

Coral reef structural complexity loss exposes coastlines to waves

Jérémy Carlot^{1,2,3*}, Michalis Vousdoukas⁴, Alessio Rovere⁵, Theofanis Karambas⁶, Hunter S. Lenihan⁷, Mohsen Kayal^{2,8}, Mehdi Adjeroud^{1,2,3,9}, Gonzalo Pérez-Rosales^{2,10}, Laetitia Hedouin^{2,10}, Valeriano Parravicini^{1,2,3}

Affiliations

¹ PSL Université Paris, UAR 3278 CRILOBE - EPHE-UPVD-CNRS, Perpignan, France

² Laboratoire d'Excellence "CORAIL", Paris, France

³ CESAB - FRB, Montpellier, France

⁴ European Commission, Joint Research Centre (JRC), Seville, Spain

⁵ Centre for Marine Environmental Sciences (MARUM), Bremen, Germany

⁶ Department of civil Engineering, Aristotle University of Thessaloniki, Greece

⁷ Bren School of Environmental Science and Management, USCB, Santa Barbara, USA

⁸ ENTROPIE, IRD, Université de la Réunion, CNRS, IFREMER, Université de la Nouvelle-Calédonie, Nouméa, New-Caledonia

⁹ ENTROPIE, IRD, Université de la Réunion, CNRS, Perpignan, France

¹⁰ PSL Université - EPHE-UPVD-CNRS, UAR 3278 CRILOBE, Papetoai, French Polynesia

ORCID & Mails:

Jérémy Carlot	0000-0003-0887-8005 jay.crlt02@gmail.com
Michalis Vousdoukas	0000-0003-2655-6181 vousdoukas@gmail.com
Alessio Rovere	0000-0001-5575-1168 arovere@marum.de
Theofanis Karambas	0000-0002-6142-7855 karambas@civil.auth.gr
Hunter S. Lenihan	0000-0001-8146-7670 Lenihan@bren.ucsb.edu
Mohsen Kayal	0000-0003-3675-9855 mohsen.kayal@gmail.com
Mehdi Adjeroud	0000-0002-6825-8759 mehdi.adjeroud@ird.fr
Gonzalo Perez-Rosales	0000-0001-6577-3416 gonzalo.prb@gmail.com
Laetitia Hedouin	0000-0001-6565-3633 hedouinlaet@gmail.com
Valeriano Parravicini	0000-0002-3408-1625 valeriano.parravicini@gmail.com

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*Corresponding author: Jérémy Carlot,
PSL Université Paris
UAR 3278 CRILOBE - EPHE-UPVD-CNRS
52 av. Paul Alduy, Perpignan 66000
Laboratoire d'Excellence "CORAIL"
E-mail: jay.crlt02@gmail.com

Abstract

Coral reefs offer natural coastal protection by attenuating incoming waves. Here we combine unique coral disturbance-recovery observations with hydrodynamic models to quantify how structural complexity dissipates incoming wave energy. We find that if the structural complexity of healthy coral reefs conditions is halved, extreme wave run-up heights that occur once in a 100-years will become 50 times more frequent, threatening reef-backed coastal communities with increased waves, erosion, and flooding.

Introduction

By March 2020, the world's human population grew to more than 7.8 billion people¹, with most of the growth in coastal areas where population density is highly concentrated². As a result, the number of people exposed to intense coastal storms and flooding also markedly increased³. Climate change is expected to further exacerbate the risks of flooding due to rising seas^{4,5} and changes in weather patterns⁶⁻⁸. In response, societies are called to design effective coastal protection schemes⁹, which preserve or strengthen the current natural protection offered in the form of ecosystem services¹⁰.

