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# Coral mass spawning predicted by rapid seasonal rise in ocean temperature

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**ABSTRACT:** Coral spawning times have been linked to multiple environmental factors; however, to what extent these factors act as generalised cues across multiple species and large spatial scales is unknown. We used a unique data set of coral spawning from 34 reefs in the Indian and Pacific Oceans to test if month of spawning and peak spawning month in assemblages of *Acropora* spp. can be predicted by sea surface temperature (SST), photosynthetically active radiation, wind speed, current speed, rainfall or sunset time. Contrary to the classic view that high mean SST initiates coral spawning, we found rapid increases in SST to be the best predictor in both cases (month of spawning:  $R^2 = 0.73$ , peak:  $R^2 = 0.62$ ). Our findings suggest that a rapid increase in SST provides the dominant proximate cue for coral mass spawning over large geographical scales. We hypothesise that coral spawning is ultimately timed to ensure optimal fertilisation success.

**KEYWORDS:** phenology, reproduction, biogeography, macroecology, *Acropora*, Indo-Pacific

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## INTRODUCTION

Understanding the distribution of species diversity across the Earth is a fundamental challenge of ecology; however, the underlying processes that generate and maintain these patterns remain unresolved. One way forward is to move beyond an overwhelming focus on adults towards a more concerted effort to understand stages earlier in an organism's life history. Adults often need different resources and environmental conditions to thrive compared with earlier life stages and, therefore, our opportunity to identify important mechanisms is limited if we explore adult requirements alone [1-3]. Moreover, such knowledge is required to solve global conservation challenges more effectively because we must ensure not only adult survival, but also successful reproduction and development, to prevent species sliding inexorably towards extinction.

Successful reproduction depends on timing. Reproductive events have evolved to occur at optimal times for the next generation to survive, often coinciding with the presence of food resources, the absence of predators, or favourable environmental conditions [4]. These conditions can be linked to seasonal changes, which might provide the proximate cue for reproduction to occur. Owing to its dependence on external conditions, phenology (defined as the interplay of life cycle events with environmental conditions) emerges as a key factor to determine species distributions [1]. Temperature is supported strongly as either a proximate cue or mechanistic driver of the timing of life history events in a wide range of species including insects [5], birds [6], fish [7] and plants [8]. However, these studies are concentrated in temperate regions and the extent to which seasonal temperature variations play a role in tropical phenology is speculated to be minimal due to more muted seasonal variations [9, 10], although this speculation remains untested.

Synchronised release of gametes for external fertilisation in the water column is common amongst marine invertebrates with a sessile adult stage [11]; presumably because fertilisation success is greatly diminished when small numbers of colonies spawn because of rapid gamete dilution in the water column [12, 13]. Mass reproductive events, where multiple species release gametes or propagules simultaneously, are hypothesised to offer additional benefits, such as predator satiation [14, 15]. Regardless of the selective advantage, disentangling the proximate cues and ultimate underlying mechanisms that control the timing of such events remains a significant challenge.

Reef-forming corals generate some of the most spectacular mass reproductive events in the world. During the annual "mass spawn", defined by Willis et al., [16] as "the synchronous release of gametes by many species of corals, in one evening between dusk and midnight" on the Great Barrier Reef [GBR; 17], up to 30 species release gametes within hours on a single reef [16] and over 130 species spawn in the week following the full moon in October or November [16, 18]. Individual colonies usually spawn only once each year on a seasonal cycle and gamete maturity is often synchronous within colonies [18]. Seasonality of spawning appears to be strong, even in the equatorial tropics where annual variation in environmental conditions is traditionally considered to be relatively stable [19].

Despite three decades of study, the proximate cues to initiate coral spawning remain controversial. A wide range of environmental factors might play a role in reproductive timing and these may act at both a proximate and an ultimate (or mechanistic) level [14, 16]. The most common hypothesis for corals states that environmental cues work at progressively finer scales to regulate: i) the month of spawning, ii) night of spawning [lunar cues, 20] and iii) the time of spawning (sunset) [21, 22]. Previous analyses of the time of year have been limited to a handful of sites [e.g., 23, 24] and species [25-27] owing to the difficulty of collecting coral reproductive data across a large geographic area.

