# iScience



# Article

Water temperature and disease alters bacterial diversity and cultivability from American lobster (*Homarus americanus*) shells



Suzanne L. Ishaq, Sarah M. Turner, Grace Lee, M. Scarlett Tudor, Jean D. MacRae, Heather Hamlin, Deborah Bouchard

sue.ishaq@maine.edu

#### Highlights

Shell bacteria from healthy lobsters, often overlooked, were included in the study

Hotter and colder water temperatures affected shell bacterial communities

Epizootic shell disease (ESD) reduced bacterial diversity on lobster shells

ESD could be induced or exacerbated by the loss of commensal bacteria from shells

Ishaq et al., iScience 26, 106606 May 19, 2023 © 2023 The Author(s). https://doi.org/10.1016/ j.isci.2023.106606



# **iScience**

### Article

# Water temperature and disease alters bacterial diversity and cultivability from American lobster (*Homarus americanus*) shells

Suzanne L. Ishaq,<sup>1,2,9,\*</sup> Sarah M. Turner,<sup>2,3</sup> Grace Lee,<sup>4,5</sup> M. Scarlett Tudor,<sup>2,3</sup> Jean D. MacRae,<sup>6</sup> Heather Hamlin,<sup>2,7</sup> and Deborah Bouchard<sup>2,3,8</sup>

#### **SUMMARY**

The American lobster, *Homarus americanus*, is an economically valuable and ecologically important crustacean along the North Atlantic coast of North America. Populations in southern locations have declined in recent decades due to increasing ocean temperatures and disease, and these circumstances are progressing northward. We monitored 57 adult female lobsters, healthy and shell diseased, under three seasonal temperature cycles for a year, to track shell bacterial communities using culturing and 16S rRNA gene sequencing, progression of epizootic shell disease using visual assessment, and antimicrobial activity of hemolymph. The richness of bacterial taxa present, evenness of abundance, and community similarity between lobsters was affected by water temperature at the time of sampling, water temperature over time based on seasonal temperature regimes, shell disease severity, and molt stage. Several bacteria were prevalent on healthy lobster shells but missing or less abundant on diseased shells, although some bacteria were found on all shells regardless of health status.

#### INTRODUCTION

American lobsters, *Homarus americanus* (family Nephropidae), are bottom-feeding crustaceans found in the cold coastal waters of the northwestern Atlantic Ocean, where they scavenge detritus, or prey on other crustaceans, shellfish, or small fish. Lobsters have a hard carapace. Molting occurs across their entire life, with some animals living upwards of 100 years before their size, disease, or shell deformities makes molting too physically and energetically difficult to survive.<sup>1,2</sup> They are capable of migrating over areas of several miles to find cooler waters or a more hospitable location.<sup>3,4</sup> Their muscular abdomen, unequally sized front claws<sup>5</sup> historically and currently makes them a food staple for local peoples, contribute to local cultural identities, and a highly valued delicacy for locals and tourists.<sup>6,7</sup> Lobster landings represent the most economically important fishery in the northwestern Atlantic Ocean.<sup>8</sup>

While currently the fishery remains viable and healthy in northern New England, lobster populations in southern New England (SNE) collapsed more than a decade ago, with no sign of recovery.<sup>9</sup> Temperatures in SNE appear to have surpassed the lobsters' thermal tolerance, 22°C, not only in highest temperature but also the number of days over 20°C.<sup>9–11</sup> High temperatures and other stressors can result in physiological implications<sup>12</sup> for lobsters' homeostasis and ability to molt or fight infections.<sup>13</sup> Lobster population declines in SNE regions have also been attributed to ocean acidification through carbon dioxide deposition, <sup>14</sup> pollution and anthropogenic disturbance, <sup>15</sup> infectious disease emergence, <sup>16,17</sup> and idiopathic shell disease emergence.<sup>17,18</sup> Since then, population declines have been noted in progressively more-northern fisheries, and there is concern that warmer ocean temperatures that are already pushing lobsters further north to cooler waters<sup>19</sup> may also push infectious disease to new locations.<sup>4,20–22</sup> In particular, the Gulf of Maine is warming faster than predicted,<sup>23</sup> and there is a concern that lobster fisheries could collapse in the way that other species, such as Atlantic cod (*Gadus morhua*), already have from multiple stressors acting synergistically.<sup>24</sup>

Epizootic shell disease (ESD) emerged in the later part of 1996 in SNE and by 2000 was spreading along the Northeastern coast. This new, aggressive form of shell disease was described as a 'severe erosive shell disease affecting the dorsal carapace of *H. americanus*'.<sup>25</sup> ESD is recognized as a significant disease

<sup>1</sup>School of Food and Agriculture, University of Maine, Orono, Maine 04469, USA

<sup>2</sup>Aquaculture Research Institute, University of Maine, Orono, Maine 04469, USA

<sup>3</sup>Cooperative Extension, University of Maine, Orono, Maine 04469, USA

<sup>4</sup>Department of Neuroscience, Bowdoin College, Brunswick, ME 04011, USA

<sup>5</sup>Boston Children's Hospital, Boston, MA 02115, USA

<sup>6</sup>Department of Civil and Environmental Engineering, University of Maine, Orono, Maine 04469, USA

<sup>7</sup>School of Marine Sciences, University of Maine, Orono, Maine 04469, USA

<sup>8</sup>Senior author

<sup>9</sup>Lead contact

\*Correspondence: sue.ishaq@maine.edu

https://doi.org/10.1016/j.isci. 2023.106606





syndrome, including lesions, a shift in bacterial populations on the shell, and associated difficulty in molting. It is described as having a multifactorial and complex etiology with increased temperatures implicated as a contributing factor.<sup>18,26</sup> The histological characteristics of the disease suggested a bacterial etiology, but a causative agent has yet to be determined.<sup>20</sup> Culture-dependent and culture-independent bacterial investigations have been performed on shell-diseased lobsters and shown that the etiology of the disease is complex, likely involving multiple bacterial species in the Alteromonadaceae, Flavobacteriaceae, Pseudomonadaceae, Rhodobacteraceae, and Vibrionaceae families.<sup>27–30</sup> Particular focus has been placed on two microbial genera consistently associated with ESD, *Aquimarina* and *Thalassobius* species,<sup>29,31,32</sup> but the role of these bacteria in disease lesions remain unclear whether they are infectious agents,<sup>33</sup> were commensally present an induced due to pathogenicity,<sup>34</sup> or if they are making use of a niche and contributing to the poly-microbial community which accumulates in lesions.<sup>35</sup> A dysbiotic shift in the shell microbial community resulting from environmental stressors has been suggested.<sup>20,30,35,36</sup>

Past research identified microbial communities on wild caught or laboratory housed lobsters, including one on fine-spatial-scale identification of bacterial communities from a lesion to a healthy portion of shell.<sup>35</sup> Studies have evaluated the same lobsters over time,<sup>1,37</sup> including infection trials,<sup>33</sup> but few have followed changes in microbial communities on the lobsters as they progress from healthy to a more diseased state, because lobsters often recover in aquaria settings. Past research has investigated warming ocean temperatures on disease progression along various temperature gradients along the coast<sup>1,11,38</sup> or in controlled experiments,<sup>39</sup> but few intervention-based studies examine the effect of colder temperatures as well as warmer ones.<sup>37</sup> Previous work<sup>40</sup> and this related study seek to understand how seasonal temperature regimes influence plasma antimicrobial activity and the progression of ESD in adult female American lobsters, in a controlled aquaculture environment.

We hypothesized that hotter temperature regimes would alter shell bacterial communities, exacerbate ESD progression, and reduce metrics of immune health. Previous research has investigated heat stress in lobsters, but none have included groups treated with colder water than that to which they had been acclimated. We monitored 57 adult female lobsters, healthy versus shell diseased, under three regimes mimicking the seasonal temperatures cycles by geographic location: colder water in Northern Maine (NME), warm water in Southern Maine (SME) where lobsters originated from, and hotter waters in Southern New England (SNE). Samples were collected at three timepoints over a year, to track shell bacterial communities using culturing and 16S rRNA gene sequencing, progression of ESD using visual assessment, and antimicrobial activity of hemolymph.

#### RESULTS

# Warmer tank temperature reduced bacterial community richness but increased cultured isolate counts

Bacterial sequence variant (SV) richness on lobster shells (Figure 1A) was highest at the summer baseline timepoint, immediately after lobsters were collected from ocean waters and prior to the implementation of temperature treatments. The high bacterial diversity on shells found at baseline did not persist in tanks over time, reflecting the low biological and chemical diversity in tanks which cannot support complex microbial communities. Across all tanks, richness was lower by an estimated 78 SVs in the winter samples, 4 months after baseline (linear regression model, t = -7.14, p < 0.001), as well as 57 SVs lower in the summer samples, 10 months after baseline (linear regression model, t = -5.13, p < 0.001). Significance was supported in a generalized linear mixed effect model that accounted for lobster as a repeated measure and lobsters nested within tanks.

For lobsters in the NME tanks, maintained at cooler temperatures, shells had 73 fewer bacterial SVs after 4 months (lm, t = -3.75, p < 0.001), and 54 fewer SVs after 10 months (lm, t = -2.86, p < 0.005). Lobsters in the SME tanks, which simulated the temperature where all lobsters originated but is somewhat warmer than their ideal seasonal temperatures, had 100 fewer bacterial SVs on shells after 4 months as compared to baseline (lm, t = -5.22, p < 0.001), and 53 fewer SVs at 10 months as compared to baseline (lm, t = -2.72, p < 0.007). For lobsters in the SNE tanks maintained at higher temperatures, shells had 63 fewer bacterial SVs at 4 months (lm, t = -3.33, p < 0.001), and 65 fewer SVs at 10 months compared to baseline (lm, t = -3.33, p < 0.002). Significance was supported in a generalized linear mixed effect model that accounted for lobster as a repeated measure and lobsters nested within tanks.





#### Figure 1. Sequence variant richness

(A) and Shannon's evenness (B) for lobster shell bacterial communities under three simulated seasonal ocean temperatures over time. Average seasonal ocean temperatures were simulated (i.e., tank temperature denoted by point color) for Northern Maine (ME), Southern Maine, and Southern New England (NE). Point size indicates epizootic shell disease stage.

The evenness of bacterial SV abundance was likewise highest at the summer baseline timepoint, lower in the winter, and increased again at the next summer timepoint (Figure 1B). Low evenness at cold temperatures and high evenness at high temperature may indicate that only certain bacterial species are affected by cold water, but all/most bacterial taxa are affected by warmer water. Evenness of bacterial SV abundance was increased by tank temperature (Im, increase = 0.01, t = 4.16, p < 0.001), and in particular, higher in the SME samples in summer, 10 months post (Im, increase = 0.06, t = 2.03, p = 0.04), and lower in the SNE samples in winter, 4 months post (Im, decrease = -0.06, t = -2.21, p = 0.029).

Over the three sampling timepoints, a total of 145 carapace samples were processed for microbial enumeration and culture. Bacterial richness in sequencing data was not correlated with bacterial colony counts on these two media under aerobic conditions (Figure 8). At the baseline sampling, in summer, the bacterial counts for lobsters from all three systems were combined as the temperatures were all the same (temp =  $12.5^{\circ}$ C). Lobsters showing signs of shell disease were trending toward but did not have significantly more bacteria per cm<sup>2</sup> than non-shell diseased lobsters (t-test:  $t_{48} = -1.989$ ; p = 0.052; Figure 2A). At the first sampling period 4 months later, winter, for healthy and diseased lobsters, there were significantly more bacteria in the high-temperature regimes (SNE) than the low (NME) and mid (SME) temperature regimes (Kruskal-Wallis: non-shell diseased: c<sup>2</sup> = 14.385, df = 2, p = 0.001; shell diseased: c<sup>2</sup> = 7.232, df = 2, p = 0.027; Figure 2B). In the low-temperature regime, the shell-diseased lobsters had significantly more bacteria than the healthy lobsters (Mann-Whitney: low/NME: Z = -2.100, p = 0.036, Figure 2B). There was no difference in bacterial counts between healthy and diseased lobsters in the mid- and high-temperature regime (Mann-Whitney: mid/SME: Z = -0.476, p = 0.634; high/SNE: Z = -0.880, p = 0.379; Figure 2B).