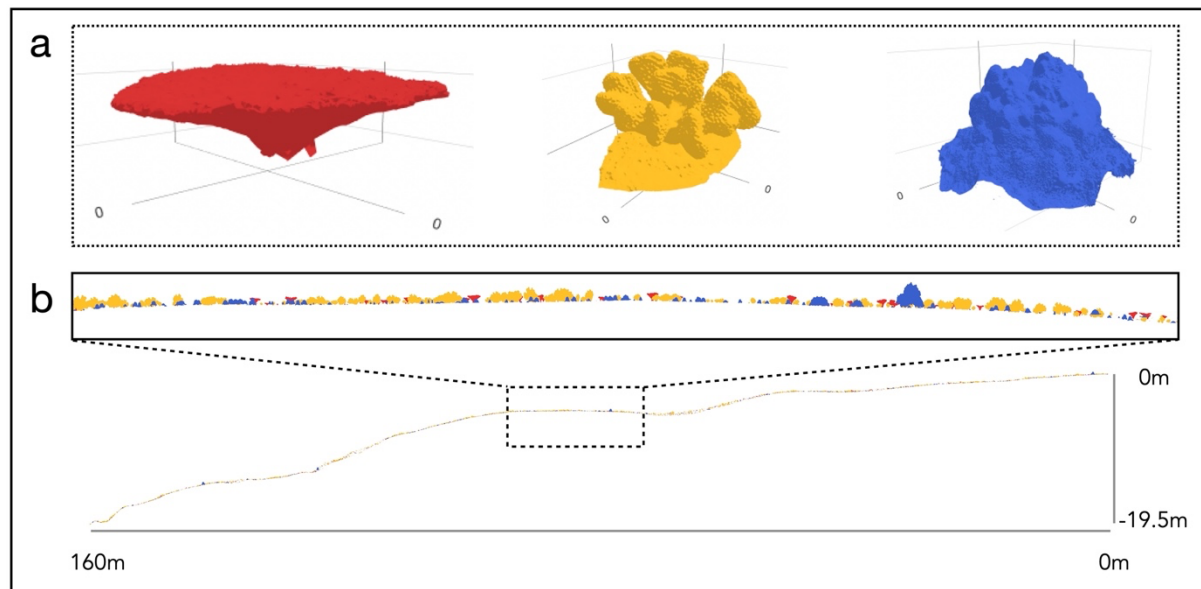
This is particularly true in tropical areas, where more than 500 million people are protected by coral reefs¹¹. Shallow water coral reefs act as natural breakwaters, and can attenuate up to 98% of the incoming wave energy¹². However, coral reefs are being rapidly degraded by intensifying anthropogenic stressors, including ocean acidification, rising seas, pollution, and sedimentation¹³. Such perturbations usually reduce living coral cover and subsequently habitat structural complexity, thereby leading to reef flattening, a process observed worldwide¹⁴. Such trends reduce the natural protective capacity of reefs, further intensifying coastal flood and erosion risks^{9,15}. Although the link between wave attenuation and reef structural complexity is widely accepted among scientists in theory, quantitative examinations of the protective capacity of reefs under real world conditions are yet limited.

Here we report field observations and numerical models to quantify the natural protection offered by coral reefs at a high-energy site in Mo'orea, French Polynesia. First, we monitor changes in coral community abundance and size-distribution over a 10-year full cycle of disturbance and recovery (2005-2016), and quantify the associated reef structural complexity (see methods for details). Second, we use *in situ* hydrodynamic measurements to link the structural complexity levels with the wave energy dissipation capacity of the reef, and to calibrate a Boussinesq wave propagation model, which simulates the interplay between hydrodynamics and reef topography on the site. Third, we apply a probabilistic framework that

assesses a coral reef's capacity to attenuate incoming wave energy, applying our model under all possible wave and structural complexity conditions for the study site. We evaluate the resulting 10,000 runs by using as proxies wave overwash, impact, and flooding, the significant wave run-up, and finally, the 2% exceedance wave run-up height ($R_{2\%}$).