These limitations have led to inconsistencies in our understanding of the relationship between environmental conditions and spawning times. For instance, the evidence to support temperature as a cue is ambiguous and there are indications that other environmental features could play a role [16, 23, 25, 28]. Mendes and Woodley [25] noted an interaction between spawning times, temperature and monthly mean rainfall, suggesting that coral spawning events were timed to allow gametes to avoid decreased salinity and for larvae to benefit from the subsequent nutrient pulse. Alternatively, in the western Atlantic, spawning was predicted by the rate of change of solar insolation [28]. More recently, van Woosik [24] found the length of the reproductive season and wind speed were

correlated, and suggested that spawning times had evolved to avoid high wind speeds that could reduce fertilisation success and larval survival.

It is difficult to reconcile these disparate studies that often use only a small number of environmental variables, a limited number of sites or species, or pool species with very different life history patterns. Moreover, competing hypotheses tend to be tested independently, which makes their relative importance difficult to assess. Consequently, conclusions are often based on weak statistical inference and generally applicable cues remain elusive.

Macroecological approaches, which search for generalisable explanations for ecological phenomena, offer a way to test whether hypothesised cues apply across multiple species and regions. Here, we determine the extent to which coral spawning months and peak spawning month can be predicted by environmental conditions at 34 reefs throughout the Indian and Pacific Oceans ('Indo-Pacific' throughout) for assemblages of *Acropora* – the most speciose coral genus [~150 species, 29]. Specifically, we test the predictive capability of photosynthetically available radiation (PAR), sea surface temperature (SST), rainfall, wind speed, current speed and sunset time. All of these variables have been hypothesised previously to influence the month of coral spawning (see Methods for further details).

## **METHODS**

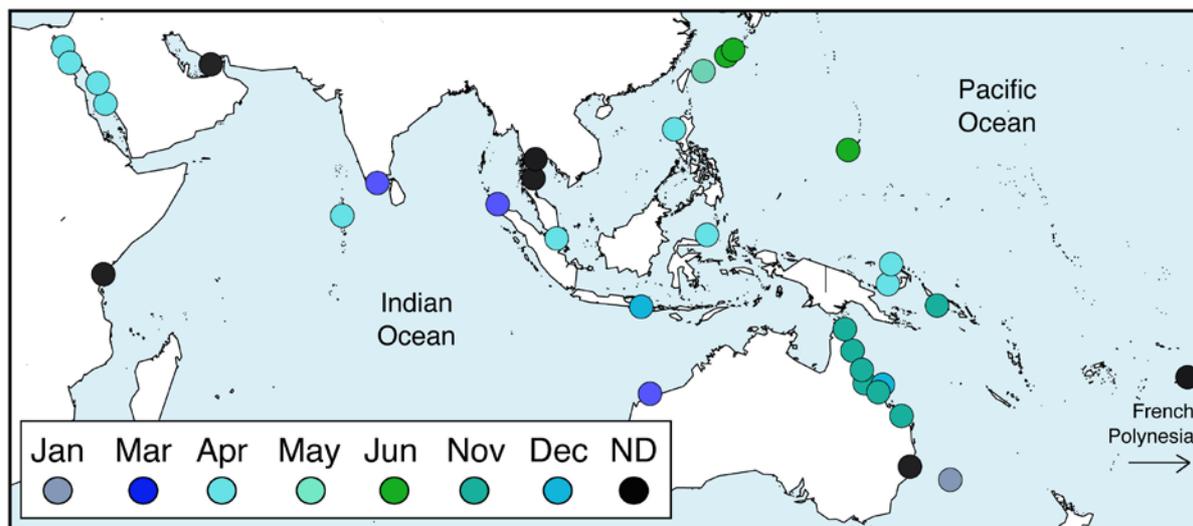
### **Data collection for timing of spawning**

The *Acropora* genus dominates coral cover and abundance in almost all shallow water habitats throughout the Indo-Pacific and plays a key functional role in coral reef ecosystems of the region. In addition, *Acropora* species have very similar reproductive biology [30], and therefore, are expected to respond similarly to environmental cues. *Acropora* species are hermaphroditic broadcast spawners that usually have a single gametogenic cycle per year and egg size on release is remarkably consistent within the genus, ranging from between 575 to 600  $\mu\text{m}$  diameter (coraltraits.org). The reproductive stages of *Acropora* colonies were determined at 34 reefs throughout the Indo-Pacific between 2000 and 2012, encompassing a total of 99 *Acropora* species. Of these reefs, 28 were sampled on sufficient occasions to be confident of the presence or absence of spawning in each month throughout the year (Fig. 1, Table S1 in Supporting Information). Peak spawning month could be reliably identified at 28 reefs (overlap of 22 reefs with season).