At the second sampling period 10 months after baseline, again in summer, there were significantly more bacteria for both healthy and diseased lobsters. There were significantly more bacteria in the mid- and high-temperature regimes than the low-temperature regimes (Kruskal-Wallis: Healthy:  $c^2 = 13.412$ , df = 2, p = 0.001; Diseased:  $c^2 = 11.498$ , df = 2, p = 0.003; Figure 2C). In the low-temperature regime, there was a trend for the diseased lobsters to have more bacteria than the healthy lobsters (Mann-Whitney: low/NME: Z = -1.890, p = 0.059, Figure 2C). There was no difference in bacterial counts between healthy







**Figure 2. Bacterial counts from lobster shell isolates plated on marine agar plates** (A) Baseline, with all three temperature treatment systems at an average temperature of 12.5°C. (B) Time 1, average system temperatures: Low (NME) = 7.5°C, Mid (SME) = 8.5°C, and High (SNE) = 11.0°C. C; Time 2,

average system temperatures: Low = 10°C, Mid = 15°C, and High = 21.0°C. Error bars indicate standard error.

and diseased lobsters in the mid- and-high temperature regime (Mann-Whitney: mid/SME: Z = -0.867, p = 0.386; high/SNE: Z = -1.757, p = 0.079; Figure 2C).

#### Warmer and cooler tank temperatures drove bacterial community clustering

Bacterial community similarity was calculated using both unweighted Jaccard similarity (uJS) based on presence/absence of bacterial taxa (Figure 3A and Table 1), and weighted Bray-Curtis similarity (wBC), which reflects the presence/absence and relative abundances of bacterial SVs (Figure 3B and Table 1). All lobster shell bacterial communities were distinct from tank water control samples. When considering experimental factors individually, timepoint of sampling was the most important factor driving bacterial community similarity and sample clustering Permutatinal analysis of variance (permANOVA), F = 9.417 uJS, F = 24.566 wBC, Table 1), followed by geographic location/seasonal temperature simulations for the winter and summer timepoints (not baseline; F = 5.018 uJS, F = 11.263 wBC), shell disease index F = 3.405 uJS, F = 11.65 wBC, and shell molting stage (F = 2.615 uJS, F = 5.073 wBC, Table 1). All samples taken









# Figure 3. Principal coordinate analysis (PCoA) of lobster shell bacterial communities under three simulated seasonal ocean temperatures over time, using A) unweighted Jaccard or B) weighted Bray-Curtis distances to calculate community similarity

Tank temperature is indicated by color, ESD stage by point size, timepoint by point shape, and simulated region by ellipses line type. Control samples, consisting of a 15 cm<sup>2</sup> area swabbed from tank surfaces at the second timepoint, are shown in gray. Unweighted Jaccard uses presence/absence of bacterial SV and can be interpreted as a measure of whether taxa membership of the original community has changed. Weighted Bray-Curtis uses presence/absence of bacterial SVs and their relative abundance and can be interpreted as a measure of whether different taxa are present under new conditions or if the original taxa remain but at different levels of abundance.

from baseline clustered together, indicating similar bacterial communities on shells and then clusters separated by geographic locations and the temperature regimes respective to those treatments at subsequent timepoints (Figures 3A and 3B). Within clusters by timepoint and geographic location/seasonal temperature, shell disease index was a strong driver of bacterial community clustering (Table 1). For geographic location, shell disease index and shell molting stage, weighted metrics of bacterial community similarity resulted in higher F-values (Table 1), indicating a stronger effect of bacterial SV abundance in driving clustering than simply which SVs were present.

We used beta dispersion models to assess the tightness/diffuseness of ordination clusters, as a proxy for selective pressure strength of different factors. Samples clustered more tightly together within the 4-month and the 10-month timepoints as compared to baseline (uJS and wBC, anova TukeyHSD p < 0.001) but did not cluster more tightly based on their geographic location (excluding baseline, anova p > 0.05). Samples from shell stage 3 clustered more tightly than those from stage 4 or 5 (uJS and wBC, anova TukeyHSD p < 0.01).

Contrarily, even though there were more cultured isolates in warmer tanks, the diversity of the isolated community was not changed, which may reflect the limited capacity of culture-dependent techniques. The Shannon-Weiner diversity index was calculated for each group of lobsters at each timepoint (Table 2) and indicates that the diversity indices of all groups are similar between healthy versus diseased and between sampling timepoints.

Random forest feature prediction was used to identify bacterial taxa that were contributing to significant differences between microbial communities at different timepoints by temperature treatment (Figure 4). Certain taxa were absent from baseline and abundant on all shell samples at later timepoints regardless of treatment, including several SVs in the Flavobacteriaceae family. These were likely enriched in the tank aquaculture environment and not related to treatments. Others such as SVs in the Rhodobacteraceae family, were likewise absent at baseline but appeared at later timepoints in SME and SNE treatments, implicating temperature as enriching for those.

#### Shell bacterial diversity was not affected by weight or growth

While in tanks for the year, 61% of the healthy lobsters and 59% of the diseased lobsters molted (Table 3). There was a significant increase in weight for healthy and diseased lobsters across the baseline and last sampling periods (healthy lobsters: paired t-test:  $t_{24} = -6.086$ , p < 0.001; shell-diseased lobsters: paired t-test:  $t_{16} = -4.328$ , p = 0.001) indicating lobster growth during the study duration. Non-shell diseased lobsters grew on average 13.9% of their original body weight (range = -9 to 30%) and shell-diseased lobsters grew on average 10.2% of the original body weight (range = -11 to 22%). Shell length was associated with slightly lower bacterial richness (-2 SVs, Im t = -2.566, p = 0.0113), although this effect is likely conflated with the trend of reduced bacterial diversity over time in the tanks during the experimental treatments. Bacterial richness was not affected (linear regression, p > 0.05) by lobster weight.

Shell molt stage progression was associated with higher bacterial richness (Figures 5 and S1), but we posit that this is conflated with the high richness at baseline when lobsters were pulled from warm ocean waters in the summer and were nearing their first molt. The postmolt stages (A, B, C1/C2), when the carapace is soft and beginning to harden, exhibited the smallest increases in bacterial richness compared to stage A; stage B, +38 SVs (Im, t = 2.070, p = 0.040); stage C1/C2, not significant (p > 0.050). The intermolt stages (stages C3/C4), in which the shell is hardened and supports well-defined layers, exhibited much more bacterial richness compared to stage A; stage C3/C4, +61 SVs (Im, t = 3.374, p < 0.001). The greatest increase compared to Stage A was seen in the premolt stage (D) +114 SVs (Im, t = 6.613, p < 0.001), when a new carapace begins forming underneath and before molting occurs. Random forest models could not predict molt stage from bacterial community features with more than 57% accuracy (data not shown).





Log abundance 0 2 4 6

## Figure 4. Relative abundance of bacterial taxa which were identified as important members of the lobster shell community associated with tank temperatures that simulate three geographic locations off the coast of New England

Taxa that were significantly important (p < 0.05) to the community structure with respect to tank temperature were identified using a permutational random forest algorithm. Log abundance is shown in the color scale, and columns are individual lobster shell samples. Columns are paneled by geographic location and timepoint, which reflects respective seasonal temperatures simulated in the tank. Baseline: temperature of 12.5°C on average for all three systems. Winter, 4 months: average system temperatures were Northern ME = 7.5°C, Southern ME = 8.5°C, and Southern NE = 11.0°C. Time 2: average system temperatures were Northern ME = 15°C, and Southern NE = 21.0°C. Model accuracy was 79%, and the top 40 of the 207 significant bacterial SVs are shown.

# Shell bacteria and tank temperature were correlated with ESD progression but not antimicrobial activity of plasma

Shell disease index scores indicated the percentage of the lobster shell covered by visible disease symptoms.<sup>25</sup> Scores for the entire cohort were higher at baseline than after 4 months in tanks undergoing temperature treatments, -0.60 (linear model, t = -4.337, p value <0.001), or after 10 months, -0.55 (lm, t = -3.861, p value <0.001). This may reflect that most lobsters that molted showed a reduction in disease severity score or already had no signs of disease, some lobsters with disease molted and died shortly after, and only a few lobsters with shell disease had static or worsening symptoms (Table 3). Shell disease index was not affected by tank water temperature (lm, p value >0.5). Shell disease index was 1 rank higher in lobsters in the premolt stage (lm, t = 4.946, p value <0.001).

We examined the antimicrobial activity of the plasma based on two contrasting protocols,<sup>41,42</sup> to determine if ESD lobsters displayed reduced resistance to bacterial growth *in vitro*. At baseline, despite the higher severity indices of shell disease, there was no *Escherichia coli* D31 growth inhibition from any







Figure 5. Bacterial richness (SVs) on lobster shells by Shell Disease Index (SDI) under three simulated seasonal ocean temperatures over time

samples and therefore no differences between the antimicrobial activity of plasma collected from healthy and diseased lobsters at 12.5°C (ANOVA:  $F_{2,47} = 1.428$ , p = 0.25). At 4 months in tanks, at the winter sampling, again there was no demonstrated *E. coli* D31 growth inhibition and the antimicrobial activity of plasma from healthy lobsters was not affected by temperature at 7.5°C, 8.5°C, or 11.0°C (ANOVA:  $F_{3,23} = 1.56$ , p = 0.23). There was also no *E. coli* D31 growth inhibition or altered plasma antimicrobial activity observed in diseased lobsters held at 7.5°C, 8.5°C, or 11.0°C (ANOVA:  $F_{3,18} = 1.083$ , p = 0.468). When comparing the antimicrobial activity of plasma collected from pooled healthy and diseased lobsters across temperatures 7.5°C, 8.5°C, and 11.0°C, there were no differences (ANOVA:  $F_{2,44} = 1.261$ , p = 0.29). After 10 months in tanks, in the summer sampling, the antimicrobial activity of plasma from healthy lobsters was not affected by temperature at 10.0°C, 15°C, or 21°C (ANOVA:  $F_{3,23} = 0.0612$ , p = 0.98). Antimicrobial activity of plasma from diseased lobsters was also unaffected by temperature at 10.0°C, 15°C, and 21°C (ANOVA:  $F_{3,16} = 0.897$ , p = 0.46). When comparing the pooled antimicrobial activity of plasma collected from healthy and diseased lobsters across temperatures 10.0°C, 15°C, and 21°C there were no differences (ANOVA:  $F_{2,42} = 0.0582$ , p = 0.94).

Shell disease index was associated with significantly increased bacterial community richness on shells compared to apparently healthy shells and was somewhat progressive by severity (Figures 1A and 5): shells with an index score of 1 had 58 SVs more than apparently healthy (lm, t = 4.697, p < 0.001); index 2 had 98 more SVs (lm, t = 4.399, p < 0.001); and index 3 had 84 more SVs than apparently healthy lobsters (lm, t = 43.528, p < 0.001). Shell disease also appears to increase the evenness of bacterial SVs



Α



Prevalence 0.00 0.25 0.50 0.75 1.00 в Rhodobacteraceae Flavobacteriaceae Flavobacteriaceae Arenicella Robiginitomaculum Saprospiraceae Sulfitobacter Rhodobacteraceae Rubritalea Arenicella Nitrosomonas Porticoccus Saprospiraceae Hyphomonadaceae Blastopirellula Aquimarina Marinicella Yoonia-Loktanella Hyphomonadaceae Blastopirellula Robiginitomaculum Porticoccus Nannocystaceae Colwellia Sedimentitalea Nitrosomonas Sulfitobacter Nitrosomonadaceae Rubritalea Yoonia-Loktanella Blastocatella Kiloniella Rubidimonas Ulvibacter Lewinella Microtrichaceae Sedimentitalea Portibacter Hellea Subgroup\_10 Portibacter Portibačter Planctomicrobium Pseudohongiella Roseibacillus Halioglobus OM27 clade Fabibacter Planktotalea Litorimonas Sohingorhabdus Microtrichaceae Nannocystaceae 80% of lobster shells with ESD Sandaracinaceae Colwellia OM27\_clade Blastocatella Litorimonas Sphingorhabdus Pirellulaceae Sva0996\_marine\_group Ilumatobacter DEV007 Vicingus Haliangium Spongiibacterageae C1-B045 Marinicella Nitrosomonadaceae Ulvibacter Peredibacter Haliangium Spongibacteraceae Methyloligellaceae Micavibrionaceae Nitrospira NS11-12\_marine\_group Cocleimonas Fulvivirga Anderseniella Cocleimonas Litorimonas Lewinella **Bacterial SVs shared by** Fabibacter Woeseia Pseudohongiella Acanthopleuribacter Sandaracinaceae Kordia Aliikangiella Dokdonia Vicingus Aliikangiella Maribacter Sphingorhabdus Maribacter Rubidimonas Gimesiaceae Polaribacter AB1 Rubrivirga Halieaceae Winogradskyella Cryomorpha Peredibacter Aurantivirga Aquimarina Polaribacter Spongiibacteraceae Micavibrionaceae Cryomorphaceae Halioglobus Aurantivirga Pirellula Lutibacter Ketobacter NS11-12\_marine\_group Dokdonia Pseudoalteromonas Nitrospira Pirellulaceae Bacteriovoracaceae Paraglaciecola Octadecabacter Halieaceae Rubinisphaeraceae Pelagibius Rubinisphaeraceae Gimesiaceae Magnetospiraceae Bdellovibrio Nannocystis Bdellovibrio Nitrincolaceae Opitutaceae Eel-36e1D6 Crocinitomix Cryomorphaceae Sphingomonadaceae Ekhidna Bythopirellula Edaphobaculum Planctomicrobium Pseudoalteromonas Rubrivirga Sandaracinus Bdellovibrio AB1  $0\% \ \ 0.1\% \ 0.3\% \ 0.7\% \ 1.6\% \ 3.7\% \ 8.6\% \ 20\%$ 

Detection Threshold (Relative Abundance (%))

0% 0.1% 0.3% 0.7% 1.6% 3.7% 8.6% Detection Threshold (Relative Abundance (%))

Bacterial SVs shared by 80% of healthy lobster shells





#### Figure 6. Core shell carapace bacterial SVs

Shared by 80% of lobsters which are A) healthy (no visible disease signs) or B) epizootic shell diseased. Prevalence of bacterial SVs across 0–100% of lobster shells is shown in color, and SVs are ordered by the most to least prevalent, based on percent relative abundance thresholds.