Material & Methods

Ecological sampling and structural complexity profiles

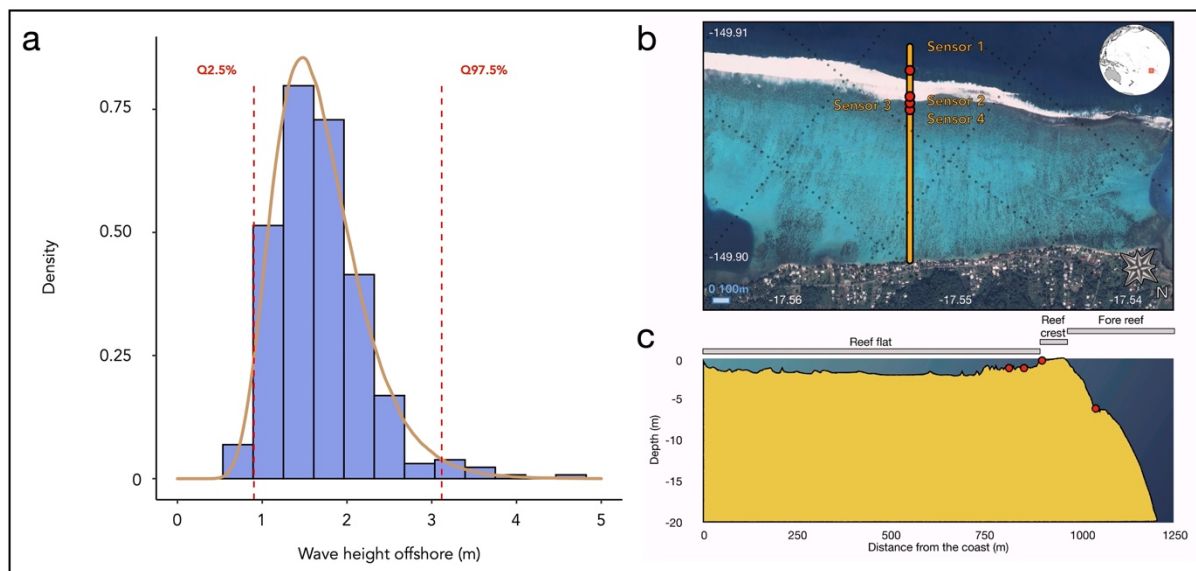


Supplementary Figure 1 | a. Representation of the three different coral species (*Acropora hyacinthus* in red, *Pocillopora cf. verrucosa* in yellow, and *Porites lutea* in blue). b. Representation of the Ha'apiti cross-section on the outer reef slope from a 0 m depth to 20 m depth.

The ecological sampling consists of 10 surveys, taking place in 2005 and from 2008 to 2016, and documents changes in coral colony abundance and size distributions (*i.e.*, width, length, and height) for the three most conspicuous taxa (*i.e.*, *Acropora*, *Pocillopora*, and *Porites*) within a 10 m² transect on the outer slope¹⁶. To quantify reef structural complexity, we built a 3D model of the coral assemblages distributed along a cross-section of the reef substrate separating the 20 m water depth from the reef crest, representing a 160 m stretch along the reef slope (**Supplementary Figure 1**). First, we take 200 overlapping high-resolution photos (300 dpi) of 10 individual corals from each species (*i.e.*, $n = 30$ coral colonies) and built 3D models using the Agisoft Metashape software¹⁷, capturing intra- and inter-species morphological variability (**Supplementary Figure 1**). Then, we systematically and randomly select one of the ten 3D coral models for each taxon until that the sum of the planar area for

each 3D coral models match with the coral cover reported for each taxon and for each year¹⁶. We randomly place coral colonies along the 160 m reef cross-section going from 20 m depth to the reef crest (**Supplementary Figure 2**). The individual coral 3D models are resized in width, length, and height according to ecological surveys, and, randomly rotated between $-\pi/2$ and $\pi/2$ to ensure ecological variability. Finally, we estimated structural complexity of the 3D coral assemblage model using the function *rumple_index* of the *LidR* package¹⁸ in R 4.0.0¹⁹. We repeat this approach 100 times for each year, resulting in a total of 1000 reef structural complexity profiles. Our estimates are consistent with previous reef structural complexity estimates at this location²⁰.

