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Thermal tolerance limits as indicators of current and future intertidal zonation patterns in a diverse mussel guild

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Abstract

Climate change has driven shifts in species distributions along latitudinal and elevational gradients, and such shifts are likely to continue as warming accelerates. However, little is known about the response of strongly interacting species, including whether multiple, interacting species are likely to shift concordantly or whether climate change will promote community disassembly. In rocky shore ecosystems, mussels are dominant foundation species that provide habitat and increase diversity of associated species. The New Zealand mussel guild is uniquely diverse as four species can be found within 1 m^2 of shoreline. We integrated comparative ecophysiology and population ecology to evaluate whether air temperature sets elevational range limits and to quantify mussels' warming tolerances. Air temperature appears to set upper intertidal limits across mid-intertidal species, based on fndings that (1) lethal thermal limits coincided with temperatures experienced at upper tide-height limits, (2) species with higher thermal tolerances occurred higher on shore, and (3) lethal tolerances were highest at our warmest site. Based on predicted body temperatures in year 2100, mid-elevation habitat-forming mussels are likely to experience an increase in the frequency of thermal events causing 50% mortality at their upper elevation limit. Such events are predicted to occur 3.0–4.4 times more frequently in 2100 than present at a warmer site and to increase from 0 to 0.4/0.1 days per year for *Perna/Aulacomya*, but not *Mytilus*, at a cooler site. These results indicate that the mussel species' ranges are all likely to contract at warmer sites in the future, decreasing habitat for associated organisms.

Introduction

Recent climate warming is associated with shifts in species distributions along latitude (Parmesan and Yohe [2003](#page-11-0); Sorte et al. [2010;](#page-11-1) Chen et al. [2011;](#page-9-0) Wernberg et al. [2011](#page-11-2)),

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depth (Perry et al. [2005\)](#page-11-3), and elevation (Chen et al. [2011](#page-9-0)) gradients. Physiological tolerances are highly variable both within and among species (Stillman [2003](#page-11-4); Stillman and Somero [2000;](#page-11-5) Sorte et al. [2011\)](#page-11-6), and populations living at or near their thermal limits could be most prone to distributional shifts (Helmuth et al. [2006;](#page-10-0) Somero [2012;](#page-11-7) Sunday et al. [2012](#page-11-8)) and local extinction (Calosi et al. [2008;](#page-9-1) Berg et al. [2010\)](#page-9-2). Range shifts could have severe consequences for adaptive potential, community structure and ecosystem functioning, particularly when they occur for strongly interacting "leverage species"—such as foundation species—which have extensive infuences on local biodiversity (Borrvall et al. [2000](#page-9-3); Schiel et al. [2004](#page-11-9); Harley et al. [2006\)](#page-10-1). Furthermore, recent observations have shown that species often shift at disparate rates, leading to potential disassembly ("mismatch") of trophic webs and overall communities (Chivers et al. [2017\)](#page-9-4). Given projections that global surface temperatures will increase by 2.6–4.8 °C during the twenty-frst century (Rogelj et al. [2012](#page-11-10)), understanding the species-specifc thermal ecophysiology of multiple foundation species is essential for predicting their vulnerability to

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warming and preserving vital ecosystem services. The goal of our study was to link air temperatures, thermal tolerance limits, and distribution patterns across a guild of foundation species and use this mechanistic understanding to project distributional shifts under climate-warming scenarios.

Temperature often limits the latitudinal and elevational ranges of marine and terrestrial species (Cahill et al. [2014\)](#page-9-5) because both non-lethal and lethal responses to warming infuence demographic parameters (Somero [2002](#page-11-11); Williams et al. [2007\)](#page-12-0). However, population sizes—and, thus, range boundaries—can also be set by other abiotic factors (e.g., precipitation, nutrients and salinity), species interactions, and community composition (Keith et al. [2008](#page-10-2); Sexton et al. [2009](#page-11-12)). To project range shifts under climate warming, we frst need to determine the degree to which temperature sets distributional limits and estimate "warming tolerance", or the diference between a species' physiological tolerance limit and habitat temperature (Deutsch et al. [2008\)](#page-9-6). Recent work has demonstrated that warming tolerances can difer greatly between species (e.g., Deutsch et al. [2008](#page-9-6); Vinagre et al. [2016\)](#page-11-13) and across available habitats (e.g., Miller et al. [2009;](#page-10-3) Faulkner et al. [2014](#page-10-4); Mislan et al. [2014](#page-11-14)). However, few studies have considered warming tolerances among interacting species to anticipate shifts in community composition in response to rising global temperatures (Gilman et al. [2010](#page-10-5)).

In rocky intertidal ecosystems—where organisms living between the low- and high-tide water lines experience daily exposure to both marine and terrestrial conditions–maximum temperatures experienced during aerial emersion often set species' upper intertidal range limits (Kennedy [1976;](#page-10-6) Menge [1976](#page-10-7); Harley and Helmuth [2003;](#page-10-8) Stickle et al. [2016;](#page-11-15) [2017](#page-11-16)). At the same time, biological interactions (e.g., predation and competition) have been shown to drive lower limits (Connell [1961;](#page-9-7) Menge and Sutherland [1976](#page-10-9); but see e.g., Seabra et al. [2016;](#page-11-17) Lourenço et al. [2016\)](#page-10-10). These efects of abiotic and biotic factors on species' distributions create well-defned zonation patterns, with mussel species dominating the mid zone of intertidal systems (Menge [1976;](#page-10-7) Menge and Branch [2001\)](#page-10-11). Mussels act as foundation species, increasing the biodiversity of associated species by providing a refuge from abiotic and biotic stressors (Suchanek [1992](#page-11-18); Gutiérrez et al. [2003](#page-10-12); Borthagaray and Carranza [2007,](#page-9-8) Jurgens and Gaylord [2018\)](#page-10-13). Given their role in promoting community diversity, it is particularly important to understand how climate change might afect the intertidal mussel guild.