The reproductive condition of all *Acropora* colonies encountered during 40 min haphazard swims at each site was established by breaking small sections of coral branches (colonies generally recover in <2 weeks) to expose the developing oocytes. Three reproductive conditions were defined based on the colour of the oocytes following Baird *et al.* [30]: mature - oocytes pigmented; immature - oocytes white; empty - oocytes too small to see in the field or absent. Colonies with mature oocytes were assumed to have spawned in the calendar month they were sampled, colonies with immature oocytes were assumed to have spawned one month post-sampling [30]. These data generated a binary variable of "spawned" or "not spawned" for each species across months and reefs. We also determined a second binary variable of peak spawning, defined as the month in which the highest proportion of colonies were mature or data in a single month revealed that >50% sampled coral colonies had mature oocytes.

### **Environmental predictors**

In total, eight environmental predictors were selected for inclusion in a predictive model. The monthly mean values of five environmental variables were considered potential predictors of spawning in the *Acropora* based on the reproductive synchrony literature: SST; rainfall; wind speed; current speed and difference in sunset time (Table S2). Although monthly means often represent plant phenology poorly [9], *Acropora* corals are constrained to spawn at a certain point of the lunar phase [30], so monthly means match the resolution of coral spawning season data. To capture cumulative energy, hypothesised to be a phenological cue for a variety of taxa, we followed van Woesik *et al.* [28] and summed PAR over the 10 months prior to the target month (Table S2). We also considered the rate of change in SST and PAR between months and normalised these values within reefs by subtracting the previous month from the target month, and dividing this by the range for that reef.



**Figure 1.** Location of sampled reefs across the Indo-Pacific with month of peak spawning indicated by colour. ND = no data for peak spawning month, reef included in month of spawning model only. One reef in French Polynesia (17.56°S, 149.70°W, eastern Pacific) has been moved for plotting.

SST (°C), wind speed (10 m above surface), and rainfall rates in  $\text{mm hr}^{-1}$  were obtained from the Tropical Rainfall Measuring Mission's (TRMM) at a  $0.25^\circ$  (~25 km) spatial resolution. Monthly current speed data in  $\text{m s}^{-1}$  were downloaded from Ocean Surface Current Analyses Real-time [OSCAR; 31] at a spatial resolution of  $1^\circ$  (~100 km). PAR data ( $\text{Einsteins m}^{-2} \text{ day}^{-1}$ ) were obtained from the Moderate Resolution Imaging Spectroradiometer (MODIS) aboard NASA's Aqua satellite. We used the monthly climatology for 2003-2014 at 4 km resolution. For further detail on environmental data, see Appendix S1.

Environmental variables were normalised and centred with a mean of zero and standard deviation of one to facilitate comparison and interpretation of regression coefficients (except mean SST, which was standardised within sites). Current speed was square root transformed. Normalised variables were checked for multicollinearity using Pearson's correlations with a cut-off of  $>0.6$  or a variance inflation factor (VIF)  $>2.5$  within the initial GLM (see "Statistical analysis"), and visually inspected to rule out non-linear relationships. In the case of collinear variables, one was removed on the basis that (a) it was collinear with the highest number of other variables, or (b) it was less interpretable biologically.

### Statistical analysis

To determine the extent to which environmental variables were able to predict months of *Acropora* spp. spawning, we fitted generalised linear models (GLM) with a binomial error structure (spawned/not spawned) and logit link function. Initially, GLMs were fitted separately for each predictor variable to determine whether a linear or quadratic function best captured the relationship with spawning i.e.,  $>3 \Delta \text{BIC}$ . We generated a full GLM with the same error structure that included all environmental variables to test GLM assumptions. To ensure spawning predictors were generalisable regardless of the time of year and geographical location, we included month and reef as random effects in a generalised linear mixed model (GLMM). This was necessary to account for non-independence of data because our sampling design had a hierarchical structure and the data were over-dispersed.