(0-1 scale; Figure 1B); at index level 1 (Im, increase = 0.08, t = 4.58, p < 0.001), level 2 (Im, increase = 0.09, t = 2.91, p = 0.004), and level 3 (Im, increase = 0.09, t = 2.72, p = 0.007).

ESD is associated with altered bacterial community total richness, as well as the membership of that community. However, when assessing the core community shared by 80% of lobsters with either apparently healthy (Figure 6A) or diseased shells (Figure 6B), it is apparent that many of the same core bacteria and putative agents are present on shells regardless of health status. When comparing the bacterial communities in lobsters at baseline, the time when the largest number of lobsters displayed the greatest spread of disease symptom progression, there were several bacterial species which were significantly correlated with disease progression (Figure 7). They included multiple SVs in the genera Aquimarina, Kiloniella, Arenicella, and in the families Flavobacteriaceae and Rhodobacteraceae, which were more prevalent and more abundant in lobsters with more advanced disease states (Figure 7). The model explained 44% of the variation in lobster shell bacteria at baseline.

#### Tank temperature was not associated with mortality but some bacteria were

Of the 57 lobsters at the beginning of the experiment, 15 died (Table 3 and Figure 8, dotted lines): 1 from NME healthy group, 2 from NME diseased group, 1 from SME healthy group, 5 from SME diseased group, 2 from SNE healthy group, and 4 from SNE diseased group. A Pearson chi-square contingency analysis was used to determine the relationship between shell disease and the likelihood of mortality (JMP v13). Lobsters with shell disease were more likely to die (p = 0.043) than apparently non-shell diseased lobsters.

Bacterial richness on shells (number of SVs) does not appear associated with mortality events (Figure 8), and while there were sequences from bacterial species of interest (reported elsewhere as possible causative agents) found on ESD shells (Figure S2), there was not a correlation between mortality and extinguishing potentially pathogenic genera on shells (Figure S3). Lobsters with ESD or which died did not appear to have bacteria communities on their shells which were more similar to the bacterial communities found in tank water control samples (data not shown). This might have implied a loss of host-associated bacteria; however, this could not be thoroughly assessed as there were only single-timepoint samples for tank water community controls.

Yet, these bacterial species of interest may play a role in the mortality rate of lobsters, rather than discerning between a healthy and diseased state. Important bacterial members for defining the community state on shells were identified in a subset of samples which included only those shells with visible signs of disease (Disease Index 1–3). In this subset of 39 samples, lobsters that died during the experiment (Table 3) were compared to those that didn't, revealing different abundances of bacteria of interest. These are visualized by mortality and by shell disease index for only those lobsters with visible disease signs in Figure 9, a model with 74% accuracy that identified 49 bacterial taxa which were significantly different by groups.

Using two types of media, trypticase soy agar with 5% sheep red blood cells +1.5% NaCl (BA), and a marine sea salt agar plate (MA), 725 isolates were identified from lobster shells and 10 from tanks by phenotypic identification and/or 16S rRNA gene sequencing. The purpose of this work was to determine the microbial "stability" as in changes to community profile over time and temperature. For review, Biolog Microbial Identification System (BMIS) provides identification by means of phenotypic/biochemical characteristics. BMIS results range in probability of identification and can provide high probability to the species level while some results provide a genus with moderate to low probability of species and others to genus only. There were 4 phyla, 20 families, and 36 genera of bacteria identified (Table S1), inclusive of the genera most frequently associated with ESD (and which have in previous literature been speculated to be possible causative agents) such as Aquimarina, Flavobacterium, Polaribacter, Sulfitobacter, Pseudoalteromonas. We did not isolate Thalassobius species, a putative agent for ESD.

The five predominant isolates from two media types were grown from lobster shells at the three sampling timepoints, yielding 725 bacterial isolates (Figure 10): 100 from the 15 lobsters that died during the study









# Figure 7. Relative abundance of bacterial taxa which were identified as important members of the lobster shell community associated with ESD in fresh-caught lobsters off the coast of New England

Significantly important (p < 0.05) taxa were identified using a permutational random forest algorithm, performed on a data subset consisting only of the fresh-caught, baseline lobster shell samples prior to temperature treatments. Log relative abundance is shown in the color scale, and columns are individual lobster shell samples. Columns are paneled by the SDI ranking: 0, no observable disease; 1, disease on 1–10% of the shell; 2, disease on 11–50% of the shell; and 3, disease on >50% of the shell. The model explained 44% of the variation in lobster shell bacteria at baseline.

(Table 3) and 625 from the 42 lobsters that did not die. Of the 100 isolates from lobsters that died, 48% were oxidase positive (n = 48), 17% were catalase positive (n = 17), 63% were gram negative rods (n = 63), 3% were gram negative cocci (n = 3), 15% were gram positive rods (n = 15), and 4% were gram positive cocci (n = 4). Of the 625 isolates from lobsters that survived, 58% were oxidase positive (n = 363), 8.8% were catalase positive (n = 55), 70% were gram negative rods (n = 441), 3% were gram negative cocci (n = 21), 12.8% were gram positive rods (n = 80), and 2.7% were gram positive cocci (n = 17).

Visual comparisons on isolates that were found on healthy and diseased lobsters showed no obvious differences, in that most isolates were found on both populations, however, there were some differences in lobsters which died during the experiment (Figure 10), as compared to those which survived, by geographic location (Figures S4, S5 and S6). There was some agreement between the identity of cultured isolates and what was found in the bacterial community sequencing data, including *Aquimarina, Sulfitobacter, Colwellia*, and others (Figure S7).

#### DISCUSSION

Our goals were to 1) determine the effect of temperature on ESD progression, mortality, and immune health; 2) assess the stability of the lobster shells' microbial community over time and temperature, and 3) identify correlations between temperature, lobster health, cultured bacteria from shells, and whole bacterial communities on shells. This study obtained 57 female lobsters from coastal waters off SME and maintained them in tanks for nearly a year with three geographical temperature profiles simulating seasonal water temperatures of the location lobsters were sourced from, a warmer location, or a colder location.



# Figure 8. Bacterial richness (SVs) in relation to the number of bacterial colony forming units (CFUs) isolated from lobster shells on marine media over time

Shape denotes SDI, size of points denotes CFUs per centimeter squared on general Marine Media, color denotes the tank temperature at the time of sampling. Sampling date is along the x axis; solid lines denote when a lobster molted and dashed lines denote when a lobster died. Vertical panels represent each experimental tank and the geographic region its seasonal temperatures were modeled after. Shell-diseased lobsters at the start of the experiment were groups in tanks 2, 3, and 6.

While 16S rRNA amplicon sequencing provides only a static view of the microbial community and lacks functional genomic data, data over multiple timepoints can provide broad overviews of changes to bacterial presence and abundance.

In all groups, bacterial community diversity was significantly reduced after baseline. It is not surprising that going from biodiverse ocean waters to environmentally static aquaria would reduce bacterial communities on lobster shells, regardless of water temperature or shell disease status. For example, tropical marine water lost bacterial diversity over time when stored in a ballast tank,<sup>43</sup> and aquacultured tank systems typically have lower microbial diversity than seawater because microorganisms are filtered or killed to prevent disease and parasite load in animals. Marine animals acquire many of their associating microorganisms from their environments,<sup>20,44,45</sup> and even with a diverse shell microbiota at baseline it was expected that all lobsters would lose some bacterial diversity over time without a complex environment from which to replenish microorganisms.



Table 1. Permutational analysis of variance (permANOVA) comparisons for individual and interacting factors on the similarity of bacterial communities on lobster shells

		Unweighted community similarity, Jaccard		Weighted community similarity, Bray-Curtis	
Factor	Degrees of freedom	F-value	p value	F-value	p value
Timepoint	2	9.417	0.001	24.566	0.001
Location (not including baseline timepoint)	2	5.018	0.009	11.263	0.003
Shell Disease Index	1	3.405	0.001	11.650	0.001
Shell (molting) stage	1	2.615	0.001	5.673	0.001
Timepoint x Location	4	2.443	0.001	4.285	0.001
Timepoint x Shell Disease Index	2	1.566	0.004	2.823	0.002
Timepoint x Shell Stage	2	1.256	0.008	1.952	0.044
Location x Shell Stage	2	1.168	0.014	1.722	0.013
Lobster was used a repeated measure using adj	usted code for assigning permuta	tions (nperm = 999)			

#### Temperature in tanks was not solely responsible for ESD symptoms or mortality

We observed minimal increase in ESD progression over the 11 months, similar to other studies observing lobsters in aquaria.<sup>46</sup> During the course of our study, 61% of the healthy lobsters and 59% of the diseased lobsters molted, and lobsters may recover from ESD if they survive molting.<sup>46</sup> Temperature, food availability, and reproductive status can impact the timing of molt, which can alter lobsters' susceptibility to bacteria or the environment, as discussed previously.<sup>20</sup> In this study, the diseased lobsters that molted and re-developed signs of shell disease were in the mid and high range temperature groups. In a study on bacteria in several anatomical locations of mud crabs (*Scylla paramamosain*), bacterial communities across body sites varied by molt stage/day more than location, and certain bacteria re-colonized quickly after molting.<sup>47</sup> We lacked the sampling resolution to track shell bacteria over the course of a full molt, but in a tank system lacking in biodiversity with bacteria sourced only from lobsters, food, and possibly the facility (e.g. bacteria in the air), it is likely that similar communities would resemble after molting.

There was a significant weight gain for all lobster groups with no significant difference between non-shell diseased and shell-diseased lobsters over the course of the study. This was different from Stevens (2009) who suggested slower growth rates due to ESD. Low mortality was observed in healthy lobsters in all temperature regimes, and lobsters with shell disease were more likely to die than healthy lobsters. In the SME temperature regime, there was a trend for the ESD lobsters to have higher mortality than non-shell diseased, and if our study had higher numbers of animals per treatment group, this trend might have been better defined.

Table 2. Shannon-Weiner diversity indices of cultured isolates calculated for each group of lobsters at different temperature regimes, timepoints, and health status

	Shell Disease Status	Baseline, summer	Timepoint 1, 4 months post, winter	Timepoint 2, 10 months post, summer
Low Temp, NME	Non-Disease	2.12	1.86	2.37
	Disease	2.46	1.97	2.26
Mid Temp, SME	Non-Disease	1.90	1.39	2.66
	Disease	2.16	2.10	1.81
High Temp, SNE	Non-Disease	2.32	1.90	1.65
	Disease	2.18	1.87	2.96

Baseline with all three temperature treatment systems at an average temperature of  $12.5^{\circ}$ C. B; Time 1, average system temperatures: Low (NME) =  $7.5^{\circ}$ C, Mid (SME) =  $8.5^{\circ}$ C, and High (SNE) =  $11.0^{\circ}$ C. C; Time 2, average system temperatures: Low =  $10^{\circ}$ C, Mid =  $15^{\circ}$ C, and High =  $21.0^{\circ}$ C.