We investigated the underlying mechanisms and consequences of climate change responses—specifcally, increase in air temperature—for a mussel guild in the rocky shore community of New Zealand. Four mussel species co-occur in the intertidal zone of New Zealand's South Island: the green-lipped mussel *Perna canaliculus*, blue mussel *Mytilus galloprovincialis*, ribbed mussel *Aulacomya maoriana*, and little black mussel *Xenostrobus pulex* (hereafter, referred to by genus) (Fig. [1](#page-1-0)). Most temperate rocky shorelines are inhabited by an average of two mussel species per site (Blanchette et al. [2008](#page-9-9); Broitman et al. [2001](#page-9-10); Branch and Steffani [2004](#page-9-11); Sorte et al. [2017\)](#page-11-19). The high mussel diversity in New Zealand is unique and makes this system ideal for conducting ecophysiological comparisons between species. Furthermore, the mussel guild in our study region of the South Island is composed of only native species, based on recent molecular evidence that the dominant local *Mytilus* is the native Southern Hemisphere lineage of *Mytilus galloprovincialis* (Westfall and Gardner [2010;](#page-12-1) Gardner et al. [2016\)](#page-10-14).

Although there are relatively few published papers on New Zealand mussels, previous studies in this system suggest that thermal physiology is important in biogeographic

canaliculus

Aulacomya galloprovincialis maoriana

Xenostrobus pulex

Fig. 1 Field sites and mussel species on the South Island of New Zealand. Primary sites (in bold face) were Nile River (NR) and Box Thumb (BT) with additional distribution surveys conducted at Nine Mile Beach (NM) and Blue Duck (BD). Note that mussels are not shown on the same scale and vary in maximum size from the largest species on left to smallest on right (see Online Resource 2 for representative mussel sizes). Photo credits: Cascade Sorte, Matthew Bracken, and Piper Wallingford

structuring and, by extension, that this guild may experience alterations under climate change (Kennedy [1976](#page-10-6); Menge et al. [2007;](#page-10-15) Petes et al. [2007\)](#page-11-20). Across the intertidal gradient, *Mytilus* and *Perna* tend to dominate mid- and low intertidal zones, respectively (Kennedy [1976](#page-10-6); Menge et al. [2007](#page-10-15)), with *Aulacomya* typically residing within the mussel bed matrix and *Xenostrobus* occurring high on the shore. These distribution patterns may refect physiological diferences: Kennedy ([1976](#page-10-6)) found that *Mytilus* tolerated higher water temperatures than *Perna* and *Aulacomya*, and Petes et al. [\(2007](#page-11-20)) reported higher survival of *Mytilus* than *Perna* following an intertidal heat wave. However, there have been no comparisons of lethal air temperature tolerances where all species are subject to the same experimental conditions, allowing for parallel comparisons and future projections.

We combined data on species distributions, thermal exposures, and thermal tolerance limits (e.g., Miller et al. [2009;](#page-10-3) Mislan et al. [2014\)](#page-11-14) to predict how climate warming is likely to affect New Zealand's mussel guild and intertidal community (Fig. [2](#page-2-0)). Our specifc questions were: (1) Are species' intertidal distribution patterns related to thermal tolerance limits? (2) What are the warming tolerances of New Zealand mussel species? (3) How are distribution patterns likely to shift under future climate warming? (4) Are range shift projections similar or diferent across multiple species in the foundational guild?

Fig. 2 Conceptual diagram of **a** performance as a function of temperature and **b** intertidal distributions under present and future temperatures. As temperature exceeds tolerance limits, increases in mortality at upper elevation limits would likely lead to downward range contractions. Such shifts could result in changes in community structure and diversity, especially when they occur for foundation species such as the mussels depicted here

Materials and methods

Approach and study locations

We evaluated potential impacts of climate warming on the New Zealand mussel guild using an integrative, ecophysiological approach. Our predictions relied on three data sets: (1) mussel abundance and upper tide-height distribution limits determined by feld surveys, (2) lethal aerial temperature limits based on lab assays, and (3) mussel body temperatures predicted by a biophysical model.