Hydrodynamic and topographic measurements



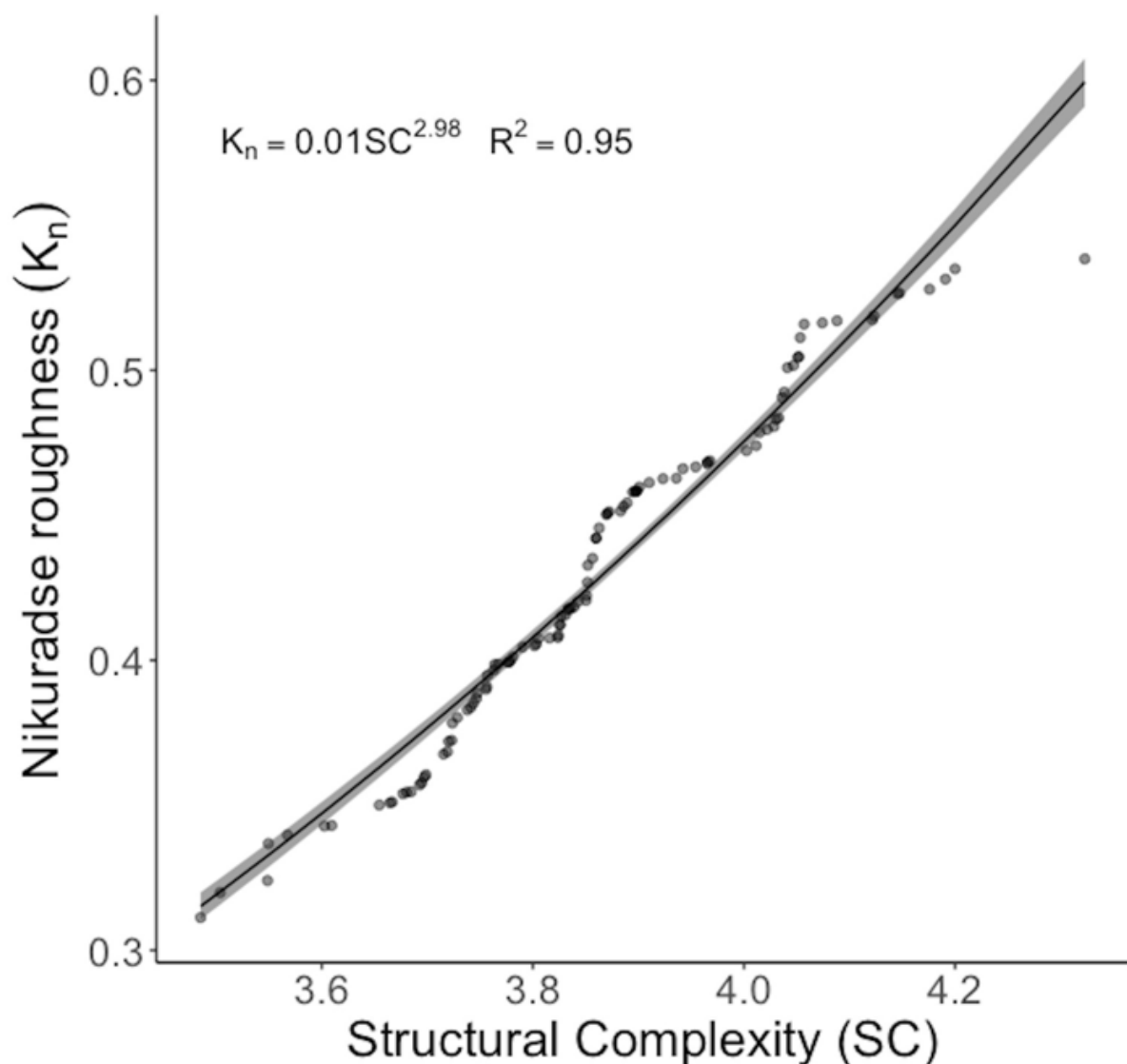
Supplementary Figure 2 | a. Histogram of the wave height offshore (m) at Ha'apiti, Mo'orea (French Polynesia) in 2016. **b.** Aerial view of Ha'apiti (WorldView-3 imagery) with an outline of the transect and sensor location. **c.** Topographic cross-section of the transect and position of the sensors on the sea bottom.

Mo'orea (French Polynesia) is encircled by coral reefs, 500–700m wide with a dominant swell direction coming from the southwest. In this study, we focus on Ha'apiti, a site with a southwest orientation that is considered as a high-energy site²¹. We extract 30-year offshore wave data (1980-2010) from a wave hindcast^{8,22} (**Supplementary Figure 2**). We also collect high-frequency, *in situ* wave data using INW PT2X Aquistar and DHI SensorONE pressure transducers (PTs), which are logged at 4 Hz²³. The sensors are installed at four locations along a cross-shelf gradient (**supplementary Figure 2b,c**) covering a 250 m long stretch, including

sections through the fore reef, reef crest, and reef flat. Pressure records are corrected for pressure attenuation with depth²⁴ and are split into 15-min bursts²³.

The beach profile and the reef morphology are measured using airborne bathymetric and topo-bathymetric lidar surveys conducted in June 2015 by the Service Hydrographique & Océanographique de la Marine (SHOM). The bathymetric data are defined by the combination of bathymetric laser (for the submerged part of the beach) and topo-bathymetric laser (for the subaerial beach). The data come at 1 m resolution and are available at <https://diffusion.shom.fr>.

Hydraulic roughness vs structural complexity



Supplementary Figure 3 | Structural complexity versus Nikuradse roughness measurements along the coral reef cross-shelf gradient of Ha'apiti.

Spectral attenuation analysis of the water level measurements^{25,26} is used to estimate the Nikuradse (hydraulic; k_n) roughness²⁷ of the coral reef surface along the beach profile sections covered by the pressure transducers. More precisely, the water level data allow obtaining more than 300 k_n estimates, which concur with the reef structural complexity estimates in 2015 (**Supplementary Figure 3**). We carefully delineate the sandy section from the reef sections within the cross-shelf gradient (*i.e.*, within the reef flat) and apply the following procedure. First, for the reef sections, we define the relationship between the reef structural complexity and K_n (**Supplementary Figure 3**) and convert our reef structural complexity estimates into continuous K_n profiles through Monte Carlo simulations, assuming that coral colonies are similar through a same geomorphologic section (*e.g.*, forereef, reef crest, and reef flat). Second, for the sandy section, we define k_n on the grounds of the mean grain size ($d_{50} = 63\mu\text{m}$). Applying this workflow, we obtain 100 continuous K_n profiles for each year (*i.e.*, $n = 1000$ K_n profiles in total).

