1 **Differential impacts of temperature increase on prokaryotes across** 2 **temperature regimes in subtropical coastal waters: Insights from field** 3 **experiments** 4 5 Bowei Gu^{1,2+}, Xiao Ma¹, Bingzhang Chen³, Hongbin Liu⁴, Yang Zhang^{1,2}, 6 Xiaomin Xia $1,2.5^*$ 7 ¹ Key Laboratory of Tropical Marine Bio-resources and Ecology, Key 8 Laboratory of Breeding Biotechnology and Sustainable Aquaculture, South 9 China Sea Institute of Oceanology, Chinese Academy of Sciences, 10 Guangzhou, 510000, China 11 ²University of Chinese Academy of Sciences, Beiling, 065001, China 12 ³Department of Mathematics and Statistics, University of Strathclyde, 13 Glasgow, G1, United Kingdom 14 4Department of Ocean Science, The Hong Kong University of Science and 15 Technology, Hong Kong, 999077, China 16 **5** Innovation Research Center for Carbon Neutralization, Fujian Key Laboratory 17 of Marine Carbon Sequestration, Xiamen University, Xiamen, Fujian, 361102, 18 China 19 + Present address: MARUM Center for Marine Environmental Sciences & Max 20 Planck Institute for Marine Microbiology, Bremen, 28359, Germany

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22 ***Correspondence**: Xiaomin Xia; xiaxiaomin@scsio.ac.cn

Abstract

- exposing to extremely high temperatures, genes involved in photosynthesis
- significantly decreased. These findings highlight the differential ecological
- impacts of temperature increase on prokaryotic communities, varying across
- different ambient temperatures and taxa in subtropical coastal waters.

- **Keywords:** Marine heatwaves, subtropical waters, prokaryotes, growth rate,
- grazing pressure, metatranscriptomics.

Introduction

Materials and Methods

 Sampling. Samples were collected during the day in six field sampling trips and three cruises experiments between July 2020 and July 2021. The estuarine sampling sites A1, A3, E3, S10, S15, S19 and S20 were located in

 Short-term warming manipulation experiments. A total of 14 incubation experiments were performed **(Table S1)** and schematic of the experimental design is shown in **Fig. S1b**. One fraction of the seawater samples was not filtered and thus contained grazers of size < 200 μm (hereafter called with grazers group). The other fraction was filtered through 1.2-μm pore size PC membranes (Millipore) and thus contained nearly no grazers (hereafter called without grazers group). Each group was then separated into three 1-L PC

Growth rate of and grazing rate on prokaryotes. We assumed an

exponential growth rate and nearly no grazing in the without grazers group

- since most of the grazers, such as nanoflagellates and ciliates were lager
- than 1.2 μm in nearby seas (Gu et al., 2021). We used the following formula
- to calculate the intrinsic growth rate of prokaryotes including both

- size (parameter estimates from models; see below) of temperature increase
- on growth rate and grazing rate in each experiment, and then assessed
- statistical significance using a chi-squared test (Schulhof et al., 2019).

triplicate with the following thermal cycles: 5 min initial denaturation at 95˚C,

RNA extraction, metatranscriptome sequencing and metatranscriptomic

analysis. For metatranscriptomics, the total RNA of the microbial community

- was extracted using TRIzol reagent (ThermoFisher). RNA samples were
- collected and stored on PC membranes in RNA hold, as described above.
- The RNA hold was removed from the PC membranes by centrifugal, and