		SDI baseline,		SDI,		SDI,
Temperature Regime	Lobster ID	Jul 20, 2016	Molt or died	Dec 1, 2016	Molt or died	Jun 7, 2017
Molt and SDI resolved, su	rvived					
NME	6827	1	Molt Aug 23	0	N/A	0
	6877	1	Molt Sep 7	0	N/A	0
	6882	1	Molt Aug 9	0	N/A	0
	6889	1	Molt Aug 23	0	N/A	0
SME	6767	1	Molt Sep 10	0	N/A	0
	6770	2	Molt Jul 7	0	N/A	0
	6874	3	Molt Jul 27	1	N/A	1
SNE	6761	1	Molt Aug 21	0	N/A	0
	6762	3	Molt Aug 23	0	N/A	0
	6764	3	Molt Jul 24	1	N/A	0
	6765	2	Molt Aug 11	0	N/A	0
Volt and no change in SD	l status, survived					
VME	6811	0	Molt Aug 24	0	N/a	0
	6812	0	Molt Jul 24	0	N/a	0
	6813	0	Molt Sep 16	0	N/a	0
	6818	0	Molt Aug 17	0	N/a	0
	6822	0	Molt Jul 29	0	N/a	0
	6828	0	Molt Aug 6	0	N/a	0
	6883	0	Molt Sep 9	0	N/a	0
SME	6823	0	Molt Jul 26	0	N/a	0
	6845	0	Molt Aug 1	0	N/a	0
	6847	0	Molt Jul 24	0	N/a	0
	6849	0	Molt Aug 23	0	N/a	0
SNE	6831	0	Molt Jul 25	0	N/a	0
	6832	0	Molt Jul 9	0	N/a	0
	6834	0	Molt Jul 21	0	N/a	0
	6835	0	Molt Aua 1	0	Molt Apr 11	0
	6837	0	Molt Aua 17	0	N/A	0
	6840	0	Molt Jul 18	0	N/A	0
And resolved then re	accurred survived					
SME	6768	2	Molt Aug 9	0	N/A	1
Molt and SDI warrangel	r moltod and dis -	-		Ŭ		
		1	Molt Son 5			NI/A
NIVIL	0000	I	Died Oct 10	N/A	IN/A	
SME	6766	0	Molt Jul 18	1	N/A	1
	6769	2	Molt Aug 27 Died Sep 9	N/A	N/A	N/A
	6824	0	Molt Jul 10	0	Died Jun 5	N/A
	6826	0	Molt Jul 7	0	Died May 23	N/A
	6871	1	Molt Aug 26 Died Sep 12	N/A	N/A	N/A
	6875	2	Molt Sept 11	N/A	N/A	N/A

(Continued on next page)

**iScience** 

Article

CellPress

OPEN ACCESS

# iScience

Article

Table 3. Continued						
		SDI baseline,		SDI,		SDI,
Temperature Regime	Lobster ID	Jul 20, 2016	Molt or died	Dec 1, 2016	Molt or died	Jun 7, 2017
SNE	6763	1	N/A	2	Died Apr 18	N/A
	6825	2	Molt Jul 28 Died Jul 30	N/A	N/A	N/A
	6838	0	Molt Jul 17 Died Aug 20	N/A	N/A	N/A
	6839	0	Molt Aug 20 Died Sep 4	N/A	N/A	N/A
	6872	3	Molt Jul 27	0	Died Apr 26	N/A
Died without molting						
NME	6820	0	Died Oct 21	N/A	N/A	N/A
	6876	3	Died Jul 25	N/A	N/A	N/A
SME	6844	0	N/A	0	N/A	0, died later that day
	6873	1	Died Sep 16	N/A	N/A	N/A

We examined the antimicrobial activity of the plasma based on previous literature.<sup>41,42</sup> Crustacean immunology is extremely complex and consists essentially of a very robust innate immune response only. The innate immune response in lobsters is a function of response to stress or microbial insult and can be exhausted quickly and needs time to reset as in producing more hemocytes because they've been exhausted at a point of insult (i.e., a wound). Our focus was to measure the antimicrobial activity of the plasma including what would be from lyzed hemocytes or degranulation from hemocytes as a function of response, in our case to disease and temperature. However, we saw no bacterial growth inhibition in any of the samples, healthy or diseased, or at any timepoints through seasonal temperatures, so we concluded that the antimicrobial activity of the plasma was not affected by temperature.

Noga et al. used a turbidimetric assay to determine that antibacterial activity of plasma was higher in healthy compared to shell-diseased blue crabs, Callinectes sapidus, and that there were differences based on populations at various geographical sites. Homerding et al. used this assay but did not identify a difference in the antibacterial activity of plasma from H. americanus lobsters with and without ESD, although the study did find a difference based on geographic locations of the lobsters. Our study results did not demonstrate significant bacterial growth inhibition; thus, no measurable antibacterial activity was seen in any of the lobster hemolymph over any of the timepoints when evaluating a particular group. This is similar to previous research which found external signs of disease but no internal signs.<sup>48</sup> There was high inter-individual variability at each timepoint, but the overall population results indicated no antibacterial response. The lack of antimicrobial activity in our study may indicate that in a controlled laboratory environment the stress factor of temperature alone did not result in a measurable plasma antibacterial immune response. In regard to the study by Homerding et al. 2012, there may have been other environmental stressors contributing to plasma response. Of note, Noga et al., used serum (coagulated hemolymph with clot removed) and our procedure followed Homerding et al. and used plasma (centrifuged hemolymph prior to clotting to remove hemocytes). The innate immune response of decapod crustaceans has integrated cellular and humoral components, both cellular and plasma responses work in coordination.<sup>49</sup>

The procedure of immediately separating the hemocytes from the plasma may have reduced or eliminated antimicrobial proteins secreted from hemocytes during the clotting process. Investigating the serum antimicrobial activity may have provided measurable responses. The best use of this assay may have been to challenge the lobster with a stressor from each group and then determine the response of lobsters by sampling hemolymph and performing the assay and determining if shell-diseased lobsters or temperatures played a role in response; however, it would not have been feasible for our study.

#### Temperature altered bacterial communities on shells

Microbial isolate enumeration and identification for each lobster shell was performed 3 times approximately 3 months apart reflecting seasonal temperatures of summer, winter, and peak summer for each







# Figure 9. Abundance of bacterial taxa which were identified as important members of the lobster shell community associated with lobsters which had visible shell disease and which died or not

Log abundance is shown in the color scale, and columns are individual lobster shell samples for lobsters with visible disease signs only. Columns are paneled by mortality (yes/no) and the SDI ranking: 1, disease on 1–10% of the shell; 2, disease on 11–50% of the shell; and 3, disease on >50% of the shell. Only lobsters with visible shell disease were used in the model. The top 40 of 49 total statistically significant (p < 0.05) SVs are shown, as designated by permutational random forest analysis. Model accuracy was 74%.

regional area described. The same anatomical location was swabbed on each lobster. For clarity, swabbing was not targeted specifically at diseased areas on lobsters with signs consistent with ESD but rather the same anatomical site on the lobster, non-shell disease or diseased. The use of two media types and aerobic conditions restricts the breadth of taxa we could cultivate, and competition between bacteria during initial plating could further limit the growth of isolates. However, total counts may provide useful information for low-cost surveillance sampling.

Baseline bacterial enumeration indicated that the bacterial loads on shell-diseased lobsters were significantly higher than on healthy lobsters. As seasonal temperature cycles progressed, the bacterial counts at the 4 month post winter sampling, and the 10 month post summer sampling, were significantly higher in the high (SNE) temperature range, whether healthy or ESD, over counts from lobsters held at the mid (SME) and low (SNE) temperature ranges. However, in the high (SNE) and mid (SME) range there was no difference in bacterial load on healthy versus ESD animals. This may reflect that warmer water is general selective pressure acting against most bacteria present, as warming decreases bacterial diversity in the marine environment<sup>50</sup> and organisms.<sup>51,52</sup> In the low (NME) temperature system significantly higher bacterial loads were still observed on the diseased versus healthy lobsters, which may reflect that colder water is a





**Figure 10.** Comparison of bacteria isolated from shells of lobsters which survived or died during the experiment Bacterial isolates were identified using 16S rRNA sequencing and NCBI GenBank sequence reference database. Columns are paneled by mortality (yes/no) and the SDI ranking: 0, no observable disease; 1, disease on 1–10% of the shell; 2, disease on 11–50% of the shell; and 3, disease on >50% of the shell. GenBank match of "n/a" indicates isolate could not be identified at any the genus level of taxonomy.

specific selective pressure affecting some of the bacteria present. It may also reflect that bacteria conditioned to warmer temperatures are faster growing and simply performed better in the lab.

#### Certain bacteria were associated with healthy or ESD status

We compared the frequency of identified microorganisms associated with ESD and compared the frequency of isolation over time and temperature on apparently healthy and diseased lobsters. Using a combination of BMIS phenotypic identification and 16S rRNA gene Sanger sequencing, we isolated and identified organisms from the Aquimarina, Chryseobacterium, Empedobacter, Flavobacterium, Polaribacter, Pseudoalteromonas, Roseomonas, Roseovarius, Sulfitobacter, and Vibrio genera which have all been reported as associated with ESD.<sup>27–30</sup> Aquimarina and Thalassabius are frequently examined as pathogens, although more recently have been considered as opportunistic commensals already living on lobster shells.<sup>34</sup> We routinely isolated Aquimarina and found them in the bacterial community sequencing



data, but we did not identify *Thalassobius* in culture or in sequencing. We did, however, identify closely related genera from the Rhodobacteraceae family. There were no distinct patterns of frequency of isolation, the isolates most associated with ESD were isolated from both healthy and diseased lobsters present in all temperature groups at all sampling timepoints, and the Shannon-Weiner diversity indices for cultured isolates were similar for all groups. Our study results are similar to a study that examined the bacterial species in the cuticles of European lobsters (*Homarus gammarus*) and American lobsters sharing the same aquarium systems.<sup>53</sup>

There were several bacterial taxa from the sequencing data that were associated with ESD progression or absence in this study, which have been identified in previous studies, e.g., <sup>30,35,53</sup> which noted that many of these taxa were present in healthy and visibly diseased lobsters in different amounts. In our samples, Aquimarina, which has long been implicated as a commensal-turned-pathogen in ESD, <sup>32,33</sup> increased in abundance in lobsters with lesions >11% of the shell (Index levels 2 and 3). We identified *Rubritalea* in the bacterial community data as abundant in healthy lobsters and reduced in those with ESD. We isolated *Gordonia* only from lobsters without shell disease and which did not die, which agrees with other findings in which *Gordonia* was only present on red rock lobsters (*Jasus edwardsi*) without tail fin necrosis. <sup>54</sup> *Rubritalea*<sup>55,56</sup> and *Gordonia*<sup>54,57</sup> species have been identified in marine systems and associated commensals on the shells of marine animals where they produce carotenoids, which might act as antimicrobials, although we did not examine this possibility. Carotenoids in lobster shells are typically sourced from plankton and other dietary components, but it is possible that microbially produced carotenoids on the surface of shells are serving to drive shell communities. Epizootic shell-diseased lobsters are known to have less carotenoid content in their shells, including areas with or without lesions.<sup>58</sup>

#### ESD could reflect the loss of a mutualist microorganism

There is a previously published hypothesis<sup>34</sup> that ESD is not caused by the addition of an infectious agent, so much as a state of dysbiosis. We examined our results under this concept and whether the loss of a commensal which triggers unrestrained growth in the rest of the shell community. For example, evenness increased between bacterial SV abundance on diseased shells, implying that a keystone microorganism might be lost from lobster shells in the process of transitioning from a healthy to a diseased state, and without this keystone species the other bacteria present are able to thrive. This is similar to microbial ecological patterns in the other host ecosystems with keystone species, such as the human vagina when the loss of a *Lactobacillus* sp. allows for increased bacterial diversity which alters the function of the community and can lead to disease states, e.g.,.<sup>59</sup>

Specific symbiotic bacteria have been identified as critical to marine animals, for example to protect shrimp larvae from fungal infections, <sup>60</sup> provide nutrition and secondary molecules for defense in isopods, <sup>61</sup> or to form the intricate connections between sponges and their microbiota.<sup>62</sup> In deep sea squat lobsters, *Munidopsis alvisca*, bacteria and archaea on the shells of lobsters living near hydrothermal vents helped process potentially detrimental chemicals and may support the health of shells.<sup>63</sup> While many of the bacteria in that study were novel and could not be identified, there were some found by Leinberger et al. that were also isolated in this study. These were isolates from the genera *Formosa* and *Pasteurella* from the shells of apparently healthy lobsters which survived the experiment.

Culture-dependent and independent analyses are each subject to benefits and technological limitations, and even though the datasets could not be combined, their pairing allowed us deeper insight than either independently. For example, *Gordonia* were culturable but not dominant in the sequencing data and otherwise might have been overlooked. Conversely, *Rubritalea* was sequenced but not culturable under these conditions. The insight gained by the community analysis can be used to broaden culturing efforts to select for potential commensals or pathogens, which could then be used for whole-genome or transcriptomic analysis to assess activities, as well as in infection or rescue/probiotic trials with lobsters.