Study locations were rocky shorelines with moderate–high wave exposure (Menge et al. [1999](#page-10-16)). Mussel distribution limit, abundance (cover), thermal environment, and tolerance data were collected at two primary sites on New Zealand's South Island: Nile River (NR; southwest of Westport; 41.90°S, 171.44°E) on the west coast and Box Thumb (BT; located at Godley Head/Taylor's Mistake on the Banks Peninsula; 43.58°S, 172.78°E) on the east coast (Fig. [1](#page-1-0)). We also quantifed mussel cover (described below) at two additional sites: Nine Mile Beach (NM; 42.34°S, 171.26°E) on the west coast and Blue Duck (BD; 42.28°S, 173.75°E) on the east coast. Climatic conditions vary between sites, with cloud cover and precipitation higher on the west coast than east coast (Walter et al. [1975\)](#page-11-21), while wave forces are comparable between coasts (Menge et al. [1999\)](#page-10-16). Thermal conditions can also be strongly infuenced by the timing of the low tides (Helmuth et al. [2002\)](#page-10-17), and Box Thumb experiences more midday low tides than Nile River: during the summer months of 2016 (Jan, Feb and Dec), 27% and 21% of extreme low tides occurred between the hours of 10:00 and 16:00 for our 'warmer' (Box Thumb) and 'cooler' (Nile River) site, respectively (tidal data for Lyttleton and Westport, New Zealand; available at [http://tbone.biol.sc.edu/](http://tbone.biol.sc.edu/tide/) [tide/\)](http://tbone.biol.sc.edu/tide/). Further details of site characteristics are available in previous studies (e.g., Vincent et al. [1991](#page-11-22); Menge et al. [1999;](#page-10-16) Rilov and Schiel [2006;](#page-11-23) Petes et al. [2007](#page-11-20); Callander [2012;](#page-9-12) Bracken et al. [2012;](#page-9-13) Schiel et al. [2016\)](#page-11-24).

Mussel distributions

We quantifed the relative abundance of each mussel species across tide heights in austral summer 2015. Percent cover was visually estimated in $\frac{1}{4} \times \frac{1}{4}$ m quadrats (which is more efective than point-contact approaches at enumerating rare species; Dethier et al. [1993](#page-9-14)) at 0.5-m vertical intervals (using a stadia rod and sight level) in tide height. We surveyed the shoreline from 1.0 m above lowest astronomical tide (based on predictions by [http://tbone](http://tbone.biol.sc.edu/tide/) [.biol.sc.edu/tide/\)](http://tbone.biol.sc.edu/tide/) to the upper edge of the mussel zone (as in Sorte et al. [2017](#page-11-19)). The location of quadrats $(N=3)$ assessed at each tide height was established by frst laying a 30-m transect tape parallel (horizontal) to the water line in an area of contiguous mussel bed. Three vertical transects were then laid perpendicular to the horizontal transect at locations determined using random numbers generated in MS Excel. We also provide percent cover data collected similarly in 2003 as context for the temporal stability of distributions patterns (Online Resource 1).

To assess each species' elevational range limit, we measured the maximum tide height for each mussel species at the NR and BT sites in austral summer 2017. Five vertical transects were established at 5-m intervals (between 5 and 25 m) along a 30-m horizontal transect. Along each vertical transect, we identifed the highest individual of each mussel species that fell within 5 cm of the transect tape, and we used a stadia rod and sight level to survey this maximum tide height in meters in reference to the water level at the time of surveying (tidal data for Christchurch and Westport, New Zealand; available at<http://tbone.biol.sc.edu/tide/>).

Lethal aerial temperature limits

We estimated thermal limits for *Mytilus*, *Aulacomya*, and *Perna* as the temperature lethal to 50% of individuals (LT50) following a 6-h emersed thermal exposure and 18-h immersed recovery period at 17 °C (chosen to represent ambient ocean temperature in the month of March based on 2015 and 2016 satellite data available at [http://](http://www.niwa.co.nz) [www.niwa.co.nz\)](http://www.niwa.co.nz). In March 2017, following summer spawning (Buchanan [2001;](#page-9-15) Petes et al. [2007\)](#page-11-20), mussels were collected haphazardly from the NR and BT sites at the upper vertical limit of each species' tide-height distributions (as these individuals should demonstrate maximum thermal tolerance due to selection and environmental fltering) and were transported in a cooler $(-1 h)$ to the laboratory. To characterize the current maximum thermal tolerance limits of the population, we collected individuals from the upper limits and assessed tolerance immediately upon return from the feld (to avoid any tolerance changes during laboratory acclimation), using survival in ambient temperature controls as our indicator of any handling stress. Thermal tolerance assays were conducted in air in 50-ml centrifuge tubes with holes in the caps to allow for airfow (oxygen consumption rates reported by Marsden and Weatherhead [1998](#page-10-18) indicate that anoxia would be unlikely even in closed chambers). A seawater-soaked, 4 cm^2 chamois was added to each tube to prevent desiccation. Three individuals (*N*=3; 1 individual per tube) of average size for each mussel species (Online Resource 2) were randomly assigned to four aerial temperature treatments that we expected to span the tolerance thresholds of these species based on previous studies (e.g., Kennedy [1976\)](#page-10-6). All species were assayed at air temperatures

of 17 °C (ambient control), 30 °C, 33.5 °C, and 37 °C except that *Mytilus* was not assayed at 30 °C for the NR population, but was also tested at 39 °C (BT only) and 41 °C (NR and BT) based on initial observations of low mortality at 37 °C. For all treatments, temperature in the chambers was increased (using heated water baths) from ambient at a rate of 1 °C every 4–5 min (similar to rapid warming events of, e.g., 11 °C in 30 min, at our NR feld site in 2015; C. Sorte unpubl. data) until the treatment temperature was reached. Experimental temperatures were maintained using an electric cooler (control) and heated water baths (treatments) and were recorded every 10 min. After a total thermal exposure of 6 h (including the temperature ramp), mussels entered an 18-h recovery period in aerated, ambient temperature $(17 \degree C)$ seawater. This assay was designed to simulate heat stress during $a \sim 6$ -h low-tide exposure followed by an 18-h recovery prior to the next daytime low tide (Heath [1985](#page-10-19)). Survival was assessed after the recovery period via inspection for movement or responsiveness to probing, and mussel size was determined using calipers.