We performed model selection on the GLMM by testing all combinations of variables, including biologically plausible interactions, after the steps above to find the best set of models as indicated by BIC. Models that were within  $3 \Delta \text{BIC}$  of the best model were averaged [32]. We calculated 95% confidence intervals on full model coefficients with shrinkage for variables included within the averaged model and interpreted predictor variables with intervals that did not overlap zero

as contributing significantly. Response plots were generated for each of these significant model-averaged variables. We report the marginal  $R^2$ , which gives the proportion of variation in the data explained by the fixed effects alone, and conditional  $R^2$ , which further includes the contribution of random effects [33].

The above workflow was repeated for peak spawning month with two exceptions. Because our peak spawning data contained many samples with a value of zero, we used a complementary log-log link function to better capture the error structure of our data [32]. Secondly, reef was not included as a random effect because one “success” only was available for each reef.

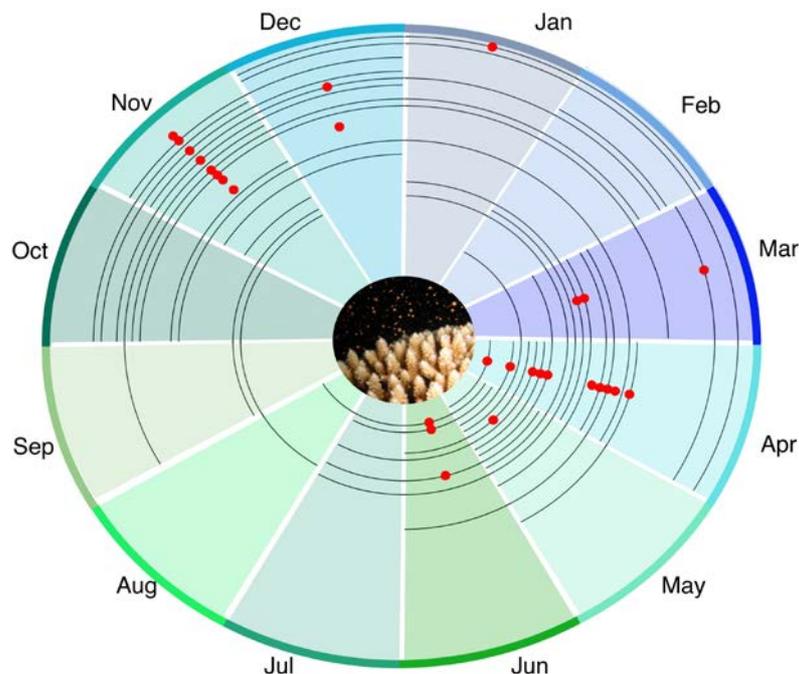
All analyses were performed in R ver. 3.1.1 [34] with the lme4 v.1.1-7 [35], and MuMIn v.1.14.0 [36] packages.

## RESULTS

### Spatiotemporal pattern of spawning

Number of months during which *Acropora* spp. assemblages were spawning was highly variable, ranging from two to nine months across the geographical extent. The highest number of spawning months was found in Thailand, which was split across two seasons. The shortest spawning durations were in Indonesia, New Caledonia and the Red Sea. A clear separation in the month of spawning was evident between the northern and southern hemispheres because spawning tended to occur from spring to early summer in each hemisphere, and peak spawning was concentrated in April and November, respectively (Fig. 2).

Peak spawning occurred in regional clusters. Throughout the majority of the Indo-Australian Archipelago (excluding the Solomon Islands), the Andaman Sea and across the Indian Ocean and in the Red Sea, the peak month of spawning was in March or April (Fig. 1). In the north western Pacific, including Japan, peak spawning was in June (Fig. 1). In the south and central Pacific, including the GBR, peak spawning was predominantly in November (Fig. 1). In the western Pacific, peak spawning appears to occur later into the spring season at sites progressively further away from the equator e.g., the Philippines into Japan and along the east coast of Australia to Lord Howe Island (Fig. 1).



**Figure 2.** Months of spawning (black line) and peak spawning month (red dot) for all reefs. Reefs are ordered by latitude: outer line is the most southerly reef, inner line is the most northerly reef. Inset photo is a spawning *Acropora* colony (photo credit: A. Chelliah).

## Environmental predictability of coral spawning

Relative change in PAR had a strong collinear effect in the model ( $VIF > 2.5$ ) and was removed from further analysis. It was not highly correlated with any one variable, as indicated by the Pearson correlation coefficients, and therefore its effect was unclear (Table S3). To ensure the importance of this variable was not hidden by correlations with other variables, we created a model with PAR relative change as a single predictor. This model was not significantly better than the intercept only model. Model assumptions were met for the GLM. Wind speed was best fitted by a quadratic function, whilst all other terms were best represented with linear functions.