#### Limitations of the study

The tank design and aquarium system limit the microbial diversity in tank water, which cannot accurately mimic the diversity and variability of ocean microbiomes, thus all microbial diversity on lobsters is reduced over time. Lobsters notoriously recover from ESD in tank systems, likely due to the lack of multiple and realistic stressors, making it difficult to ascertain the environmental conditions or microbial affiliations which exacerbate ESD symptoms. Further, because climate change has already been affecting microorganisms,





hosts, and ecosystems, it is difficult to determine if the bacterial community found on healthy lobster shells represents their typical associated community. Culturing protocols can never be broad enough to isolate all bacterial diversity from samples, but by selecting the top five most predominant organisms observed by culture, we were able to determine frequency of isolation but not the quantity of each species isolated. Further, the use of only two culture media and aerobic conditions restricts the breadth of taxa we could cultivate. Bacterial sequencing can only provide a static representation of dynamic microbial communities. Finally, we used amplicon sequencing analysis of total bacterial DNA fractions, which included DNA from living active/inactive and from dead/relic cells, thus we are unable to comment on the functionality of the bacterial community found.

#### **STAR**\***METHODS**

Detailed methods are provided in the online version of this paper and include the following:

- KEY RESOURCES TABLE
- RESOURCE AVAILABILITY
  - O Lead contact
  - Materials availability
  - Data and code availability
- EXPERIMENTAL MODEL AND SUBJECT DETAILS
  - O System design and function
  - O Lobsters
- METHOD DETAILS
  - Molt stage evaluation
  - Shell disease evaluation
  - O Hemolymph sampling and plasma antimicrobial assay
  - O Carapace sampling for microbial analyses
  - O Microbial enumeration and culture
  - DNA extraction
  - O Culture identification using whole 16S rRNA sequencing
  - O Bacterial community library preparation for 16S rRNA amplicon sequencing
- QUANTIFICATION AND STATISTICAL ANALYSIS
  - $\bigcirc$  Growth and weight analysis
  - Antimicrobial assay analysis
  - Cultured isolate analysis
  - O Bacterial community library analysis for 16S rRNA amplicon sequencing data

#### SUPPLEMENTAL INFORMATION

Supplemental information can be found online at https://doi.org/10.1016/j.isci.2023.106606.

#### ACKNOWLEDGMENTS

We are grateful for the previous efforts of those who enabled us to conduct lobster research which led to the development of these concepts. This includes the State of Maine Department of Marine Resources, Maine Lobster Research Education and Development (RED) board, University of Maine Aquatic Animal Health Laboratory Staff, Emily Thomas and Dawna Beane, as well as University of Maine undergraduate students Laurel Anderson, Emily Tarr, and Helen Reese. Funding Statement: S.L.I., G.L., and this project were partially supported by the University of Maine: Maine Agricultural and Forest Experiment Station (MAFES) USDA National Institute of Food and Agriculture, Hatch Project Number ME0-22102 (Ishaq).

#### **AUTHOR CONTRIBUTIONS**

Conceptualization, H.H., D.B.; Methodology, D.B.; Software, S.L.I., G.L.; Formal Analysis, S.L.I., G.L., M.S.T., S.M.T., D.B.; Investigation, H.H., D.B.; Resources, D.B.; Data Curation, S.L.I., S.M.T., D.B.; Writing - Original Draft, S.L.I., G.L., S.M.T., D.B.; Writing - Review and Editing; S.L.I., G.L., S.M.T., M.S.T., J.D.M., H.H., D.B.; Visualization, S.L.I., G.L., D.B.; Supervision, S.L.I., H.H., D.B.; Project Administration, D.B.; Funding Acquisition, D.B.



#### **DECLARATION OF INTERESTS**

The authors declare no competing interests.

Received: November 16, 2022 Revised: February 15, 2023 Accepted: March 31, 2023 Published: April 8, 2023

#### REFERENCES

- Groner, M.L., Shields, J.D., Landers, D.F., Swenarton, J., and Hoenig, J.M. (2018). Rising temperatures, molting phenology, and epizootic shell disease in the American lobster. Am. Nat. 192, E163–E177. https:// doi.org/10.1086/699478.
- Bowser, P.R., and Rosemark, R. (1981). Mortalities of cultured lobsters, *Homarus*, associated with a molt death syndrome. Aquaculture 23, 11–18. https://doi.org/10. 1016/0044-8486(81)90003-X.
- Campbell, A. (1986). Migratory movements of ovigerous lobsters, Homarus americanus, tagged off Grand Manan, eastern Canada. Can. J. Fish. Aquat. Sci. 43, 2197–2205. https://doi.org/10.1139/f86-269.
- 4. Watson, W. (2005). Can lobster movements contribute to the spread of shell disease? In State of Lobster Science: Lobster shell disease- assessing research priorities for understanding how lobster biology and health issues impact productivity. Aquatic Forum Series 05–1, M.F. Tlusty, H.O. Halvorson, R.M. Smolowitz, and U. Sharma, eds. (New England Aquarium), pp. 98–100.
- Aiken, D.E. (1980). Molting and growth. In The Biology and Management of Lobsters, J.S. Cobb and B.F. Phillips, eds. (Academic Press), pp. 91–163.
- Steneck, R.S., Hughes, T.P., Cinner, J.E., Adger, W.N., Arnold, S.N., Berkes, F., Boudreau, S.A., Brown, K., Folke, C., Gunderson, L., et al. (2011). Creation of a gilded trap by the high economic value of the Maine lobster fishery. Conserv. Biol. 25, 904–912. https://doi.org/10.1111/j.1523-1739.2011.01717.x.
- Daniel, H., Allen, T., Bragg, L., Teisl, M., Bayer, R., and Billings, C. (2008). Valuing lobster for Maine coastal tourism: methodological considerations. J. Foodservice 19, 133–138. https://doi.org/ 10.1111/j.1745-4506.2008.00091.x.
- Maine Department of Marine Resources (2021). Commercial Fishing Historical Landings Data (Department of Marine Resources). https://www.maine.gov/dmr/ commercial-fishing/landings/historicaldata.html.
- Wahle, R.A., Dellinger, L., Olszewski, S., and Jekielek, P. (2015). American lobster nurseries of southern New England receding in the face of climate change. ICES J. Mar. Sci. 72, i69–i78. https://doi.org/10.1093/icesjms/ fsv093.

- Pinsky, M.L., and Fogarty, M. (2012). Lagged social-ecological responses to climate and range shifts in fisheries. Climatic Change 115, 883–891. https://doi.org/10.1007/s10584-012-0599-x.
- Glenn, R.P., and Pugh, T.L. (2006). Epizootic shell disease in American lobster (*Homarus americanus*) in Massachusetts coastal waters: interactions of temperature, maturity, and intermolt duration. J. Crustac Biol. 26, 639–645. https://doi.org/10.1651/S-2754.1.
- Lorenzon, S., Giulianini, P.G., Martinis, M., and Ferrero, E.A. (2007). Stress effect of different temperatures and air exposure during transport on physiological profiles in the American lobster *Homarus americanus*. Comp. Biochem. Physiol. Mol. Integr. Physiol. 147, 94–102. https://doi.org/10.1016/j.cbpa. 2006.11.028.
- Dove, A.D.M., Allam, B., Powers, J.J., and Sokolowski, M.S. (2005). A prolonged thermal stress experiment on the American lobster, *Homarus Americanus*. J. Shellfish Res. 24, 761–765. https://doi.org/10.2983/0730-8000.
- Niemisto, M., Fields, D.M., Clark, K.F., Waller, J.D., Greenwood, S.J., and Wahle, R.A. (2021). American lobster postlarvae alter gene regulation in response to ocean warming and acidification. Ecol. Evol. 11, 806–819. https://doi.org/10.1002/ece3.7083.
- Goodman, A.J., McIntyre, J., Smith, A., Fulton, L., Walker, T.R., and Brown, C.J. (2021). Retrieval of abandoned, lost, and discarded fishing gear in Southwest Nova Scotia, Canada: preliminary environmental and economic impacts to the commercial lobster industry. Mar. Pollut. Bull. 171, 112766. https://doi.org/10.1016/j.marpolbul. 2021.112766.
- Harrington, A.M., Harrington, R.J., Bouchard, D.A., and Hamlin, H.J. (2020). The synergistic effects of elevated temperature and CO2induced ocean acidification reduce cardiac performance and increase disease susceptibility in subadult, female American lobsters *Homarus americanus* H. Milne Edwards, 1837 (Decapoda: Astacidea: Nephropidae) from the Gulf of Maine. J. Crustac Biol. 40, 634–646. https://doi.org/ 10.1093/jcbiol/ruaa041.
- Cawthorn, R.J. (2011). Diseases of American lobsters (Homarus americanus): a review.
  J. Invertebr. Pathol. 106, 71–78. https://doi. org/10.1016/j.jip.2010.09.010.
- Shields, J.D., Wheeler, K.N., and Moss, J.A. (2012). Histological assessment of the lobster (Homarus americanus) in the "100 lobsters"

project. J. Shellfish Res. 31, 439–447. https://doi.org/10.2983/035.031.0204.

- Greenhalgh, E. (2016). Climate & Lobsters (NOAA Climate.gov). https://www.climate. gov/news-features/climate-and/climatelobsters.
- Ishaq, S.L., Turner, S.M., Tudor, M.S., MacRae, J.D., Hamlin, H., Kilchenmann, J., Lee, G., and Bouchard, D. (2022). Many questions remain unanswered about the role of microbial transmission in epizootic shell disease in American lobsters (*Homarus americanus*). Front. Microbiol. 13, 824950. https://doi.org/10.3389/fmicb.2022.824950.
- Reardon, K.M., Wilson, C.J., Gillevet, P.M., Sikaroodi, M., and Shields, J.D. (2018). Increasing prevalence of epizootic shell disease in American lobster from the nearshore Gulf of Maine. Bull. Mar. Sci. 94, 903–921. https://doi.org/10.5343/bms. 2017.1144.
- Shields, J.D. (2019). Climate change enhances disease processes in crustaceans: case studies in lobsters, crabs, and shrimps. J. Crustac Biol. 1791. https://doi.org/10.1093/ jcbiol/ruz072.
- Poppick, L. (2018). Why is the Gulf of Maine warming faster than 99% of the ocean? Eos 99. https://doi.org/10.1029/2018eo109467.
- Pershing, A.J., Alexander, M.A., Hernandez, C.M., Kerr, L.A., Le Bris, A., Mills, K.E., Nye, J.A., Record, N.R., Scannell, H.A., Scott, J.D., et al. (2015). Slow adaptation in the face of rapid warming leads to collapse of the Gulf of Maine cod fishery. Science 350, 809–812. https://doi.org/10.1126/science.aac9819.
- Smolowitz, R., Chistoserdov, A.Y., and Hsu, A. (2005). A description of the pathology of epizootic shell disease in the American lobster, *Homarus americanus*, h. Milne Edwards 1837. J. Shellfish Res. 24, 749–756. https://doi.org/10.2983/0730-8000.
- Castro, K.M., Cobb, J.S., Gomez-Chiarri, M., and Tlusty, M. (2012). Epizootic shell disease in American lobsters *Homarus americanus* in southern New England: past, present and future. Dis. Aquat. Organ. 100, 149–158. https://doi.org/10.3354/dao02507.
- 27. Chistoserdov, A.Y., Gubbala, S.L., Smolowitz, R.M., Mirazol, F., and Hsu, A. (2005). A microbiological assessment of epizootic shell disease in the American lobster indicates its strictly dermal etiology. In State of Lobster Science: Lobster shell disease- assessing research priorities for understanding how lobster biology and health issues impact

productivity. Aquatic Forum Series 05–1, M.F. Tlusty, H.O. Halvorson, R.M. Smolowitz, and U. Sharma, eds. (New England Aquarium), pp. 12–20.