Hydrodynamic model

Nearshore wave propagation is simulated using a nonlinear wave model based on the Boussinesq equations²⁸ :

$$\begin{aligned} \frac{\partial U}{\partial t} + \frac{1}{h} \frac{\partial M_u}{\partial x} - \frac{1}{h} U \frac{\partial (Uh)}{\partial x} + g \frac{\partial \zeta}{\partial x} \\ = \frac{(d^2 + 2d\zeta)}{3} \frac{\partial^3 U}{\partial x^2 \partial t} + d_x h \frac{\partial^2 U}{\partial x \partial t} + \frac{\partial^2}{3} \left(U \frac{\partial^3 U}{\partial x^3} - \frac{\partial U}{\partial x} \frac{\partial^2 U}{\partial x^2} \right) \\ + d \frac{\partial \zeta}{\partial x} \frac{\partial^2 U}{\partial \zeta \partial t} + d d_x U \frac{\partial^2 U}{\partial x^2} + d_x \frac{\partial \zeta}{\partial x} \frac{\partial U}{\partial t} - d \frac{\partial^2}{\partial x \partial t} \left(\delta \frac{\partial U}{\partial x} \right) + E - \frac{\tau_b}{\rho h} \\ + B d^2 \left(\frac{\partial^3 U}{\partial x^2} + g \frac{\partial^3 \zeta}{\partial x^3} + \frac{\partial^2 \left(U \frac{\partial U}{\partial x} \right)}{\partial x^2} \right) + 2B d d_x \left(\frac{\partial^2 U}{\partial x \partial t} + g \frac{\partial^2 \zeta}{\partial x^2} \right) \end{aligned} \quad (1)$$

where, U is the mean over the depth horizontal velocity, ζ is the surface elevation, d is the water depth, u_o is the near bottom velocity, $h = d + \zeta$, $M_u = (d + \zeta)u_o^2 + \delta(c^2 - u_o^2)$, δ is the roller thickness determined geometrically²⁹, E is an eddy viscosity, τ_b is the bed friction term and $B = 1/15$ ²⁸.

In this work the wave breaking mechanism is based on the surface roller concept²⁹. However, in the swash zone, surface roller is not present and the eddy viscosity concept is used to describe the breaking process. The term E in equation (1) is written:

$$E_{bx} = B_b \frac{1}{h + \eta} \{v_e [(h + \eta)U]_x\}_x \quad (2)$$

where v_e is the eddy viscosity coefficient:

$$v_e = \ell^2 \left| \frac{\partial U}{\partial x} \right| \quad (3)$$

where ℓ is the mixing length $\ell = 3.5 h \kappa \alpha B_b^{30}$.

The ‘dry bed’ boundary condition is used to simulate run-up²⁸. The numerical solution is based on the fourth-order time predictor-corrector scheme³¹. Therefore, the bed friction term τ_b is calculated such as:

$$\tau_{bx} = \frac{1}{2} \rho f_w U |U| \quad (4)$$

where f_w is the bottom friction coefficient³², which is an explicit approximation to the implicit, semi-empirical formula given by Jonsson, 1967³³.

$$f_w = \exp \left[5.213 \left(\frac{k_n}{\alpha_0} \right)^{0.194} - 5.977 \right] \quad (5)$$

Where α_0 is the amplitude of the near-bed wave orbital motion and k_n is the Nikuradse roughness height.

Simulations and post processing

We use our wave propagation model to assess how different coral reef states affect the impact waves have on the coast. We run an ensemble of 10,000 simulations that covers all the possible combinations of (i) 10 bottom roughness profiles expressing the different observed coral reef states (*i.e.*, healthy vs. not unhealthy); and (ii) 1,000 percentiles of wave conditions. The wave conditions are produced as follows: (i) from the weekly values, we estimate all significant wave height (H_s) percentiles from 0.1 to 100, with a step of 0.1; (ii) the resulting 1000 H_s values are linked to the corresponding peak wave period T_p using a copula expressing the dependence of the two variables³⁴. The output of the simulations is the nearshore H_s and 2% exceedance run-

up ($R_{2\%}$) height for each of the 1000 conditions and 10 coral reef states. To quantify how the coral reef states are altering wave propagation during extreme events, we apply extreme value analysis to estimate the $R_{2\%}$ for different return periods³⁵. We then compare how the return period curves changed from the two coral reef states and we define the change in frequency of extreme $R_{2\%}$ under unhealthy coral reefs.