### Spawning months

SST relative change and monthly mean wind speed were selected in each of the two best models; only one model included monthly mean SST. These two models were subsequently averaged because they could not be differentiated (i.e., were  $<3 \Delta BIC$  apart). Relative change in SST contributed positively and most strongly to the averaged model ( $\beta = 1.65$ ; 95% C.I. lower = 1.16, upper = 2.13; Table 1). Specifically, the probability of spawning was high in months when SST had risen rapidly (Fig. 3a). Spawning was also associated with intermediate wind speed ( $\beta_{linear} = -19.11$ ; 95% C.I. lower $_{linear} = -31.97$ , upper $_{linear} = -6.26$ ;  $\beta_{quadratic} = -17.91$ ; 95% C.I. lower $_{quadratic} = -28.74$ , upper $_{quadratic} = -7.08$ ; Table 1, Fig. 3b). By contrast, the contribution of monthly mean SST to the averaged model was unclear, with confidence intervals that overlapped zero ( $\beta = 0.07$ ; 95% C.I. lower = -0.26, upper = 0.40; Table 1), which we interpreted as indicating SST monthly mean did not contribute significantly. The best model, which included relative change in SST, monthly mean SST and monthly mean wind speed, explained 55% of the variation in the data with environmental predictors alone, and 73% when reef and month were included as random effects (marginal  $R^2 = 0.55$ , conditional  $R^2 = 0.73$ ). The actual (as opposed to relative) magnitude of the change in SST is shown in Figure S3.

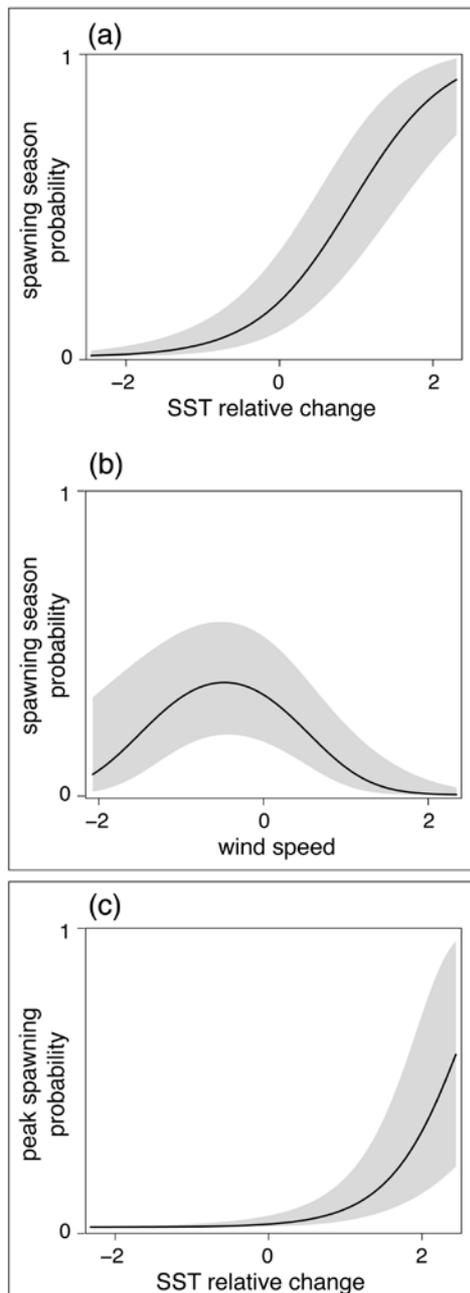
**Table 1.** Model-averaged coefficients (with shrinkage) and 95% confidence intervals. Coefficients with confidence intervals that do not overlap zero are bolded.