For *Mytilus*, *Aulacomya*, and *Perna*, we calculated LT50 for each species \times site combination (i.e., 12–15 total replicates) using individual generalized linear models with binomial error distributions, with mussel survival modeled as a function of aerial temperature. *Xenostrobus* LT50 values were not calculated because low survival in the controls suggested either handling stress, difficulty in confirming initial–or assessing fnal–survival due to mussel size, or a negative response to submerged recovery for this high zone mussel. Models were run using R statistical software v. 3.2.2 (R Core Team [2015](#page-11-25)). Raw data for all four species are provided in Online Resource 2.

Temperatures

We estimated temperatures from the recent past (1997–2009) and projected future (2100) using a biophysical model of mussel body temperature developed by Wethey et al. ([2011](#page-12-2)). This biophysical model predicts temperatures within the mussel bed as a layer (on top of impermeable rock) in a meteorological land surface model (Chen and Dudhia [2001](#page-9-16); Ek et al. [2003](#page-9-17)) which includes tidal (Egbert and Erofeeva [2002](#page-9-18)) and wave data (US Army Corps of Engineers [2002](#page-11-26); Tolman [2009](#page-11-27)). This model has been extensively validated, performing as well or better than similar models in predicting temperatures measured by mussel biomimetic sensors over 4 years and across sites spanning 1700 km along the U.S. West Coast (Wethey et al. [2011](#page-12-2)). Across all six of the sites included in the study by Wethey et al. (2011) (2011) (2011) , the model under-predicted temperatures measured by biomimics, by an average of 1.8 °C. This model has since been applied to predict climate change vulnerability of the California mussel *Mytilus californianus* at its upper elevational range limit across the U.S. west coast (Mislan and Wethey [2011](#page-11-28); Mislan et al. [2014](#page-11-14)). It is possible to use the biophysical model for this study of New Zealand mussels because the physical properties of mussel beds on the U.S. West Coast and New Zealand coast are similar. The longwave emissivity would be the same because the mussel beds are similar in color, and both NZ and U.S. mussel beds are on rocky intertidal benches so the soil type (rock) and tidal inundation are the same (Wethey et al. [2011](#page-12-2)). CFSR (Climate Forecast System Reanalysis), which we used as input data in this study, was one of the types of input weather data verifed in Mislan and Wethey [\(2011\)](#page-11-28) for the U.S. west coast. The three U.S. west coast feld sites evaluated by Mislan and Wethey [\(2011\)](#page-11-28) had diferent errors, ranging from 1.9 to 3.4 °C. The errors for the New Zealand mussel beds would be expected to fall within this range, given similarity in morphological characteristics (color, size structure, and form of aggregation) of mussel beds between the two locations (Fig. [1](#page-1-0); Smith et al. [2006a;](#page-11-29) Mislan and Wethey [2011\)](#page-11-28).

We used this model to calculate the temperature in the middle of a 5-cm-deep mussel bed across tide heights (0.5–2.5 m at 0.1-m intervals) during 30-min time intervals at both sites for the years 1997–2009 ('historical'). The model uses weather data as input to the equations, which simulate the physics of how atmospheric conditions infuence the temperature of mussels in a mussel bed. Input data for the model included downwelling short-wave and longwave radiation, atmospheric pressure at the earth's surface, air temperature and relative humidity at 2 m above the surface, wind speed at 10-m elevation, and precipitation rate from the NOAA Climate Forecast System Reanalysis (Saha et al. [2006](#page-11-30), [2010\)](#page-11-31). Sea surface temperature was from the Naval Research Laboratory Modular Ocean Data Assimilation (MODAS) (Barron and Kara [2006](#page-9-19)). Tides were predicted using the Oregon State University Tidal Inversion Software (OTIS) in conjunction with the Oregon State University Tidal Prediction Software (Egbert et al. [1994](#page-9-20); Egbert and Erofeeva [2002\)](#page-9-18). Wave height and wave period data from global versions of NOAA Wavewatch III models (Tolman [1998](#page-11-32), [2007\)](#page-11-33) were used to calculate wave run-up using equations from the U.S. Army Corps of Engineers Coastal Engineering Manual (Smith [2003](#page-11-34)).

New Zealand mean air temperature at 2 m above sea level is projected to increase by 3 °C by the year 2100 under the RCP 8.5 climate scenario. Projections for New Zealand were calculated using results from fve earth system models in the Coupled Model Intercomparison Project Phase 5 (CMIP5) archive (Online Resource 3; Collins et al. [2011;](#page-9-21) Jones et al. [2011](#page-10-20); Dunne et al. [2012](#page-9-22), [2013](#page-9-23); Taylor et al. [2012](#page-11-35); Dufresne et al. [2013;](#page-9-24) Giorgetta et al. [2013](#page-10-21); Ilyina et al. [2013](#page-10-22)). We projected future mussel temperatures by adding 3 °C to the air temperatures from years 1997 to 2009 in the input data for the mussel model. This approach is conservative in that it does not include predicted increases in temperature variance (e.g., Meehl and Tebaldi [2004](#page-10-23)).