Using the outputs of our simulations, we develop a Bayesian model which includes all the interdependencies between the run-up, the significant offshore wave height ($H_{s, offshore}$), and the reef structural complexity (SC). Our model is built in the R package *brms*^{36,37} and follows the following structure :

$$\begin{aligned}
 RU &\sim \mathcal{N}(\mu_s, \sigma) \\
 \mu_s &= (\alpha + \sigma_\zeta) \times H_{s, offshore} + (\beta + \sigma_\zeta) \times SC + (\gamma + \sigma_\zeta) \times SC : H_{s, offshore} \\
 \alpha &\sim \mathcal{N}(0, 1); \beta \sim \mathcal{N}(0, 1); \gamma \sim \mathcal{N}(0, 1); \sigma \sim \Gamma(2, 0.1); \sigma_\zeta \sim \Gamma(2, 0.1)
 \end{aligned}$$

where RU is the run-up (m), SC is the structural complexity, and $H_{s, offshore}$ is the significant offshore wave height (m). The prior sampling is specified to follow a Gaussian (\mathcal{N} (location, scale)) and a Gamma (Γ (shape, inverse scale)) distribution. We ran our models with four chains, 5,000 draws per chain, and a warm-up period of 1,000 steps, thus retaining 16,000 draws to construct posterior distributions. We verify chain convergence ($n = 4$) with trace plots and confirm that $R_{\hat{h}}$ (the potential scale-reduction factor) is lower than 1.05³⁸. Drawing on our model, we predict the run-up according to six offshore wave height conditions (*i.e.*, from 1 to 6 m with a step of 1 m) and the structural complexity gradient at Mo'orea from 2005 to 2016. In order to define the residual run-up height according to $H_{s, offshore}$ and the reef structural complexity, we subtract from our run-up estimates the minimum value obtained for each offshore wave height condition.

Results and discussion

Between 2006 and 2010, Mo'orea experienced an outbreak of the predatory sea star *Acanthaster cf. solaris* and a cyclone reducing consequently the living coral cover from 50% to 3% and halving the overall structural complexity (**Figure 1**). Accordingly, we consider the year

after these disturbances (*i.e.*, 2011) as unhealthy coral reefs. By the year 2016, coral cover recovered from these disturbances with a dominance of *Pocillopora* cf. *verrucosa*, presenting a higher complexity profile from the three coral species and increasing the overall reef structural complexity (**Figure 1**). Therefore, we consider the year 2016 as a healthy coral reef. Overall, the median structural complexity from unhealthy reefs is 1.58 with the very likely range of 1.25-1.92 (5th-95th percentile), whereas the median structural complexity from healthy reefs is 3.86 with the very likely range of 3.59-4.20.