	$\beta$ coefficient	lower 95% confidence interval	upper 95% confidence interval
<hr/>			
spawning season			
(Intercept)	-1.47	-2.35	-0.6
<b>Wind speed</b>	<b>-19.11</b>	<b>-31.97</b>	<b>-6.26</b>
<b>Wind speed<sup>2</sup></b>	<b>-17.91</b>	<b>-28.74</b>	<b>-7.08</b>
<b>SST change</b>	<b>1.65</b>	<b>1.16</b>	<b>2.13</b>
SST monthly mean	0.07	-0.26	0.4
<hr/>			
peak spawning month			
(Intercept)	-4.25	-5.54	-2.96
<b>SST change</b>	<b>1.72</b>	<b>1.04</b>	<b>2.4</b>
Current speed	-0.24	-0.83	0.36

Regardless of environmental conditions, spawning was most likely in the months of April and May, and least likely in the months of August and September, indicated by the offset from the intercept of the random effect groups (Fig. S1a). In addition, there was a higher baseline likelihood of spawning at three reefs, two of which were located in Thailand where spawning occurred in six or seven different months, and one in the Solitary Islands on the eastern coast of Australia where spawning occurred every month from January to April (Fig. S1b).

### Peak spawning month

SST relative change was selected for both models in the averaged set, and one model also included monthly mean current speed. Relative change in SST contributed strongly to the averaged model ( $\beta = 1.72$ ; 95% C.I. lower = 1.04, upper = 2.40; Table 1). Similar to the month of spawning model, the probability of spawning was high in months when SST had risen rapidly (Fig. 3c). Current speed was also included in the model-averaged set but was weak and the direction of the relationship was unclear, with 95% confidence intervals that overlapped zero ( $\beta = -0.24$ ; 95% C.I. lower = -0.83, upper = 0.36; Table 1), indicating a lack of significant contribution to the averaged model. The best model, which included both variables, explained 44% of the variation in the data with the environmental predictors alone, and 62% when reef and month were included as random effects (marginal  $R^2 = 0.44$ , conditional  $R^2 = 0.62$ ). Regardless of environmental conditions, the random effect of month indicated that peak spawning was more likely in the months of April, June and November (Fig. S2).



### DISCUSSION

Environmental conditions required to initiate and optimise reproductive events are an essential determinant of biodiversity. Understanding these requirements and the spatial pattern of phenological events is necessary to address global conservation challenges through highlighting potential vulnerabilities across species' life stages. Here, we show that spawning across 99 *Acropora* spp. (the most speciose coral genus) is synchronous over very large spatial scales throughout the Indo-Pacific and all reefs in our dataset experienced multi-specific spawning events [30]. Month of spawning and peak month of spawning for *Acropora* coincided with the largest month-to-month increase in sea surface temperature (SST). Intermediate wind speeds also contributed to the prediction of spawning months, although the relationship was weak. Monthly mean SST, a critical determinant of adult coral distributions, was selected in the best model set for spawning; however, its relationship with reproductive timing was not significant. Overall, approximately half of the variation in the timing of coral spawning can be predicted by the environmental conditions tested here. Seasonal rapid increases in SST appear to be the dominant proximate cue on Indo-Pacific reefs for *Acropora* corals to spawn.

### Tropical phenology

Phenological events in tropical regions are perceived to be linked poorly to seasonal climate owing to muted seasonal variations [9, 10]. For this reason, early discussions discredited the potential for SST to act as a proximate cue and doubted whether corals in these regions would engage in mass spawning events [14]. In contrast, our results show that temperature can act as a generalisable proximate cue for mass spawning events throughout the tropical Indo-Pacific. Therefore, tropical species appear to be more sensitive to small climate fluctuations than assumed previously.

**Figure 3.** Environmental conditions that predict (a-b) month of spawning, and (c) month of peak spawning, in an averaged set of generalised mixed effect models. Partial coefficients for variables with 95% confidence intervals that do not overlap zero in an averaged model are shown. Models for month of spawning (a-b) used a logit link function, whereas models for peak spawning (c) used a complementary log-log link function.

Phenological events in the tropics have also been predicted to be more closely tied to biotic, rather than abiotic cues, because mistiming would create fewer physiological issues, thus the selection for timing would be weak [9]. The absence of biotic factors from our analyses could explain the high conditional  $R^2$ , which implies that additional variables related to specific months explain 18% of the variation in month of spawning and peak month. For instance, coral spawning times might have evolved to avoid times of highest predator abundance. Stomach content analyses during mass spawning on the Great Barrier Reef, Australia, showed that multiple fish species switched from an omnivorous diet to one predominantly of coral spawn [37, 38]. Indeed, biotic interactions have been associated strongly with phenology in other species groups [e.g., 39]. Unfortunately, there are no detailed data on predator abundance and diet switching across a large geographic extent that would allow us to test the importance of interactions for coral spawning directly.

