

1 **Comparing larval microbiomes of the eastern oyster (*Crassostrea virginica*) raised in**  
2 **different hatcheries**

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16

## 17 Abstract

18 An ongoing goal of the aquaculture industry is the improvement of oyster larval growth and  
19 production. One component of oyster hatcheries that may contribute to the health of oyster larvae  
20 is the early establishment and subsequent development of the oyster larval microbiome. The  
21 main objectives of this study were to investigate the effects of environmental conditions  
22 (hatchery types and spawning seasons) and oyster phenotypes (larval developmental stages) on  
23 the composition and diversity of the larval microbiome. In addition, the members of core larval  
24 microbiomes were identified and quantified. Microbiome composition and diversity of larval and  
25 corresponding hatchery water samples were examined using high throughput sequencing of 16S  
26 rRNA gene amplicons and represented three development stages from two different spawning  
27 events at four different hatcheries located in Chesapeake Bay tributaries. Larval and water  
28 samples from each spawning cohort were taken at 24-hours 'D' shape (D-stage), 1-week veliger  
29 (V-stage), and 2-weeks pediveliger (PV-stage). Larval microbiomes were significantly different  
30 from water microbiomes and were significantly influenced by hatchery and spawning, with  
31 hatchery having the greatest effect on microbiome composition. While development stage did  
32 not show a significant effect on the larval microbiomes, there was a decrease in species richness  
33 from the initial D-stage larvae through the final PV-stage and nMDS clustering patterns showed  
34 some separation between early (D- and V-) and late stages (PV-) of development , suggesting a  
35 shift towards a more selective microbiome as the larvae developed. A total of 25 members  
36 (OTU level) were identified as the core larval microbiome (core OTUs), comprising  
37 approximately one quarter of the total relative abundance of the larval microbiome. Core OTUs  
38 belonging to genera *Alteromonas* and *Roseobacter* have been shown to offer bivalve larvae  
39 some protection against pathogens, while those belonging to family *Cryomorphaceae* are

40 commonly isolated from microalgal species and most likely indicate an association with oyster  
41 larval feeding. These findings underscore the importance of environmental conditions on  
42 microbiome development of oyster larvae associated with hatchery success of larval cultivation.  
43 Further studies are needed to determine the contribution of the core larval microbiome to oyster  
44 health and disease resistance.

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## 46 1. Introduction

47 Aquaculture of the eastern oyster (*Crassostrea virginica*) is a rapidly expanding and  
48 economically important industry in the Chesapeake Bay. Based on the latest Virginia survey, a  
49 reported 32.1 million aquaculture oysters were sold in 2018 and totaled \$13.1 million (Hudson  
50 2019). To meet increasing demands, oyster hatcheries are continually striving to improve oyster  
51 seed and larval health and optimize rearing conditions. The importance of the microbiome to the  
52 health and growth of oyster larvae has received increased attention from the scientific  
53 community. Early colonization of key bacteria in the oyster larval microbiome may provide  
54 advantages to the oyster as it transitions into an adult. Previous studies have suggested that  
55 bacterial colonization may play an important role not only in the development of a bivalve's  
56 gastrointestinal tract but may also reduce or prevent detrimental microorganisms from  
57 proliferating and causing disease by creating competition for nutrients, reducing space for  
58 settlement, or producing antimicrobials (Harris, 1993; Gomez-Gil et al., 2000; Castro et al.,  
59 2002; Schulze et al., 2006; Prado et al., 2010; Kesarcodi-Watson, 2012). Probiotics, for example,  
60 include beneficial bacteria that improve health or reduce disease, and when administered to  
61 bivalve larvae at early stages of development have been shown to increase the survival of  
62 oysters, possibly through inhibition of pathogenic bacteria, such as *Vibrio* species *V.*  
63 *alginolyticus*, *V. tubiashii*, *V. anguillarum*, and *V. splendidus* (Riquelme et al., 1996; Ruiz-Ponte  
64 et al., 1999; Schulze et al., 2006; Prado et al., 2009; Prado et al., 2010; Sohn et al., 2016; Stevick  
65 et al., 2019).