Results

363 *Synechococcus* abundances for other samples ranged from 1.53 ± 0.06

- 364 (Jul08) to $79.24 \pm 3.39 \times 10^4$ cells/mL (Aug14) (Table S2).
- 365

366 **Effects of temperature increase on the abundance, growth rate and**

367 **grazing loss of heterotrophic prokaryotic communities across**

- 368 **temperature regimes**. In the ambient temperature incubations (24 h), the
- 369 abundance of heterotrophic prokaryotes varied from 0.98 ± 0.08 to 58.43 \pm
- 370 2.98×10^5 cells/mL, with an average of 24.19 \pm 18.29 \times 10⁵ cells/mL in the
- 371 1.2-um filtered group (Fig. 1a), while they were generally lower in the
- 372 unfiltered group that the abundance varied from 0.58 ± 0.04 to 16.57 \pm 4.84 \times
- 373 10^5 cells/mL, with an average of 13.21 \pm 8.57 \times 10⁵ cells/mL (Fig. 1b). After
- 374 exposure to 3˚C and 6˚C increases, abundances of heterotrophic prokaryotic
- 375 communities were enhanced only when the ambient temperatures were
- 376 ≤25˚C in the filtered group (Fig. 1a), while they were enhanced in all
- 377 temperature regimes in the unfiltered group (Fig. 1b).
- 378
- 379 In the ambient temperature incubations, the growth rate of heterotrophic
- 380 prokaryotes was at its lowest on Jan 12, with a value of 0.08 ± 0.04 d⁻¹. It then
- 381 increased with rising ambient temperatures, peaking on Jul 01 (1.58 \pm 0.09 d
- 382 ¹), and subsequently decreased in these experiments with ambient
- 383 temperatures exceeded 29˚C **(Fig. S2a)**. We found that the responses of

- temperature increase between the heterotrophic prokaryotes and
- *Synechococcus* community in summer experiments which conducted on

transcriptome profiles of prokaryotic community in winter **(Fig. S5)**. In summer

temperature increase **(Fig. 1c)**. However, once temperatures exceeded 28˚C,

heterotrophic prokaryotes and *Synechococcus*, our model predicted that the prokaryotic community would become more autotrophic under moderate warming conditions and more heterotrophic under extreme warming conditions in subtropical summer **(Fig. 3b and 4)**. **Potential mechanisms of decreased prokaryotic growth under thermal stress in summer.** Several covariates are associated with warming, including community structure, thermal acclimation, and nutrient and light levels resulting from stratification. Here we only discuss the potential mechanisms caused by temperature increase. Microorganisms often respond to environmental stresses by diverting cellular resources from biomass synthesis to the restoration of homeostasis (Lopez-Maury et al., 2008). For example, increased lipid metabolism under thermal stress was reported in both prokaryotes (Koga et al., 2012; Hassan et al., 2020) and phytoplankton (Leles and Levine, 2023; Zhang et al., 2022) as a mechanism to mitigate oxidative stress. This is also observed in this study indicated by the significant down- regulation of genes involved in carbohydrate metabolism and concurrent up- regulation of genes involved in lipid metabolism in the +6˚C treatments **(Fig. 5a)**. This transition of resources investment could be one reason for the lower growth rate of heterotrophic prokaryotes under thermal stress.

In contrast, photosynthesis is generally less sensitive to temperature than

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Author Contributions

Bowei Gu: Investigation; field experiments; formal analysis; methodology;

visualization; writing – original draft. **Xiao Ma:** Investigation; field experiments;

writing – review and editing. **Bingzhang Chen:** Writing – review and editing.

Hongbin Liu: Writing – review and editing. **Yang Zhang:** Writing – review and

- editing. **Xiaomin Xia:** Conceptualization; methodology; supervision;
- validation; writing review and editing.
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Conflict of Interest Statement

- The authors declare no conflicts of interest.
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FIGURE LEGEND

Fig. 2. Autotrophic prokaryotes *Synechococcus* **hardly survived under**

- **6˚C experimental warming in summer**. Thermal responses of
- *Synechococcus* abundance at the final point of the filtered incubations (**a**),
- abundance at the final point of the unfiltered incubations (**b**), intrinsic growth
- rate (**c**), and grazing pressure (**d**) in summer. Experimental warming effects
- on *Synechococcus* growth rate (*μSyn*) and grazing pressure (*gSyn*) were
- quantified by generalized linear model (see methods). The asterisks indicate
- significance values (**p* < 0.05, ***p* < 0.01; t-test), and the control temperatures
- 980 (the same as the ambient temperatures, T_{amb}) of each experiment are shown
- in panels.
-

Fig. 3. Different responses to temperature increase between

heterotrophic prokaryotes and *Synechococcus*. (**a**) The comparison of the

- warming effects on growth rates (*μ*) between heterotrophic prokaryotes (HPs)
- and *Synechococcus* (*Syn*) when ambient temperatures (Tamb) were ≥30˚C.
- The asterisks indicate significance values (***p* < 0.01; t-test). (**b**) The
- standardized ratio of heterotrophic prokaryotes and *Synechococcus*
- abundance over ambient temperatures.

 Fig. 4. Thermal preference of different prokaryotes. Ternary plots showed responses of prokaryotic taxa to temperature increase (at family level colored

response to extreme temperature increase in summer. Significant (DESeq2,

1014 pa_{dj} < 0.05) and non-significant (DESeq2, pa_{dj} > 0.05) effects are marked with

1015 solid and hollow dots, respectively.