### *Proximate cues*

Temperature was the foremost environmental variable thought to control seasonal patterns in the initial discussions on the phenomenon of coral mass spawning [12, 14, 16, 40]. Strong evidence for a role of SST at a regional scale comes from the split spawning of corals in the central GBR [16]: at the same latitude and separated by only 60 km, species on inshore reefs spawned a month earlier than colonies of the same species at mid- and outer shelf reefs. These spawning peaks were correlated with SST that had warmed a month earlier closer to the mainland [22]. Our analyses confirm these original ideas, albeit with a focus on rates of temperature increase rather than monthly mean SST. Similarly, many terrestrial species respond to growing degree days, which is the integral of temperature over time, and is a stronger predictor of butterfly emergence than calendar date [41].

Conversely, more recent work had largely dismissed the role for temperature and focused instead on solar insolation – in our analysis captured by PAR [23, 28]. The assumed mechanism in this latter work was that solar insolation mediated coral energy acquisition via symbiotic algae, leading to gamete production. Although we do not dismiss a contribution of solar derived energy, we did not find PAR to be of predictive value for Indo-Pacific *Acropora* spp. spawning phenology.

One reason for this discrepancy could be, as noted by Penland *et al.* [23], that solar insolation covers a wide bandwidth (300-5000 nm) of which PAR is a relatively narrow component (360-700 nm). Therefore, solar insolation (PAR was not readily available at that time) might be a poor proxy for energy acquisition leading to premature conclusions. Another reason might lie in the samples used for these analyses. Penland *et al.* [23] had data from only four Pacific sites, whilst the sites included by van Woessik *et al.* [28] were in the Atlantic, which has undergone a different evolutionary history and contains an order of magnitude fewer hard coral species than the Indo-Pacific, with only twelve species included in that analysis. Similarly, rainfall was identified to interact with temperature as a cue in previous analyses [25], but this was for one species only and therefore, cannot provide evidence for rainfall as a cue that can be generalised across species and regions. Our comprehensive analysis across geographic space and species supports the original ideas, and suggests temperature is the major cue that initiates coral spawning.

Proximate cues for phenological events must be reliable and indicate onset of environmental or other conditions that will ensure optimum reproductive success for species to evolve to detect and respond to them [9]. Light availability, of which PAR is a part, is dependent on water clarity and cloud cover, which local conditions such as river discharge can influence strongly [42]. As a result, PAR might provide a less reliable cue compared with the rate of SST rise. However, light is thought to be important on shorter time scales: for example, photoreceptors sensitive to the blue spectrum in moonlight are hypothesised to initiate night time release of gametes during a particular lunar phase [43].

Absolute SST is also susceptible to fluctuations, albeit on longer decadal scales, which could curtail selection for corals that respond to this as a proximate cue. For instance, cyclical phenomena such as the El Niño-Southern Oscillation (ENSO), can warm sections of the Pacific Ocean more than 2°C approximately every 2-7 years [44]. Experimental and observational evidence suggest that Cnidaria, the phylum to which corals belong, have developmental programs (e.g., gamete/larval release, settlement, metamorphosis) that coincide with sustained seasonal shifts in temperature [43].

This evidence fits with the idea that changes in temperature are better proximate cues than absolute temperatures. Thermoreceptors in Cnidaria are poorly understood [45] and might provide a fruitful avenue for research to identify underlying detection mechanisms for the proximate cue.

#### *Ultimate drivers and mechanism*

The ultimate reason corals would evolve to spawn during the fastest rate of SST increase is more difficult to ascertain. Even in the most well studied systems, such as reproductive phenology of the pied flycatcher (*Ficedula hypoleuca*), there are ongoing struggles to resolve mechanistic explanations underlying phenological timing [39]. To truly elucidate the mechanisms of phenology, detailed experiments across a broad biogeographic extent over evolutionary time scales are necessary. Climate change is providing a natural experiment along these lines in some cases [46] but long time series are still required to take advantage of this opportunity. Unfortunately, these do not exist for most organisms and we must therefore speculate on the most plausible explanation given the data available.

Proposed mechanistic explanations underlying the proximate seasonal SST rise cue include synchronous spawning to maximise gamete density, plus a possible temperature effect on sperm motility. In addition to temperature averages, the accumulation of energy through periods of rising temperature might be an important driver of physiological processes related to reproduction: the onset of gametogenesis in corals has been linked experimentally to temperature [47].