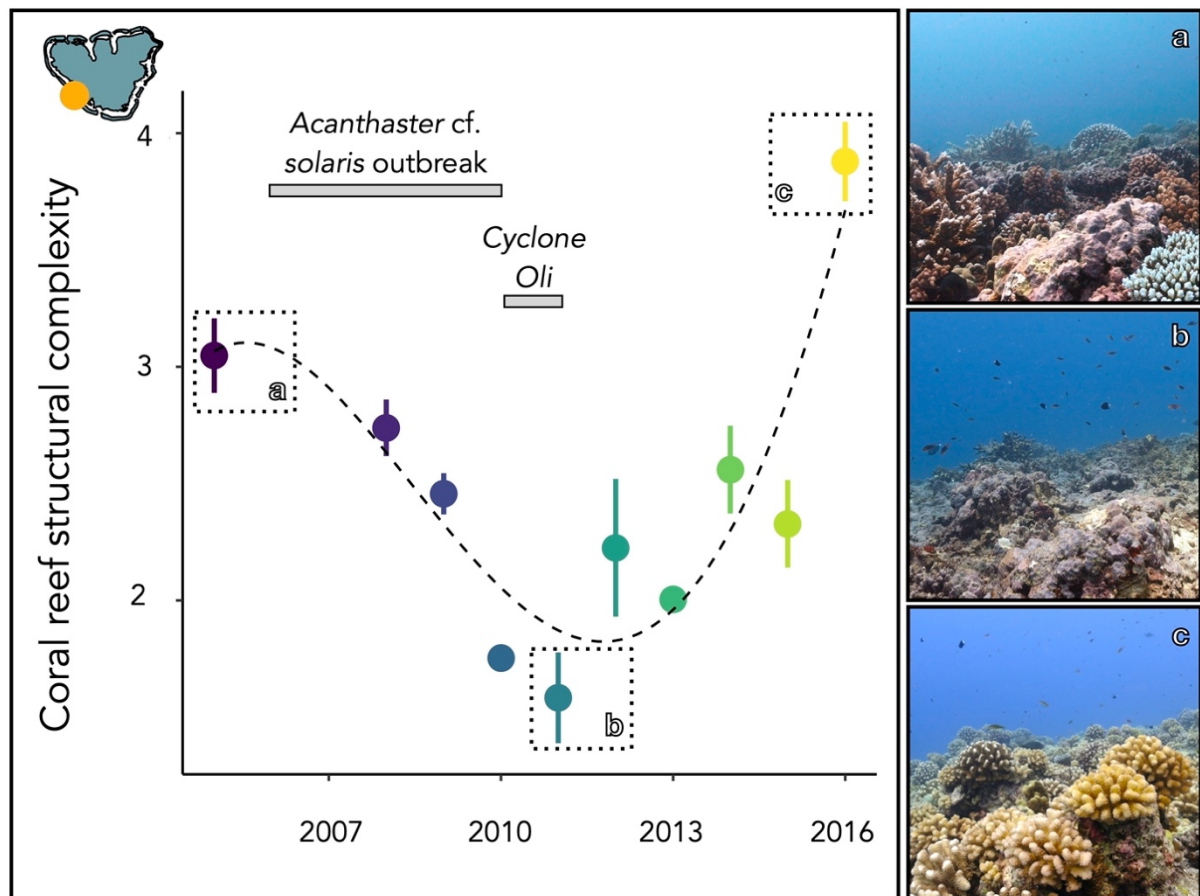


Figure 1 | Evolution of the structural complexity from 2005 to 2016 on the west side of Mo'orea (French Polynesia). Perturbations included a predatory sea star (*Acanthaster* cf. *solaris*) outbreak from 2006 to 2009 and a cyclone in February 2010. Photographs illustrate the reefscapes in **a**. 2005, **b**. 2011 (unhealthy reef) and **c**. 2016 (healthy reef).

Field measurements show that the median Nikuradse (hydraulic; k_n) roughness²⁷ of healthy reefs at Mo'orea is 0.42, with a very likely range of 0.34-0.52. We combine the simultaneous k_n and structural complexity measurements in Monte Carlo simulations, in order to produce continuous k_n profiles for all observed coral reef states, which we use in our wave propagation simulations. In line with previous studies¹², our modeling results show that coral reefs absorb 77% to 91% of the incoming wave energy, with the range expressing the variability of wave and structural complexity conditions. We also confirm the previously reported strong correlation between structural complexity and wave dissipation²¹, and hence the reduction of wave run-

up height on the coast (**Figure 2a**). Unhealthy reef conditions result in wave run-up heights 9.6% higher compared to healthy ones (very likely range 8.7-10.7%). Our results also show that wave run up height reduction increases with wave height, highlighting that coral reef protection is more important when it matters most; *i.e.*, during extreme events (**Figure 2b**). For example, structural complexity has twice the potential to dissipate offshore waves with significant wave height $H_s = 3\text{m}$ (exceeding the 97.5th percentile in our study site) compared to a wave with $H_s = 1\text{m}$ (below the 2.5th percentile, **Supplementary Figure 2a**).