Statistical analyses

We addressed our specifc questions by examining the relationships between tide-height distributions, lethal temperature limits, and mussel body temperatures across species and study sites. We used a two-way ANOVA to assess differences in vertical abundance distributions across mussel species and sites, and a mixed-efects model (with site as a random effect) to test the relationship between upper tideheight limit and LT50 (using the lme4 package; Bates et al. [2015](#page-9-25)), both in R (R Core Team [2015](#page-11-25)). To account for variation in tidal amplitude, which we expect leads to diferences in absolute upper limits between sites, hourly tidal predictions (available at <http://tbone.biol.sc.edu/tide/>) from 2016 were used to convert upper tide-height limits into emersion time (predicted percent of time above the waterline). Normality and homoscedasticity were visually assessed for all models using quantile–quantile plots and box plots of residuals. Emersion time was log-transformed to meet model assumptions. We analyzed diferences between mussel vertical distributions using a Tukey post hoc test.

To assess climate change vulnerability of each mussel species, we integrated the lethal tolerance (LT50) and temperature data (1997–2009 and 2100 projections). We predicted the average frequency (days per year) that LT50s are exceeded (both based on a 6-h period) from 12 years of extrapolated temperature data across tide heights, species, and sites.

Results

Within the New Zealand mussel guild, species inhabited different zones from the water line to upper edge of the intertidal habitat, which were characteristic and largely consistent across four feld sites. At most sites, the dominant species (in terms of space occupancy) switched from *Perna* to *Mytilus* to *Xenostrobus*, with *Aulacomya* present at low abundance up to the mid-intertidal zone (Fig. [3;](#page-5-0) although *Perna* were never dominant at Blue Duck). These patterns of diferential species dominance across tidal elevations were also apparent in surveys conducted in early summer 2003 (Online Resource 1).

Maximum tide height differed across species $(F_{3,32} = 40.04, P < 0.001)$ and sites $(F_{1,32} = 23.57, P < 0.001)$, with a significant interaction between species and site $(F_{3,32}=3.19, P=0.037)$ driven by site differences in *Xenostrobus* distribution (Fig. [4,](#page-6-0) Online Resource 2). Maximum tide height did not difer between the two low intertidal species (Tukey $P = 0.99$), which extended at NR/BT up to

Abundance (percent cover)

Fig. 3 Abundance of mussel species across tidal elevations (m above lowest astronomical tide) at four rocky intertidal sites in New Zealand, including our primary sites **a** Nile River and **b** Box Thumb as well as abundance-only sites **c** Nine Mile Beach and **d** Blue Duck.

Values are percent cover $(\pm 1 \text{ SE})$ based on estimates within $N=3$ quadrats (0.0625 m^2) surveyed in March 2015. Note that the dependent variable (abundance) is on the *x* axis to illustrate the vertical orientation of the independent variable (tide height)

1.3/1.5 m (*Perna*) and 1.5/1.3 m (*Aulacomya*). However, *Mytilus* extended to 1.9 m at both sites, higher than these low intertidal species (Tukey *P*< 0.002), and *Xenostrobus* extended significantly higher than *Mytilus* (Tukey *P*<0.001), to 3.9 m at NR and 2.4 m at BT (Online Resource 2). Mussels extended higher into the intertidal at NR than BT, the cooler and warmer site, respectively (Table [1,](#page-7-0) Figs. [3](#page-5-0), [4](#page-6-0)).

Distribution patterns were related to thermal tolerances. Higher maximum tide heights were associated with species–site pairs with higher LT50 values $(F_{1,27}=19.49)$, $P < 0.001$, marginal $R^2 = 0.37$; Fig. [4](#page-6-0)). Calculated LT50 values for NR and BT populations were, respectively, 31.8 and 33.3 °C for *Perna*, 31.8 and 33.1 °C for *Aulacomya*, and 35.2 and 37.9 °C for *Mytilus* (Online Resource 4).

The predicted frequency with which LT50s were exceeded was remarkably similar between species but differed greatly between sites. At Box Thumb, the LT50 was exceeded by an average of 0.69, 1.46, and 1.38 days annually during the years 1997–2009 at the maximum tide height of *Aulacomya*, *Perna*, and *Mytilus*, respectively (Table [1](#page-7-0)). At the end of the century, our model predicted that LT50 temperatures would be exceeded 3–4.4 times more often at these species' current maximum tide heights (Table [1\)](#page-7-0). At Nile River, our model predicted 0 days with thermal stress exceeding the LT50 of any of these three species at their current maximum tide height, with increases to 1–2 days by the year 2100 only at tide heights beyond these species' present distributions.

