-docs, junior faculty, REU, and ROA participants), and a 4 day inperson meeting in the fall at UC Santa Barbara focused on programmatic discussions, working group meetings and production of synthetic products. In-person meetings will be attended by roughly 50 investigators, postdocs, graduate students, undergraduates, ROA and RET participants and collaborators. We also will hold annual IM Training sessions led by the MCR IM and/or EDI, as well as an annual distributed graduate seminar series on relevant topics of interest to the MCR graduate student community. The MCR website is another tool for communication with both MCR personnel and other entities via sharing project-related information, data and documents. MCR research occurs at a distant research station in Moorea, French Polynesia, and our internal website also provides researchers with updated information regarding travel and research station logistics and scheduling, visas, permits, and requirements for SCUBA and boating certifications.

Maintaining a Culture of Access, Inclusion, Support & Safety. The MCR remains committed to maintaining an accessible and safe environment where each person feels they belong regardless of their race, gender identity, religion, sexual orientation, socio-economic status, nationality or career stage. Our Code of Conduct prohibits harassment, intimidation, intolerance and disrespect, and emphasizes respect, trust, collaboration, safety and mentorship to achieve excellence in research. MCR leadership, staff, and trainees regularly attend trainings on issues revolving around diversity, equity, and inclusion (DEI), including those specific to working and living in a remote field setting. Annual meetings of all MCR participants include discussions of DEI issues, and we plan MCR workshops to better educate our members and respond to issues that may arise. We also regularly disseminate information related to additional training and DEI-related resources such as internal university programs and LTER workshops. Investigator and MCR Executive Committee member Rebecca Vega Thurber coordinates our MCR DEI Committee which is composed of students, staff, postdoctoral researchers, and faculty and facilitated in a horizontal platform. This committee liaises with the LTER-wide DEI committee.

Recruitment and Retention of New Scientists to the Project. Active development of collaborations with scientists from US institutions has proven to be an effective means to recruit new investigators to the MCR project. The MCR provides infrastructure support to joint projects with MCR investigators, and our collaborators participate in MCR programmatic activities such as All Investigator Meetings and topicappropriate working groups, workshops and other synthesis activities. These efforts often lead to extramurally funded projects that leverage the MCR, and we embrace a Portfolio Effect approach that builds on the core research themes of the project. This has been the primary means by which the MCR adds scientists to the team of named investigators at renewal. It has enabled us to maintain a stable careerstage distribution of investigators over the life of the project; at renewals, early career scientists initially attracted as collaborators replace more senior MCR investigators who retire or move to other projects. This also provides great flexibility to address changing programmatic priorities in research and broader impacts (e.g., advancing MCR DEI objectives). The diverse and gender-balanced group of 7 new investigators formally joining MCR IV all became collaborators during MCR III, and are either Assistant Professors (Correa, Eliason, Moeller, Rassweiler, Silbiger) or early Associate Professors (Burgess, Stier). These new MCR IV investigators represent a 30% turnover of the MCR III team. Table S1 depicts the areas of involvement of each of the 24 Investigators in the MCR IV research program.

Planning for the Future. Considerable planning and preparation were done during MCR III to ensure a smooth transition in the leadership team during MCR IV. Schmitt will step down as Lead PI prior to the MCR IV mid-term review in Year 3 (2024-25) and be replaced by Co-PI Burkepile, who has considerable PI experience on NSF awards. There will be no change in the institution of the Lead PI or the administrative campus for the award (UC Santa Barbara). Throughout MCR III, Burkepile served on the

MCR Executive Committee and, prior to the MCR III mid-term review, informally joined the MCR III cover page PI team where he has participated fully in their weekly meetings, helped plan and implement MCR III programmatic activities, and served as a lead in the development of the MCR IV proposal. Throughout MCR III, he worked alongside Lead PI Schmitt to gain experience in leading the MCR enterprise, as well as in learning about the liaison functions with UC and other relevant authorities. Schmitt and Burkepile effectively will function as Co-Lead PIs until the official transition occurs. In addition to the Lead PI, two long time Co-PIs (Carpenter, CSUN; Holbrook, UCSB) will step down before or during Year 3 of the award, and following approval by NSF, each will be replaced by a named MCR IV Associate Investigator from their respective institutions.