- Bell, S.L., Allam, B., McElroy, A., Dove, A., and Taylor, G.T. (2012). Investigation of epizootic shell disease in American lobsters (*Homarus americanus*) from Long Island Sound: I. Characterization of associated microbial communities. J. Shellfish Res. 31, 473–484. https://doi.org/10.2983/035.031.0207.
- Chistoserdov, A.Y., Quinn, R.A., Gubbala, S.L., and Smolowitz, R. (2012). Bacterial communities associated with lesions of shell disease in the American lobster, *Homarus americanus* milne-edwards. J. Shellfish Res. 31, 449–462. https://doi.org/10.2983/035. 031.0205.
- Meres, N.J., Ajuzie, C.C., Sikaroodi, M., Vemulapalli, M., Shields, J.D., and Gillevet, P.M. (2012). Dysbiosis in epizootic shell disease of the American lobster (*Homarus americanus*). J. Shellfish Res. 31, 463–472. https://doi.org/10.2983/035.031.0206.
- Quinn, R.A., Smolowitz, R., and Chistoserdov, A.Y. (2013). Culture-independent analysis of bacterial communities in hemolymph of American lobsters with epizootic shell disease. Dis. Aquat. Organ. 103, 141–148. https://doi.org/10.3354/dao02565.
- Quinn, R.A., Hazra, S., Smolowitz, R., and Chistoserdov, A.Y. (2017). Real-time PCR assay for Aquimarina macrocephali subsp. homaria and its distribution in shell disease lesions of Homarus americanus, Milne-Edwards, 1837, and environmental samples. J. Microbiol. Methods 139, 61–67. https://doi. org/10.1016/j.mimet.2017.04.001.
- Quinn, R.A., Metzler, A., Smolowitz, R.M., Tlusty, M., and Chistoserdov, A.Y. (2012). Exposures of *Homarus americanus* shell to three bacteria isolated from naturally occurring epizotic shell disease lesions. J. Shellfish Res. 31, 485–493. https://doi.org/ 10.2983/035.031.0208.
- Meres, N.J. (2016). Surface biofilm interactions in epizootic shell disease of the American lobster (*Homarus americanus*). In Microbial Biofilms, D. Dhanasekaran and N. Thajuddin, eds.. https://doi.org/10.5772/ 63498.
- Feinman, S.G., Unzueta Martínez, A., Bowen, J.L., and Tlusty, M.F. (2017). Fine-scale transition to lower bacterial diversity and altered community composition precedes shell disease in laboratory-reared juvenile American lobster. Dis. Aquat. Organ. 124, 41–54. https://doi.org/10.3354/dao03111.
- Tlusty, M.F., Smolowitz, R.M., Halvorson, H.O., and DeVito, S.E. (2007). Host susceptibility hypothesis for shell disease in American lobsters. J. Aquat. Anim. Health 19, 215–225. https://doi.org/10.1577/H06-014.1.
- Barris, B.N., Shields, J.D., Small, H.J., Huchin-Mian, J.P., O'Leary, P., Shawver, J.V., Glenn, R.P., and Pugh, T.L. (2018). Laboratory studies on the effect of temperature on epizootic shell disease in the American lobster, *Homarus americanus*. Bull. Mar. Sci. 94,

887–902. https://doi.org/10.5343/bms. 2017.1148.

- Tanaka, K.R., Belknap, S.L., Homola, J.J., and Chen, Y. (2017). A statistical model for monitoring shell disease in inshore lobster fisheries: a case study in Long Island Sound. PLoS One 12, e0172123. https://doi.org/10. 1371/journal.pone.0172123.
- Tlusty, M.F., and Metzler, A. (2012). Relationship between temperature and shell disease in laboratory populations of juvenile American lobsters (*Homarus americanus*). J. Shellfish Res. 31, 533–541. https://doi.org/ 10.2983/035.031.0213.
- 40. Bouchard, D.A. (2018). Investigating Present-Day Health Issues of the American Lobster (Homarus americanus).
- Noga, E.J., Kerby, J.H., King, W., Aucoin, D.P., and Giesbrecht, F. (1994). Quantitative comparison of the stress response of striped bass (Morone saxatilis) and hybrid striped bass (Morone saxatilis x Morone chrysops and Morone saxatilis x Morone americana). Am. J. Vet. Res. 55, 405–409.
- Homerding, M., Mcelroy, A., Taylor, G., Dove, A., and Allam, B. (2012). Investigation of epizootic shell disease in American lobsters (*Homarus americanus*) from long island sound: II. Immune parameters in lobsters and relationships to the disease. J. Shellfish Res. 31, 495–504. https://doi.org/10.2983/035. 031.0209.
- Ng, C., Le, T.-H., Goh, S.G., Liang, L., Kim, Y., Rose, J.B., and Yew-Hoong, K.G. (2015). A comparison of microbial water quality and diversity for ballast and tropical harbor waters. PLoS One 10, e0143123. https://doi. org/10.1371/journal.pone.0143123.
- 44. Sousa, R., Vasconcelos, J., Vera-Escalona, I., Delgado, J., Freitas, M., González, J.A., and Riera, R. (2021). Major ocean currents may shape the microbiome of the topshell *Phorcus sauciatus* in the NE Atlantic Ocean. Sci. Rep. 11, 12480. https://doi.org/10.1038/ s41598-021-91448-0.
- Boscaro, V., Holt, C.C., Van Steenkiste, N.W.L., Herranz, M., Irwin, N.A.T., Àlvarez-Campos, P., Grzelak, K., Holovachov, O., Kerbl, A., Mathur, V., et al. (2022). Microbiomes of microscopic marine invertebrates do not reveal signatures of phylosymbiosis. Nat. Microbiol. 7, 810–819. https://doi.org/10.1038/s41564-022-01125-9.
- Stevens, B.G. (2009). Effects of epizootic shell disease in American lobster Homarus americanus determined using a quantitative disease index. Dis. Aquat. Organ. 88, 25–34. https://doi.org/10.3354/dao02135.
- 47. Zhang, M., Zhang, X., Tran, N.T., Sun, Z., Zhang, X., Ye, H., Zhang, Y., Ma, H., Aweya, J.J., and Li, S. (2021). Molting alters the microbiome, immune response, and digestive enzyme activity in mud crab (*Scylla paramamosain*). mSystems 6, e0091721. https://doi.org/10.1128/mSystems.00917-21.
- Kunkel, J.G., Jercinovic, M.J., Callaham, D.A., Smolowitz, R., and Tlusty, M. (2005). Electron microprobe measurement of mineralization

of American lobster, Homarus americanus, cuticle: proof of concept. In Lobster Shell Disease Workshop. Aquatic Forum Series Aquatic Forum Series, M. Tlusty, ed. (New England Aquarium), pp. 76–82.

- Hauton, C. (2012). The scope of the crustacean immune system for disease control. J. Invertebr. Pathol. 110, 251–260. https://doi.org/10.1016/j.jip.2012.03.005.
- Traving, S.J., Kellogg, C.T.E., Ross, T., McLaughlin, R., Kieft, B., Ho, G.Y., Peña, A., Krzywinski, M., Robert, M., and Hallam, S.J. (2021). Prokaryotic responses to a warm temperature anomaly in northeast subarctic Pacific waters. Commun. Biol. 4, 1217. https:// doi.org/10.1038/s42003-021-02731-9.
- Li, Y.-F., Yang, N., Liang, X., Yoshida, A., Osatomi, K., Power, D., Batista, F.M., and Yang, J.-L. (2018). Elevated seawater temperatures decrease microbial diversity in the gut of Mytilus coruscus. Front. Physiol. 9, 839. https://doi.org/10.3389/fphys.2018. 00839.
- Minich, J.J., Morris, M.M., Brown, M., Doane, M., Edwards, M.S., Michael, T.P., and Dinsdale, E.A. (2018). Elevated temperature drives kelp microbiome dysbiosis, while elevated carbon dioxide induces water microbiome disruption. PLoS One 13, e0192772. https://doi.org/10.1371/journal. pone.0192772.
- Whitten, M.M.A., Davies, C.E., Kim, A., Tlusty, M., Wootton, E.C., Chistoserdov, A., and Rowley, A.F. (2014). Cuticles of European and American lobsters harbor diverse bacterial species and differ in disease susceptibility. Microbiologyopen 3, 395–409. https://doi. org/10.1002/mbo3.174.
- 54. Pande, A., Brosnahan, C., Jones, B., Ross, A., Phiri, B., Pal, C., and Bestbier, M. (2021). Tail Fan Necrosis in New Zealand Red Rock Lobster, Jasus edwardsii (Ministry for Primary Industries).
- Yoon, J., Matsuda, S., Adachi, K., Kasai, H., and Yokota, A. (2011). *Rubritalea halochordaticola* sp. nov., a carotenoidproducing verrucomicrobial species isolated from a marine chordate. Int. J. Syst. Evol. Microbiol. *61*, 1515–1520. https://doi.org/10. 1099/iis.0.025031-0.
- Song, J., Lim, Y., Joung, Y., Cho, J.-C., and Kogure, K. (2018). *Rubritalea profundi*, sp. nov., isolated from deep-seawater and emended description of the genus *Rubritalea* in the phylum Verrucomicrobia. Int. J. Syst. Evol. Microbiol. *68*, 1384–1389. https://doi. org/10.1099/ijsem.0.002686.
- 57. Silva, T.P., Paixão, S.M., Fernandes, A.S., Roseiro, J.C., and Alves, L. (2022). New insights on carotenoid production by *Gordonia alkanivorans* strain 1B. In Carotenoids - New Perspectives and Application, R.M. Martínez-Espinosa, ed. (InTech Open).
- 58. Prince, D.L., and Bayer, R.C. (2005). Are all lobsters created equal? Understanding the role of host susceptibility in the development of shell disease in Homarus americanus. In State of lobster science: shell disease





workshop. Aquatic Forum Series 05-1, M. Tlusty, H. Halvorson, R. Smolowitz, and U. Sharma, eds. (The New England Aquarium), pp. 58–67.

- Jašarević, E., Howerton, C.L., Howard, C.D., and Bale, T.L. (2015). Alterations in the vaginal microbiome by maternal stress are associated with metabolic reprogramming of the offspring gut and brain. Endocrinology 156, 3265–3276. https://doi.org/10.1210/en. 2015-1177.
- Gil-Turnes, M.S., Hay, M.E., and Fenical, W. (1989). Symbiotic marine bacteria chemically defend crustacean embryos from a pathogenic fungus. Science 246, 116–118. https://doi.org/10.1126/science.2781297.
- Lindquist, N., Barber, P.H., and Weisz, J.B. (2005). Episymbiotic microbes as food and defence for marine isopods: unique symbioses in a hostile environment. Proc. Biol. Sci. 272, 1209–1216. https://doi.org/10. 1098/rspb.2005.3082.
- 62. Pita, L., Rix, L., Slaby, B.M., Franke, A., and Hentschel, U. (2018). The sponge holobiont in a changing ocean: from microbes to ecosystems. Microbiome 6, 46. https://doi. org/10.1186/s40168-018-0428-1.
- Leinberger, J., Milke, F., Christodoulou, M., Poehlein, A., Caraveo-Patiño, J., Teske, A., and Brinkhoff, T. (2022). Microbial epibiotic community of the deep-sea galatheid squat lobster *Munidopsis alvisca*. Sci. Rep. 12, 2675. https://doi.org/10.1038/s41598-022-06666-x.
- Monner, D.A., Jonsson, S., and Boman, H.G. (1971). Ampicillin-resistant mutants of *Escherichia coli* K-12 with lipopolysaccharide alterations affecting mating ability and susceptibility to sex-specific bacteriophages. J. Bacteriol. 107, 420–432. https://doi.org/10. 1128/jb.107.2.420-432.1971.
- Cold Spring Harbor Laboratory Press (2012). Artificial seawater. Cold Spring Harbor Protocols. https://doi.org/10.1101/pdb. rec068270.

- Nadkarni, M.A., Martin, F.E., Jacques, N.A., and Hunter, N. (2002). Determination of bacterial load by real-time PCR using a broad-range (universal) probe and primers set. Microbiology 148, 257–266. https://doi. org/10.1099/00221287-148-1-257.
- 67. RCoreTeam. (2022). R: A Language and Environment for Statistical Computing (R Foundation for Statistical Computing).
- Callahan, B.J., McMurdie, P.J., Rosen, M.J., Han, A.W., Johnson, A.J.A., and Holmes, S.P. (2016). DADA2: high-resolution sample inference from Illumina amplicon data. Nat. Methods 13, 581–583. https://doi.org/10. 1038/nmeth.3869.
- McMurdie, P.J., and Holmes, S. (2013). Phyloseq: an R package for reproducible interactive analysis and graphics of microbiome census data. PLoS One 8, e61217. https://doi.org/10.1371/journal. pone.0061217.
- 70. Ishaq, S.L. (2017). Phyloseq\_dealing\_with\_neg\_controls\_ Ishaq\_example.R (Github).
- Oksanen, J., Guillaume Blanchet, F., Friendly, M., Kindt, R., Legendre, P., McGlinn, D., Minchin, P.R., O'Hara, R.B., Simpson, G.L., Solymos, P., et al. (2020). Vegan: Community Ecology Package.
- 72. Wickham, H. (2016). ggplot2: Elegant Graphics for Data Analysis (Springer Publishing Company).
- Dotmatics (2022). Prism. GraphPad. https:// www.graphpad.com/scientific-software/ prism/.
- 74. IBM (2021). IBM SPSS Statistics 24 (SPSS). https://www.ibm.com/support/pages/ downloading-ibm-spss-statistics-24.
- Pruesse, E., Quast, C., Knittel, K., Fuchs, B.M., Ludwig, W., Peplies, J., and Glöckner, F.O. (2007). SILVA: a comprehensive online resource for quality checked and aligned ribosomal RNA sequence data compatible

with ARB. Nucleic Acids Res. 35, 7188–7196. https://doi.org/10.1093/nar/gkm864.