Discussion

We provide evidence that temperature is an important driver of distribution limits for species within the New Zealand mussel guild, suggesting that shifts in distributions are likely

Fig. 4 Maximum tide height increases with LT50 (*P*<0.001, log(*y*)~0.09*x*+1.01) across species (*Perna*=triangle, *Aulacomya*=square, *Mytilus*=circle) and sites (NR=grey, BT=black). Upper tide height limit values were surveyed on *N*=5 transects and are presented as the mean percent of time emersed $(\pm \text{SE})$. LT50 values are the temperature lethal to 50% of individuals (Online Resource 4). Dashed lines indicate the 95% confdence interval of the model ft. Site was included as a random efect in the model, and emersion time was log-transformed for analysis and back-transformed for this figure

to occur under climate warming. Specifcally, we found that (1) across species and sites, lethal thermal limits were related to air temperatures experienced at upper tide-height limits, (2) species with higher thermal tolerances occurred higher on the shore, and (3) lethal tolerance limits were higher at the warmer site. These fndings are consistent with the few previous studies of these species' thermal biology (Kennedy [1976](#page-10-6); Petes et al. [2007](#page-11-20); Callander [2012](#page-9-12); Dunphy et al. [2015\)](#page-9-26). Prior experimental studies, however, report tolerance limits from assays where mussels were submerged during thermal exposure (Kennedy [1976;](#page-10-6) Dunphy et al. [2015](#page-9-26)), and physiological responses difer between organisms exposed in water versus air (e.g., Jones et al. [2009;](#page-10-24) Yamane and Gilman [2009](#page-12-3); Seabra et al. [2016](#page-11-17)). At our feld sites, maximum temperatures are encountered during low tide when mussels are exposed to air. Although temperature stress is often thought to limit upper extents of rocky intertidal species (Menge and Branch [2001\)](#page-10-11), this is not always the case. For example, Mislan et al. [\(2014](#page-11-14)) found that lethal temperature and upper elevation limits of the North American species *Mytilus californianus* coincided at only 2 of 15 sites along the U.S. West Coast, suggesting that upper limits are set by factors other than temperature at the remaining sites. Water temperature can limit species distributions in the intertidal, as shown by Seabra et al. ([2016](#page-11-17)) for an Eastern Atlantic limpet. The primary importance of air temperature for setting the upper limit of New Zealand's intertidal mussels is supported by our fndings of a signifcant relationship between tolerance and aerial temperatures. Demonstrating an association between temperature and vertical range limits strengthens our assertions of projected distributional shifts under climate warming (Helmuth et al. [2006](#page-10-0)).

Based on measured lethal thermal limits and projected future temperatures under climate change, *Perna*, *Aulacomya* and *Mytilus* are all likely to experience vertical range contractions by the year 2100 at the Box Thumb site. To maintain an equivalent thermal environment over the next century, these three species would need to shift 0.2–0.4 m lower in the intertidal zone at this and similar sites. However, any shifts at Nile River or other colder sites are predicted to be of lower magnitude because body temperatures in the mussel bed at this site were predicted to elicit less than 50% mortality through the year 2100. It is important to note that the biophysical model simulates mussel bed layers and not individual mussels. Therefore, diferences in the physical size and shape of *Perna*, *Aulacomya* and *Mytilus* as individuals are not accounted for by the model. The future projections of mussel temperatures made using the biophysical model are most relevant for mussels in a bed (which describes the current landscape at these sites; Fig. [1;](#page-1-0) C. Sorte *pers. obs.*) rather than individuals of specifc species. We also note that the model error (estimated at 1.9–3.4 °C for similar U.S. west coast mussels; Mislan and Wethey [2011\)](#page-11-28) is of the same magnitude as predicted warming over the coming century (3 °C). This suggests that our results are most appropriately interpreted in a comparative sense, with future range contractions expected to be relatively similar across three species in the New Zealand mussel guild.

Changes to mussel abundances and distributions could lead to subsequent shifts in overall community structure and diversity. This is because mussels, as foundation species (Bruno and Bertness [2001](#page-9-27); Yakovis et al. [2008](#page-12-4); Angelini et al. [2015\)](#page-9-28), provide structurally heterogeneous habitat for a diverse assemblage of associated organisms, many of which could not persist on bare rock due to stressors such as waves and desiccation (Suchanek [1992;](#page-11-18) Borthagaray and Carranza [2007](#page-9-8)). Research has shown that declines in mussel (*Mytilus californianus*) bed thickness in southern California, USA (Smith et al. [2006a](#page-11-29)) was associated with decreased diversity (Smith et al. [2006b\)](#page-11-36). In New Zealand, where mussel beds are formed by up to four co-occurring species, the impact of mussel declines on diversity at a particular elevation might vary by species because of difering body sizes and, consequently, bed depth. For example, *Perna*-dominated mussel beds at NR and BT are 1.7 times as deep as those dominated by *Mytilus* (~ 35 vs. ~ 21 mm; C. Sorte and M. Bracken, unpubl. data). Although we were not able to evaluate the likelihood of shifts in *Xenostrobus*, the high zone mussel, it provides less habitat area (~6-mm bed depth) than the other three species.