**Integration with Non-LTER Scientists.** The MCR does not have formal agreements with any Federal agency or other non-UC entity that supports the research and outreach missions of our program. For site-based research, the MCR relies heavily on fostering interactions with scientists who do - or could - conduct research on Moorea. In addition to scientists from US institutions (see below), one avenue has been to build collaborations with scientists in French Polynesia (e.g., *Le Centre de Recherches Insulaires et Observatoire de l'Environnement de Polynésie Française* (CRIOBE), *Institut de Recherche pour le Développement* (IRD), *Université de la Polynésie Française*). The Office of the President of the

University of California is a signee of an agreement involving all French agencies that conduct coral reef research throughout the Pacific (International Research Network (GDRI) Agreement for Biodiversity of Coral Reefs). The four named UC participants in the agreement are the Lead PI Schmitt, Co-PI Holbrook, MCR Associate Investigator Bernardi and the Director of the Gump Station (N. Davies). MCR leadership also collaborates with scientists from ETH Zurich and Microsoft Corporation to develop a research and action plan for the Swiss government's Geneva Science and Diplomacy Anticipator related to socialecological sustainability.

**Table S1.** Participation of Investigators in the Time Series areas, Research Themes and Synthetic Activities of the MCR IV research program. The 7 Investigators new to MCR IV are in **bold**.

MCR Investigator	Times Series Focus (TS), Research Theme (RT) & Synthetic Activities							
	TS 1	TS 2	TS 3	RT 1	RT 2	RT 3	Modeling	Synthesis
Thomas Adam	1		<b>√</b>	1	<b>/</b>			1
Giacomo Bernardi	1			/	/			1
Cherie Briggs				1	/		/	/
Andrew Brooks	<b>/</b>	1	✓	/	<b>/</b>			<b>√</b>
Scott Burgess				/	<b>/</b>	1	/	<b>√</b>
Deron Burkepile	<b>√</b>	1	1	/	/	/		<b>√</b>
Robert Carpenter	1	1	✓	/	/	1		✓
Adrienne Correa					/	1		<b>√</b>
Peter Edmunds	<b>/</b>	1	1	/	/	1		1
Erika Eliason			✓		/	1		<b>√</b>
Mark Hay				1	/			<b>√</b>
James Hench			1	/	/	1	/	✓
Sally Holbrook	1			/	/			<b>√</b>
James Leichter			✓	/	/	1		<b>√</b>
Hunter Lenihan	<b>√</b>			1	1			<b>√</b>
Stephane Maritorena	<b>/</b>	1	1		/	1		<b>√</b>
Holly Moeller				/	/	1	/	<b>√</b>
Craig Nelson			<b>√</b>	/	/	1		<b>√</b>
Hollie Putnam					1	1		1
Andrew Rassweiler	1	1		1	1		<b>√</b>	✓
Russell Schmitt				1	1			<b>√</b>
Nyssa Silbiger		1	✓		1	1		<b>√</b>
Adrian Stier				1	1		1	✓
Rebecca Vega Thurber		1		1	1	1		1

The MCR has actively

sought collaborations with national and international partners at other coral reef sites. Our strategy is to secure funding for international workshops and collaborative research (Australia, France, Japan, Monaco, People's Republic of China, Switzerland, Taiwan, Thailand). The MCR also openly seeks collaborations with non-MCR scientists from US institutions interested in conducting social-ecological research at the Gump Station, offering assistance in their efforts to develop collaboration opportunities with our personnel and site, including providing on-site infrastructure support when feasible. We also seek collaborations with engineers interested in using the MCR site as a test bed for technology development relevant to the MCR and the wider coral reef scientific community. The MCR has incorporated several of these emergent technologies into its research (sensor networks, ARVs, cyber-enabled image analysis, photogrammetry for benthic change detection), and we will continue to be receptive to similar opportunities to serve as an environmental technology test bed.