However, the simplest possibility to consider is that the ultimate reason for synchronised gamete release is to ensure maximum chances for egg and sperm to come into contact regardless of external conditions. In this case, multiple species would spawn simultaneously purely because they are similar physiologically and therefore constrained to recognise a relatively narrow suite of cues [14]. The trade-off associated with such multi-specific gamete release is an increased probability of unviable hybrids [12] and negative density-dependence [15]. However, it seems implausible that there has not also been selection for spawning times to coincide with environmental conditions that are optimal for fertilisation and subsequent larval survival, particularly because fertilisation is external, and therefore, exposed to the elements. Therefore, corals are likely to have been subjected to selection pressures that ensure conditions at the time of spawning will maximise fertilisation success and larval survival. Our results show that absolute temperature during the greatest rate of SST rise varied greatly across the Indo-Pacific, but in general it was below the maximum and well above the minimum. This suggests either coral propagules are insensitive to absolute temperature, or that they are locally adapted to regional thermal regimes.

Evidence for local adaptation in early life stages of corals has been revealed in experimental situations, where larvae of the same species from populations at different latitudes respond differently to temperature treatments: larvae from lower latitude populations are more tolerant of higher temperatures [3]. High SST (2-4°C above ambient at time of spawning) is associated with an increased frequency of abnormal embryos, lower survival rates, and greatly reduced fertilisation success in *Acropora* species [3, 48]. Whilst the small magnitude of intra-annual temperature fluctuations in the tropics means it is unlikely that the temperature during the month of fastest SST rise is 2-4°C below the annual maximum SST, a shift in temperature could provide a thermal safety margin to ensure corals can fertilise even when inter-decadal cycles, such as ENSO events, generate positive temperature anomalies.

Intermediate wind speed is likely to contribute through the generation of water movement that ensures horizontal advection of gametes but without inducing excessive vertical mixing (as would result from higher winds) that could take gametes deeper in the water column. Some agitation is required to quickly break apart egg and sperm cells that are released together in mucous-wrapped bundles from the adult corals [12]. It is particularly important to break up these bundles rapidly because evidence suggests that self-fertilisation is rarely successful compared with cross-fertilisation amongst individuals of the same species [49]. Ultimately, the optimum fertilisation success achieved from water movement and avoidance of maximum annual SST provides a plausible explanation for coral spawning phenology.

## CONCLUSION

Seasonal rapid increase in SST has the potential to provide a proximate environmental cue to synchronise mass coral spawning phenology across the Indo-Pacific, with a secondary role for moderate winds. The use of temperature as a phenological cue is widespread across species; however, in this case it is the shift in temperature, rather than the absolute SST, that initiates coral gamete release. While there is high confidence that SST will rise over the coming decades [50], if the difference in SST between months is maintained, the same month will continue to experience the greatest rise in SST. Under these conditions, the impact of climate change on coral reproductive timing might be minimal relative to species that rely on absolute temperatures, which have already experienced shifting phenologies [46]. Specific projections of intra-annual SST derivatives under climate change scenarios would provide further context in which to consider our results.

An alternative scenario in response to climate change is that the proximate cue of SST rise and the ultimate selective force might become decoupled [51]. Rising SST, shifted currents, altered nutrient distributions, and increased frequencies of extreme events are projected for the oceans over the coming decades [50, 52]. For corals that cannot adapt through behavioural plasticity or rapid evolution, decoupling is a real danger. If the month of greatest rise in SST remains stable while the optimum environmental conditions for fertilisation and larval survival shift to a different month, decoupling of proximate and ultimate drivers could lead to sub-optimal population replenishment. Ultimately, this reproductive decline could further exacerbate the threat of climate change for corals and the wider reef ecosystem.

## DATA ACCESSIBILITY

The datasets supporting this article have been uploaded as part of the supplementary material (Table S1).

## COMPETING INTERESTS

We have no competing interests.

**AUTHOR CONTRIBUTIONS:** AHB, JM and SK designed the study, AE, JG, AGB, AHB, MLB, JB, SP, RvH and SFH collected the data, SK performed the analyses, SK, AHB and JM wrote the manuscript, all authors contributed equally to editing the manuscript. All authors gave final approval for publication.

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