Table 1 Mean number of days per year during which temperature exceeds LT50 $for > 6$ h by tide height (m) across species (*Aulacomya*, *Perna* and *Mytilus*) for two sites (Box Thumb and Nile River)

Days/yr above LT50 0		$0.01 - 1$		$1.01 - 2$	$2.01 - 7$	>7	
	Historical				Future		
	Box Thumb						
Tide Height (m) Aulacomya		Perna	Mytilus		Aulacomya	Perna	Mytilus
2.5	19.62	18.31	1.69		41.00	39.38	7.77
2.4	19.31	18.00	1.62		40.69	38.77	7.46
2.3	19.08	17.77	1.54		39.77	37.69	7.38
2.2	18.62	17.46	1.54		39.23	37.15	7.15
2.1	18.23	16.92	1.46		38.46	36.69	6.85
2.0 1.9	17.38	16.15	1.46 1.38		37.23	35.54	6.85
1.8	16.62 14.77	15.38 13.23	1.08		34.85 30.69	33.62 29.46	6.15 4.69
1.7	11.31	10.23	0.77		24.77	23.77	3.54
1.6	7.38	6.77	0.38		16.31	15.62	2.15
1.5	3.54	3.15	0.15		8.23	7.69	0.69
1.4	1.62	1.46	$\mathbf 0$		4.77	4.46	0.23
1.3	0.69	0.62	$\overline{0}$		2.85	2.69	0.15
1.2	0.46	0.38	$\overline{0}$		1.62	1.46	0
1.1	0.31	0.31	$\overline{0}$		1.08	0.92	$\overline{0}$
1.0	0.23	0.23	$\overline{0}$		0.62	0.54	0
0.9	0.08	0.08	$\overline{0}$		0.08	0.08	$\overline{0}$
0.8	$\mathbf 0$	$\mathbf 0$	$\mathbf{0}$		$\pmb{0}$	$\pmb{0}$	0
0.7	$\mathbf 0$	$\mathbf{0}$	$\overline{0}$		$\mathbf{0}$	$\mathbf{0}$	$\overline{0}$
0.6	$\mathbf 0$	$\overline{0}$	$\mathbf 0$		$\mathbf{0}$	0	0
0.5	$\overline{0}$	$\overline{0}$	$\mathbf{0}$		$\overline{0}$	$\mathbf 0$	$\overline{0}$
	Nile River						
2.5	0.08	0.08	$\mathbf{0}$		2.31	2.31	0
2.4	0.08	0.08	$\overline{0}$		2.00	2.00	$\overline{0}$
2.3	0.08	0.08	$\overline{0}$		1.38	1.38	$\overline{0}$
2.2	0.08	0.08	$\overline{0}$		1.08	1.08	$\overline{0}$
2.1	$\overline{0}$	$\overline{0}$	$\overline{0}$		0.85	0.85	$\overline{0}$
2.0	$\overline{0}$	$\overline{0}$	$\overline{0}$		0.46	0.46	$\overline{0}$
1.9	$\overline{0}$	$\overline{0}$	$\pmb{0}$		0.38	0.38	$\overline{0}$
1.8	$\overline{0}$	$\overline{0}$	$\pmb{0}$		0.23	0.23	$\overline{0}$
1.7	$\mathbf 0$	$\mathbf 0$	$\overline{0}$		0.15	0.15	0
1.6	$\pmb{0}$	$\overline{0}$	$\mathbf 0$		0.15	0.15	0
1.5	$\bf{0}$	$\mathbf 0$	$\overline{0}$		0.08	0.08	0
1.4	$\mathbf 0$	$\mathbf 0$	$\mathbf{0}$		0.08	0.08	$\overline{0}$
1.3	$\overline{0}$	$\bf{0}$	$\overline{0}$		0.08	0.08	0
1.2	$\mathbf 0$	$\mathbf 0$	$\overline{0}$		$\pmb{0}$	$\pmb{0}$	0
1.1	$\mathbf 0$	$\overline{0}$	$\overline{0}$		$\mathbf 0$	$\mathbf 0$	$\overline{0}$
1.0	$\overline{0}$	$\overline{0}$	$\mathbf{0}$		$\mathbf 0$	$\mathbf{0}$	$\overline{0}$
0.9	$\overline{0}$	$\overline{0}$	$\overline{0}$		$\mathbf 0$	$\mathbf{0}$	0
0.8	$\mathbf 0$	$\mathbf{0}$	$\mathbf 0$		$\mathbf 0$	$\mathbf 0$	$\overline{0}$
0.7	$\overline{0}$	$\overline{0}$	$\overline{0}$		$\mathbf 0$	$\mathbf 0$	$\overline{0}$
0.6	$\mathbf 0$	$\mathbf 0$	$\overline{0}$		$\mathbf 0$	$\mathbf 0$	0
0.5	$\mathbf 0$	$\overline{0}$	$\overline{0}$		$\mathbf 0$	$\overline{0}$	$\overline{0}$

Means are based on low tide (emersed) temperatures across 12 years (1997–2009). Historical maximum tide heights are indicated by bold, underlined values. Future estimates incorporate projected warming by the year 2100 as described in ["Materials and methods"](#page-2-1)

Changes in the New Zealand mussel guild could also shift competitive interactions (Angelini et al. [2011](#page-9-29)), biotic resistance to invasions (Kimbro et al. [2013](#page-10-25)), or prey availability (Menge [1972;](#page-10-26) Abrams and Matsuda [1996\)](#page-9-30). Mussels are an important prey species for subtidal predators including fsh and crabs (Rilov and Schiel [2006](#page-11-23)), and there may be cascading efects on these mussel predators and subsequently adjacent communities if population sizes decline. The changes in mussel species distributions forecasted here could also have implications for ecosystem functioning (such as carbon inputs; Bracken et al. [2012](#page-9-13); Bracken [2017\)](#page-9-31) at local scales.