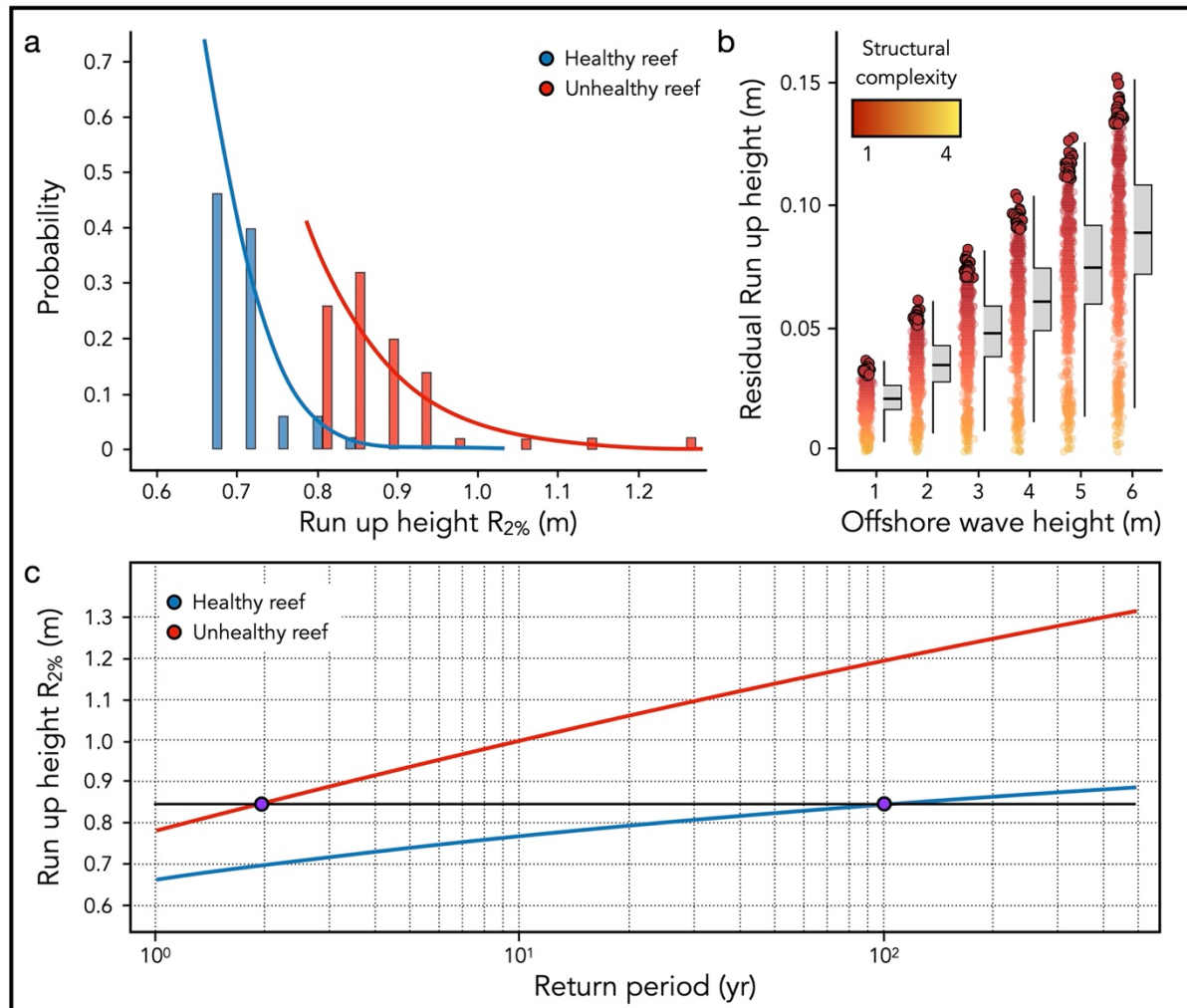


Figure 2 | a. Comparisons of the 2% exceedance wave run-up height under healthy (blue) and unhealthy (red) coral reefs conditions. For each case, we superimpose the fitted Generalized Pareto Distribution (lines) on the empirical probability density function (histograms). **b.** Residual run-up height according to the structural complexity loss and the magnitude of the event. The black-circled points highlight the 2% exceedance wave run-up height. **c.** Extreme 2% exceedance wave run up height ($R_{2\%}$) under healthy (blue) and unhealthy (red) coral reefs conditions. The curves show how $R_{2\%}$ varies with the return period, while the black horizontal line highlights that the one in a 100-year $R_{2\%}$ under healthy coral reef conditions (onshore wave run up of 0.85 m) will occur at least every two years if coral reefs deteriorate.

We apply an extreme value analysis to assess how the loss of coral reef structural complexity controls the frequency of extreme wave run-up. Our findings show that the frequency of extreme overwash and flood conditions on the shore will increase as long as coral health deteriorates, even without rising sea-levels. For example, wave run-up heights, which under healthy reef conditions occur once in a 100-year, will become 50 times more frequent if coral reef structural complexity deteriorates (**Figure 2c**). This effect is further amplified with the increase in the return period of big-wave events; a 10-year event will become *ca.* 10 times more frequent, whereas a 500-year event will become at least 150 times more frequent.

Coral reefs thrive mainly in tropical and sub-tropical regions where the highest intensification of extreme sea levels (ESLs) has been projected⁸; *i.e.*, the 100 year ESL will occur at least every 10 years after 2050, every year in many locations. Our results imply that reef degradation will exacerbate sea level rise, leaving reef-supporting coastlines more exposed to coastal flooding and erosion than previously projected. Wave attenuation relies mainly on reef accretion and structural complexity²¹, for which the projections are not encouraging. Under a high greenhouse gas emissions scenario by the year 2050, 94% of the reefs worldwide may cease to accrete and start to flatten due to ocean acidification and warming³⁹. Thus, the effects of rising seas are expected to be further amplified by the loss of living corals, painting a grim picture for the future safety of tropical coastal societies and highlights the critical importance of emission mitigation and coral preservation efforts.

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Author contributions

J.C, M.V, A.R and V.P. conceived the idea and designed the methodology. M.K, H.S.L and M.A collected the ecological data. A.R and V.P collected the hydrodynamic data. J.C, M.V and T.K analysed the data.

J.C and M.V led the writing of the manuscript. All authors contributed significantly to the drafts and approved the final version for publication.

Author information

These authors contributed equally: Jérémy Carlot and Michalis Vousdoukas

Competing interests

None declared.

Data availability

Code and data are available at https://github.com/JayCrlt/Wave_energy.git

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