iScience

Article

- NOAA (2022). NOAA Climate Data Record (National Centers for Environmental Information). https://www.ncei.noaa.gov/.
- 77. Maine Department of Marine Resources (2006). DMR Ventless Trap Survey (Maine Department of Marine Resources). https:// www.maine.gov/dmr/science/speciesinformation/maine-lobster/lobster/lifestages-and-dmr-surveys/ventless-trap-survey.
- Basti, D., Bricknell, I., Chang, E.S., and Bouchard, D. (2010). Biochemical reference intervals for the resting state in the adult lobster *Homarus americanus*. J. Shellfish Res. 29, 1013–1019. https://doi.org/10.2983/035. 029.0402.
- Caporaso, J.G., Lauber, C.L., Walters, W.A., Berg-Lyons, D., Lozupone, C.A., Turnbaugh, P.J., Fierer, N., and Knight, R. (2011). Global patterns of 16S rRNA diversity at a depth of millions of sequences per sample. Proc. Natl. Acad. Sci. USA 108, 4516–4522. https://doi. org/10.1073/pnas.1000080107.
- Wickham, H., Francois, R., Henry, L., and Müller, K. (2015). Dplyr: A Grammar of Data Manipulation. R Package Version 0.4. 3 (Vienna: R Found. Stat. Comput.). https:// CRAN. R-project. org/package= dplyr.
- Beisel, J.N., and Moreteau, J.C. (1997). A simple formula for calculating the lower limit of Shannon's diversity index. Ecol. Modell. 99, 289–292.
- Bates, D.W., Mächler, M., Zurich, E., Bolker, B.M., and Walker, S.C. (2015). Fitting linear mixed-effects models using Ime4. BMJ Qual. Saf. 24, 1–3. https://doi.org/10.18637/jss. v067.i01.
- **83.** Lahti, L., and Shetty, S. (2020). Introduction to the Microbiome R Package.
- Archer, E. (2022). Rfpermute: Estimate Permutation P-Values for Random Forest Importance Metrics.





#### **STAR\*METHODS**

#### **KEY RESOURCES TABLE**

REAGENT or RESOURCE	SOURCE	IDENTIFIER
Bacterial and virus strains		
Escherichia coli D31	Yale University, Coli Genetic Stock Center, (Monner et al. <sup>64</sup> )	5165
Chemicals, peptides, and recombinant proteins		
Trypticase Soy Broth and Agar	Becton, Dickinson and Co. Sparks, Maryland, USA	N/A
Artificial Seawater	Cold Spring Harbor Protocols, (Cold Spring Harbor Laboratory Press <sup>65</sup> )	N/A
Trypticase Soy Agar + Sheep Blood	Northeast Laboratory, Waterville, Maine, USA	N/A
Critical commercial assays		
DNeasy Blood and Tissue kit	QIAGEN, Hilden, Germany	N/A
Promega GoTaq® Flexi DNA polymerase	Promega, Madison, Wisconsin, USA	N/A
Oligonucleotides		
TCCTACGGGAGGCAGCAGT, 16S forward primer	Integrated DNA Technologies, Inc., (Nadkarni et al., 2002)	N/A
GGACTACCAGGGTATCTAATCC, 16S reverse primer	Integrated DNA Technologies, Inc., (Nadkarni et al. <sup>66</sup> )	N/A
Software and algorithms		
Geneious, version 10.0	Office of Science and Technology Resources, National Cancer Institute	N/A
BLAST	National Center for Biotechnology Information (NCBI)	N/A
R, version 4.2.1	R Core Team <sup>67</sup>	N/A
DADA2, package for R	(Callahan et al. <sup>68</sup> )	N/A
Phyloseq, package for R	(McMurdie and Holmes, <sup>69</sup> )	N/A
R code to remove contaminants from negative controls	(Ishaq, <sup>70</sup> )	N/A
Vegan, package for R	(Oksanen et al. <sup>71</sup> )	N/A
Ggplot2, package for R	(Wickham, <sup>72</sup> )	N/A
GraphPad Prism v. 7	Dotmatics, (Dotmatics <sup>73</sup> )	N/A
SPSS v. 24.0	IBM, (IBM <sup>74</sup> )	N/A
Other		
Silva ver. 138 taxonomy database for prokaryotic 16S rRNA sequences	(Pruesse et al. <sup>75</sup> )	N/A
16S rRNA dataset for bacterial communities and isolates	NCBI	BioProject Accession PRJNA887451.

#### **RESOURCE AVAILABILITY**

#### Lead contact

Further information and requests for resources and reagents should be directed to and will be fulfilled by the lead contact, Suzanne Ishaq, sue.ishaq@maine.edu.

#### **Materials availability**

This study did not generate new unique reagents.





#### Data and code availability

- Raw sequencing reads from the V3-V4 region of the 16S rRNA gene from bacterial community sequencing data (Illumina MiSeq) and sample data, including about the sequencing run, lobsters, and environmental conditions, are publicly available through NCBI Sequence Read Archive (SRA).
- Trimmed and assembled reads from the 16S rRNA gene from cultured isolates sequence data (Sanger sequencing) publicly available through NCBI GenBank. All NCBI data are associated together under BioProject Accession PRJNA887451.
- Code for bacterial community sequence data is provided as Supplemental Materials, Data S1.
- Any additional information required to reanalyze the data reported in this work paper is available from the lead contact upon request.

#### **EXPERIMENTAL MODEL AND SUBJECT DETAILS**

#### System design and function

Aquaria tank systems were maintained at three temperature regimes that compare to recorded seasonal ocean temperatures for SNE, SME and NME regions (Figure S8). Average monthly temperatures were obtained through NOAA's National Oceanographic Data Center.<sup>76</sup>

The aquaria systems consisted of three individual 1400 L recirculating artificial seawater units with two 365 L tanks in each unit. For each system, water was mechanically and chemically filtered and passed through a bank of two 65 W ultraviolet sterilizers before flowing back into the lobster holding tanks, at a minimum of one full tank change per hour. Twenty-five percent of tank water was exchanged twice a week with freshly made and sterile artificial seawater. Temperature and dissolved oxygen in water was tested daily. Levels of ammonia, nitrogen, and pH were tested twice a week. Water was maintained at levels of total ammonia and nitrogen less than 1.0 mg/L; nitrite, less than 0.1 mg/L; pH from 8.0 to 8.1; 33–35 ppt salinity; and oxygen, >7.0 mg/L. Initially, all tank systems were held at a temperature 11 + 2 °C for a three-week adjustment/ baseline period, as this was representative of the ocean water temperature from where lobsters had been sourced.

#### Lobsters

Fifty-seven female lobsters were collected during the Maine State ventless trap survey<sup>77</sup> in late June 2016 from Maine's lobster management zones F and G (42°05.5′ N, 70°14′ W) which stretch from the southern border of Maine to Small Point, (Figure S9). Non-shell-diseased lobsters (no apparent shell disease; n = 28) and shell-diseased lobsters (apparent signs of ESD, described in Shell Disease Evaluation; n = 29) were randomly distributed between the three tank systems, therefore, each system held a minimum of nine apparently non-shell-diseased (referred to as healthy) and nine shell-diseased lobsters (referred to as diseased), which were balanced across treatments by SDI severity at baseline. We were limited as to lobsters obtained from the natural marine capture, therefore simple randomization was applied for the study over the 3 seasonal temperature regimes. Healthy versus diseased lobsters were held in separate tanks within the system. Lobsters were individually compartmentalized by holding each lobster in a separate holding unit (cage) within the 3 tanks systems, which allowed water to flow through freely but lobsters did not come in contact with each other to reduce agonistic behavior and cannibalism. In the cages, their claws were un-banded to allow for normal grooming, and they were fed previously frozen fish, shrimp, and green crabs throughout the study. Over the course of the study, 15 lobsters died.

Lobsters were acclimated for approximately three weeks before seasonal temperature regimes were initiated. The three systems were phased into current seasonal temperatures at no more than 2°C per day. Three weeks allowed for lobsters to acclimate to laboratory aquaria systems, eliminating stress response from capture and transport and allowed lobsters to come to a 'resting' state.<sup>78</sup> The system temperatures were maintained using titanium heat exchangers and honeywell control units, therefore water was maintained at the temperature set and could be lowered (chilled) or temperature raised (warmed).



#### **METHOD DETAILS**

#### Molt stage evaluation

The relative molt stage of lobsters was determined by estimating shell rigidity (Aiken 1980) and grouped into postmolt (stages A, B, C1 and C2); intermolt (stages C3 and C4); and premolt (stage D).

#### Shell disease evaluation

The extent of shell disease on lobsters was visually assessed (Figure S10) and scored using the shell disease index: 0, no observable signs of disease; 1+, shell disease signs on 1–10% of the shell surface; 2+, shell disease signs on 11–50% of the shell surface; 3+, shell disease signs on > 50% of the shell surface.<sup>25</sup>

#### Hemolymph sampling and plasma antimicrobial assay

Approximately 1.5 mL of hemolymph was collected aseptically from the dorsal abdominal artery into a sterile 3.0 cc syringe with a 23-gauge needle and then discharged into a 2 mL microfuge tube. Microfuge tubes were held on ice and centrifuged at 10,000g within 10 min of sample collection to avoid coagulation of the hemolymph. The plasma (cell-free hemolymph) was then transferred to a new microfuge tube. All plasma samples were stored at  $-80^{\circ}$  C until the antimicrobial assay was performed.

The antimicrobial activity of the lobsters' plasma was measured using a modified turbidimetric assay<sup>41</sup> where *Escherichia coli* D31<sup>64</sup> is treated with plasma, and bacterial growth is compared among treatments after incubation. The bacterium *E. coli* D31 was acquired from Yale University's bacterial culture collection. The stored frozen lobster plasma samples were thawed on ice and filter sterilized using a 0.22 µm filter prior to testing. The procedure was performed as described<sup>42</sup> but was modified by performing the entire assay in a 96-well plate. Briefly, for each plasma sample, 10 µL of the filter sterilized plasma was incubated with 10 µL of the prepared bacterial suspension and 30 µL of PBS for 30 min at room temperature. Next, 450 µL of cold Trypticase Soy Broth containing additional 1% NaCl and 0.1 mg/L streptomycin was added. Each plasma sample was then immediately plated in triplicate onto a 96-well plate (Whytrigg Close, Falcon Scientific, United Kingdom). Microbial growth was measured by absorbance at 570 nm on a BioTek spectrophotometer plate reader (BioTek, now Agilent Technologies, Santa Clara, California, U.S.) every 4 h for 22 h. Antimicrobial activity, the bacterial growth inhibition, of plasma was calculated as the mean optical density and compared to the *E. coli* D31 growth control without lobster plasma. Increasing optical densities indicate increasing bacterial growth.

#### Carapace sampling for microbial analyses

Carapace sampling was performed by swabbing an approximate 4 cm<sup>2</sup> square surface area of the dorsolateral region of the cephalothorax (Figure S11) with a sterile cotton-tipped applicator. Each lobster was sampled in the same anatomical location at each sampling timepoint. The right side of the dorsolateral area of the cephalothorax was sampled for the baseline sampling, the left side for the Time 1, and the right side again for Time 2. The applicator was repeatedly rolled over the approximate 4 cm<sup>2</sup> square surface area for 30 s and then placed in a tube containing 0.9 mL of sterile artificial seawater (artificial seawater (ASW)).<sup>65</sup> These samples were held on ice and then processed for microbial community sampling.

#### **Microbial enumeration and culture**

The swab placed in 0.9 mL of sterile ASW was vortexed vigorously for 1 min to dislodge cellular and microbial material. The swab was aseptically removed and discarded, and a subsample of the solution (400  $\mu$ L) was set aside for DNA extraction. This sample containing the dislodged material was considered the undiluted sample for the microbial enumeration and culture assays. A serial dilution was performed out to  $10^{-3}$  for the baseline and Time 1 and to  $10^{-5}$  for Time 2 by serially transferring 100  $\mu$ L into 900  $\mu$ L of sterile ASW. All dilutions were plated on 2 media by adding 100  $\mu$ L to each plate and spreading using a flame sterilized glass spreader. The two media used were Trypticase Soy Agar with 5% sheep red blood cells +1.5% NaCl (BA) (Northeast Laboratory, Waterville, Maine, USA), and a MA, prepared in house with 10.0 g Trypticase Soy Agar (Becton, Dickinson and Co. Sparks, Maryland. USA), 20.0 g agar (Becton, Dickinson and Co. Sparks, Maryland, USA), 33.8 g instant ocean (Crystal Sea Marinemix, Baltimore, MD), 1000 mL deionized water, and then autoclaved for sterility. All inoculated plates were incubated at 15 + 2 °C for 10 days. Ten days allowed for maximum growth of all bacterial types and allowed for a greater degree of colony morphology differentiation. Culturable microbial growth was enumerated by standard plate count methods and predominant colonies selected per media type for phenotypic identification using the Biolog





Microbial Identification System Gen II (BMIS) and Sanger 16S rRNA sequencing on selected isolates. The five most predominant colonies on each media type were selected for identification, resulting in 724 isolates across all samples. Isolated colonies were re-streaked onto the corresponding medium for re-isolation and purity and the isolates incubated again for 48–72 h at 16°C. Preliminary biochemical profiling included Gram stain, oxidase, catalase reaction and carbohydrate utilization and H<sub>2</sub>S production with triple sugar iron medium. Isolates were then filtered according to preliminary similar biochemical reactions prior to final identification using the BMIS. Those isolates that could not be identified by BMIS were identified using 16S rRNA sequencing.