Our projections for the New Zealand mussel guild are based on the results of short-term thermal tolerance assays and predicted increases in mean temperature. Indeed, future changes in mussel distributions will also depend on many factors including altered intra- and interspecifc interactions (e.g., Sanford [1999](#page-11-37); Kordas et al. [2011](#page-10-27); Gilman et al. [2010\)](#page-10-5), the presence of endoliths in mussel shells (as they have shown to buffer mussels from extreme heating events; Zardi et al. [2016](#page-12-5)), and transgenerational plasticity (e.g., Ghalambor et al. [2007](#page-10-28)). Multiple exposures to stressful temperatures can also increase thermal tolerance (Sorte et al. [2011\)](#page-11-6) including via inducible and reversible mechanisms such as up-regulation of stress proteins (Feder and Hofmann [1999\)](#page-10-29). To the degree that our fndings indicate higher thermal tolerances for mussels at the warmer BT site than the cooler NR site, this suggests that these New Zealand mussels may have some capacity to acclimatize or adapt to increased temperature. However, it is unknown if adaptation will keep pace with the current rate of climate warming. Tolerances reported here should be representative of the current maximum thermal limits for these populations. We assayed mussels inhabiting the upper edge of their tideheight distributions (where selection and environmental filtering should maximize proportional abundance of the most tolerant individuals) and at the end of the austral summer (when individuals have survived selection for temperature tolerance and also achieved maximal heat-hardening via phenotypic plasticity). Although local adaptation has been shown for some broadcast spawning species like mussels, it can be limited by dispersal within meta-populations. For example, thermal tolerance comparisons between populations of *Mytilus californianus* inhabiting the U.S. west coast have shown that tolerances difer between Washington and southern California populations (Logan et al. [2012](#page-10-30)) but not those spanning ~ 1000 km of coastline from central California to Oregon (Logan et al. [2012](#page-10-30); Mislan et al. [2014](#page-11-14)). Similarly, thermal tolerances did not difer between *Perna* populations spanning the length of the South Island (Dunphy et al. [2013](#page-9-32)).

While warming impacts could be ameliorated by acclimatization or local adaptation, they could also be exacerbated due to increases in temperature variability and extremes as well as sub-lethal effects of thermal stress. Our warming projections were based on mean predicted changes in global temperature, but extreme heating events (i.e., heat waves) are also predicted to increase in frequency, severity, and duration (Meehl and Tebaldi [2004\)](#page-10-23). Thus, it is likely that mussels will experience days with temperatures above their LT50 more often than we predicted (Table [1](#page-7-0)). Furthermore, shortterm (18-h) recovery periods can miss delayed mortality (Dowd and Somero [2013\)](#page-9-33), and sub-lethal responses to climate warming can also depress demographic rates (Somero [2002](#page-11-11); Williams et al. [2007\)](#page-12-0) with mussels that survive temperature stress exhibiting lower growth rates (Petes et al. [2007\)](#page-11-20) or fecundity (Petes et al. [2007,](#page-11-20) [2008\)](#page-11-38). Over time, these sub-lethal impacts can accrue, leading to shifts in species' abundances and distributions. Under more stressful conditions, individuals tend to be smaller in size due to metabolic trade-ofs (e.g., Petes et al. [2007,](#page-11-20) [2008\)](#page-11-38), which would decrease size-dependent habitat provisioning with potential cascading impacts on local biodiversity.

Our results indicate that aerial temperature sets current upper elevation limits and that vulnerability to climate warming—at least at our warmer site—is likely to increase greatly over the following century. To maintain their current thermal niche, the upper elevation limit of these mussels would need to shift downward, decreasing habitat availability for associated organisms. Facilitation becomes more important as environmental stress increases (He et al. [2013](#page-10-31)); thus, mussel declines may occur when these foundation species are needed the most. At the same time, our results suggest that interactions between multiple species in the New Zealand guild may be maintained, allowing continued functioning albeit at a lower elevation on the shoreline. However, this conclusion is based on the expectation that lower elevations provide refuge from thermal stress, an expectation that may become increasingly unfounded as ocean temperatures warm and metabolic rates increase during tidal immersion. Future research would ideally evaluate the adaptation ability of these species under warming aerial conditions, as well as the potential modifying efects of ocean warming, sea level rise, and topographic bufering of thermal regimes (Helmuth and Hofmann [2001](#page-10-32); Jimenez et al. [2015;](#page-10-33) Jurgens and Gaylord [2018\)](#page-10-13). Our study, and others that integrate ecophysiological and population metrics, have the potential to forecast shifts in species' distributions across community members and the likelihood of cascading extinctions (Borrvall et al. [2000](#page-9-3); Steneck et al. [2002;](#page-11-39) Ellison et al. [2005](#page-9-34); Hughes et al. [2009;](#page-10-34) Wernberg et al. [2016\)](#page-12-6).

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Compliance with ethical standards

Conflict of interest All authors declare that they have no conficts of interest.

Ethical approval All applicable international, national, and/or institutional guidelines for the care and use of animals were followed.

Data availability Data and code for temperature modeling and projected frequency of lethal temperature events are available on GitHub at <https://github.com/kallisons/NZMusselTemperatures>and [https://](https://github.com/njsilbiger/NZMussels) github.com/njsilbiger/NZMussels, respectively. Additional data (mussel abundances, maximum tide heights, and thermal tolerances) are available in Online Resource 2.

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