#### **DNA extraction**

A 400  $\mu$ L subsample of each of the ASW swab solutions as previously described was transferred to a clean 1.0 mL microcentrifuge tube. Samples were centrifuged at 10,000 rpm for 10 min at 4°C. Supernatant was discarded and the remaining cell pellets were frozen at  $-80^{\circ}$ C in 500  $\mu$ L 95% Molecular Grade Ethanol for DNA extraction.

DNA extraction was performed using the DNeasy Blood and Tissue kit (QIAGEN, Hilden, Germany) with a modified pre-treatment lysis for Gram Positive bacteria. Samples from the  $-80^{\circ}$ C were placed on ice and ethanol was removed. Pellets were air dried for approximately 10 min and resuspended in 180 µL enzymatic lysis buffer (20 mM Tris-Cl pH 8.0, 2 mM sodium EDTA, 1.2% Triton X-100 with 20 mg/mL lysozyme added immediately before use) and incubated for 2 h at 37°C. A pre-treatment lysis protocol for Gram Negative bacteria was then performed in which 25 µL Proteinase K and 200 µL Buffer AL were added and mixed by vortexing. Tubes were incubated at 56°C overnight for a minimum of 12 h. The binding and washing steps were followed per manufacturer's spin-column instructions for purification of total DNA from animal tissue. DNA was eluted in a final volume of 50 µL. Total genomic DNA was quantified and qualified using a NanoDrop 1000 spectrophotometer (NanoDrop Technologies, Wilmington, Delaware, USA).

#### Culture identification using whole 16S rRNA sequencing

Individual colonies cultured on agar as previously described were selected for 16S rRNA amplification and sequencing in 50  $\mu$ L nuclease-free water and boiled at 99°C for 5 min to lyse cells and denature DNase. Samples were centrifuged at 12,000 x G for 1 min to separate cellular debris and 10  $\mu$ L of the supernatant was transferred to a 500  $\mu$ L tube. PCR amplification was performed using Promega GoTaq Flexi DNA polymerase and PCR nucleotide mix (Promega, Madison, Wisconsin, USA) for final concentrations of 1.5 mM MgCl<sub>2</sub>, 0.2  $\mu$ m of each dNTP, 0.5  $\mu$ m forward primer (5'-TCCTACGGGAGGCAGCAGT-3') and 0.5  $\mu$ m reverse primer (5'-GGACTACCAGGGTATCTAATCC-3').<sup>66</sup> Samples were amplified on a BioMetra thermocycler with PCR conditions consisting of an initial denaturation for 2 min at 95°C followed by 35 cycles of denaturation for 1 min at 95°C, annealing for 1 min at 60°C, and extension for 45 s at 72°C and a final extension for 5 min at 72°C.

Gel electrophoresis was performed on 1.5% agarose in 1x TAE buffer at 85 V for 40 min with 20 µL PCR product and 100bp ladder (Promega). QIAQuick Gel Purification & Extraction Kit (QIAGEN) was used to purify PCR products per manufacturer's instructions. Total genomic DNA was quantified and qualified using a NanoDrop 1000 spectrophotometer. Purified PCR products were prepared and submitted for sequencing performed by the University of Maine DNA Sequencing Facility using an ABI model 3730 DNA Sequencer. Sequences were trimmed using Geneious R10.0 software and identified using the NCBI BLAST database.

#### Bacterial community library preparation for 16S rRNA amplicon sequencing

A total of 131 lobster shell samples, 6 tank controls consisting of a 15 cm<sup>2</sup> area swabbed from tank surfaces at the second timepoint, and 4 no-template negative controls were successfully sequenced across 4 sequencing runs. DNA extract was sent to Jonah Ventures, LLC (Boulder, Colorado, U.S), which conducted 16S rRNA gene PCR amplification, amplicon quantification and purification, Illumina MiSeq ver. 4 sequencing, and initial quality-control trimming. PCR application used primers 515F (5'-GTGYCA GCMGCCGCGGTAA) and 806R (5'-GGACTACNVGGGTWTCTAAT),<sup>79</sup> and Promega PCR Master Mix specifications (Promega catalog #M5133, Madison, WI) which included 12.5ul Master Mix, 0.5  $\mu$ L of each primer, 1.0  $\mu$ L of gDNA, and 10.5  $\mu$ L DNase/RNase-free H2O. DNA was PCR amplified using the following conditions: initial denaturation at 95°C for 5 min, followed by 35 cycles of 45 s at 95°C, 1 min at 50°C, and 90 s at 72°C, and a final elongation at 72°C for 10 min. Amplicon size was checked with gel electrophoresis and cleaned with Exo1/SAP for 30 min at 37°C, then inactivation at 95°C for 5 min, and stored at -20°C.



A second round of PCR was performed to complete the sequencing library construct, appending with the final Illumina sequencing adapters and integrating a sample-specific, 12-nucleotide index sequence. The indexing PCR included Promega Master mix, 0.5  $\mu$ M of each primer and 2  $\mu$ L of template DNA (cleaned amplicon from the first PCR reaction) and consisted of an initial denaturation of 95 °C for 3 min followed by 8 cycles of 95 °C for 30 s, 55 °C for 30 s and 72 °C for 30 s. The indexed amplicons from each sample were cleaned and normalized using SequalPrep Normalization Plates (Life Technologies, Carlsbad, CA, cat#A10510-01) according to the manufacturer's protocol. Samples are then pooled together by adding 5  $\mu$ L of each normalized sample to the pool. Sequencing was performed on the Illumina MiSeq platform with the v2 500-cycle kit (cat# MS-102-2003).

Data preprocessing steps included demultiplexing sequence files using the barcode in the header, using python code generated by Joy-El Talbot at Iris Data Solutions (Supplemental materials, splitFASTQByHeader.py). Data processing, analysis, and visualization was performed in RStudio using the R software platform versions 3.6.3 through 4.2.1,<sup>67</sup> using a modified version of the DADA2 pipeline,<sup>68</sup> available in Supplemental materials, Data S1. Forward and reverse reads were processed in batches based on 4 total sequencing runs, for quality assurance steps through to amplicon SV identification, before being compiled into a single dataset for rarefaction and statistical analysis. Raw reads and sample data, including about the sequencing run, lobsters, and environmental conditions, are publicly available through NCBI SRA, under BioProject Accession PRJNA887451.

For each of the four sequencing runs, the quality of forward and reverse reads (>900,000 paired read) was initially examined with quality scores plotted with DADA2, and forward/reverse sequences were processed together using filterAndTrim command parameters: trimming the first and last 10 bases, 2 max expected errors for forward reads and 3 for reverse reads, no ambiguous bases, and removing any reads which matched to the positive control, phiX. The DADA2 package in R was used to calculate error rates of the filtered output, dereplicate reads (combining identical reads), pick amplicon SVs and make sequence tables, and remove chimeras using a *de novo* approach. The workflow was verified by tracking reads through the analysis with ggplot to see how many were lost at each QA step. Taxonomy was assigned to sequences with Silva ver. 138 taxonomy database<sup>75</sup> formatted for DADA2. Sequences which matched as eukaryotic mitochondria or chloroplast were removed using the dplyr package.<sup>80</sup>

A phyloseq object was created for each sequencing run with the resulting SV table, taxonomy, and additional sample data, using the phyloseq package.<sup>69</sup> Initial data exploration using unweighted Jaccard distance and ordination plots showed no sample clustering by extraction batch, indicating no residual batch-effect of sequencing in sample bacterial profiles. Data from each sequencing run were subset, and any SVs identified in the no-template negative control samples for each run were used to match against and remove sequences from those samples, on the presumption that sequences in negative controls represent biological contaminants from laboratory protocols or sequencing artifacts.<sup>70</sup> The cleaned dataset was rarefied to the size of the smallest sample, yielding 5,808 sequences per sample.

#### QUANTIFICATION AND STATISTICAL ANALYSIS

#### Growth and weight analysis

Baseline weights of non-shell diseased and shell-diseased lobsters were compared using a t-test. Growth of the lobsters during the experiment was assessed by comparing the lobster weight at the baseline sampling to weight at the third sampling using a paired t-test. In addition, the percentage growth for each lobster was calculated, then growth of non-shell diseased lobsters was compared to shell-diseased lobsters. The total number of mortalities throughout the experiment from non-shell diseased and shell-diseased lobsters were compared for each temperature regime (i.e., SNE, SME, and NME) using Fisher's exact-tests.

#### Antimicrobial assay analysis

Antimicrobial assay analyses were conducted using GraphPad Prism v. 7<sup>73</sup> and all analyses were conducted using SPSS v. 24.0.<sup>74</sup> Nonparametric tests were used where the data were not normally distributed. The mean optical density readings at 22 h for each treatment were compared with ANOVAs.





#### **Cultured isolate analysis**

At the baseline sampling, the bacterial loads of non-shell diseased and shell-diseased lobsters were compared with a t-test. For each sampling period, the bacterial loads within the non-shell disease and shell disease were compared across timepoints (i.e., baseline, lower and higher seasonal temperatures) using Kruskal-Wallis tests. Then the bacterial loads between non-shell disease and shell disease lobsters at each temperature regime (i.e., SNE, SME, and NME) were compared with Mann-Whitney tests. Shannon-Weiner (H') equitability index was used to assess the diversity in the bacterial communities for all treatment groups using the following formula, where N is the total number of species found and  $n_i$  is the number of individuals of one particular species found<sup>81</sup>: H' =  $-\sum[(n_1/N) \ln(n_1/N)]$ 

#### Bacterial community library analysis for 16S rRNA amplicon sequencing data

Alpha diversity was calculated using observed SV richness, and Shannon evenness derived from Shannon Diversity. A Shapiro-Wilkes test was used to test if diversity data were normally distributed. Differences in observed richness and evenness between sample groups were tested using linear mixed models for single-factor comparisons, and generalized linear mixed models to incorporate fixed and random (date) effects, as well as nesting within tank or accounting for repeated measures of lobsters, with the lme4 package<sup>82</sup> and visualized using the ggplot package.<sup>72</sup> When considering experimental and host factors individually, bacterial richness on shells was not affected (linear regression, p > 0.05), by individual tank, thus tank was not considered to be a confounding factor but was used as a nesting factor in some statistical models anyway. Nor was tank temperature at the time of sampling important alone, indicating that shell bacteria are not simply responding to water temperature. Tank temperature fluctuates during the experiment and across the geographic treatments, and different tanks are occasionally the same temperature at the same or different timepoints, thus it was important to consider the effect of temperature independent of other factors.

PCoA was performed to explore similarity of samples based on several experimental factors. Calculations were made using two different sample similarity algorithms (Jaccard and Bray-Curtis) using the phyloseq package to calculate and visualize. Jaccard Similarity uses presence/absence of bacterial SV and can be interpreted as a measure of whether taxa membership of the original community has changed. Bray-Curtis uses presence/absence of bacterial SVs and their relative abundance, and can be interpreted as a measure of whether different taxa are present under new conditions or if the original taxa remain but at different levels of abundance. Sample clustering was tested with permutational ANOVA (i.e., perm-ANOVA), with 1000 permutations per test, using the adonis function in the vegan package of R.<sup>71</sup> The data subsets are specified in the results section.

Core taxa were identified using the microbiome package,<sup>83</sup> designated as shared across 80% of lobsters in the subset group comparisons (healthy and diseased), and at least 0.001% abundance of the bacterial SV. The permutational random forest algorithm was used to identify important community features, i.e., bacterial SVs which were indicative of the community associated with a designated state, using the rfpermute package.<sup>84</sup> Each random forest was performed with 500 trees and 100 permutations, resulting in an out-of-the-box error rate of the model from which accuracy may be calculated (1- OOB error), and a p value for each taxon, corrected for multiple comparisons. The designated states (experimental factors), data subsets, and model accuracies are specified in the results section.