66 Larval microbiomes may be established during different stages of development as larvae are  
67 exposed to variable seawater quality and differing food sources. From the initial onset of oyster

68 larvae development through its later stages of organ and shell development, the oyster's exterior  
69 shell surface and interior tissues are continuously exposed to bacteria in the surrounding  
70 seawater. During exposure, exogenous bacteria from the hatchery environment rapidly colonize  
71 larvae oyster surfaces and tissues to become resident bacteria (Brown, 1973; Kueh and Chan,  
72 1985). Factors such as temperature, salinity, nutrients, and oxygen content of seawater are all  
73 likely to influence the microbiomes of oyster larvae (Powell et al., 2013), and thus may affect  
74 larval microbiome development.

75 Culture-based studies that began in the 1960s primarily investigated bacterial isolates related to  
76 larval bivalve disease and survival, including species of *Vibrio* and *Pseudomonas* (Murchelano et  
77 al., 1969; Garland et al., 1993; Nicolas et al., 1996; Sainz-Hernández and Maeda-Martínez,  
78 2005). Apart from these studies, very little is known about the composition of oyster larval  
79 microbiomes. Asmani et al. (2016) examined the composition of the early oyster larval  
80 microbiome of Pacific oysters using non-culture based techniques. 16S rRNA gene-based  
81 metagenomic analyses were used to compare the bacterial communities of 7- and 15-day-old *C.*  
82 *gigas* larvae from different rearing systems including a recycling aquaculture system and a flow-  
83 through system. Larval bacterial communities were found to be primarily composed of *Alpha*-  
84 and *Gammaproteobacteria*. Additionally, the Asmani et al. (2016) study also demonstrated that  
85 the composition of oyster larval microbiomes was highly similar regardless of treatments to the  
86 rearing systems, with most variation occurring as a function of larval age. A recent study by  
87 Stevick et al. (2019) examined the effect of probiotic treatments on larval microbiomes of the  
88 eastern oyster *C. virginica* based on 16S rRNA gene sequences. Decreases in relative  
89 abundances of potential pathogenic *Vibrio* spp. were observed in the probiotic treatments. This  
90 study also found larval microbiome compositions to be significantly different from the water

91 microbiomes in rearing tanks. While both Asmani et al. (2016) and Stevick et al. (2019) reported  
92 the baseline composition of oyster larval microbiomes, all experiments were conducted within  
93 the same hatchery and used the same brood stock and algae feed, limiting more general  
94 conclusions about the effect of variables such as brood stock or hatchery type on the  
95 microbiome.

96 While different hatcheries or even different seasonal conditions (e.g., spawning events) within a  
97 hatchery are likely to affect the larval oyster microbiomes, some bacteria may be present in all  
98 oyster larvae regardless of locations and rearing practices. Furthermore, some of these bacteria  
99 may also remain present in the oyster larvae as they transition through different developmental  
100 stages. For example, Trabal et al. (2012) found that bacteria assigned to the genus of  
101 *Burkholderia* identified in post-larvae gastrointestinal tracts of *C. corteziensis* and *C. gigas*  
102 remained within the oysters from the post larvae stage through adulthood at different cultivation  
103 sites. The bacterial taxa that are present throughout the different development stages of the oyster  
104 larvae and different hatcheries may represent the ‘core microbiome’. Core microbiomes may  
105 comprise common or rare bacteria that have been hypothesized to be selectively adapted to  
106 specialized niches provided by their host (Roeselers et al., 2011; Schmitt et al., 2012; Schauer et  
107 al., 2014) and are likely to be linked to functions critical to homeostasis, development, and  
108 biological functions (McFall-Ngai et al., 2013). The core microbiome in larval oysters likely  
109 plays similar roles, and if so may be fundamental to larval health and production in the  
110 aquaculture industry.

111 To investigate the variation and complexities of the *C. virginica* larval microbiome and examine  
112 the effects of hatchery, spawn, and development stage on the larval microbiome, we conducted

113 high throughput sequencing of 16S rRNA gene amplicons to examine the microbiomes of *C.*  
114 *virginica* larvae and hatchery seawater at three development stages from two different spawns in  
115 a summer at four hatcheries. The primary objectives of this study were to (1) to compare the  
116 diversity and composition of the oyster larval microbiomes from a variety of hatcheries over a  
117 spawning season, (2) determine the changes to the larval microbiome among the different larval  
118 development stages, and (3) identify the set of bacteria that were shared among all larvae,  
119 defined here as the oyster larval core microbiome, that may serve as a potential microbial  
120 indicator of larval health.

## 121 2. Materials and methods

### 122 2.1 Sample Collection and Hatchery Descriptions

123 Samples of live oyster larvae were collected from four different hatcheries at three  
124 developmental stage time points: (1) D-stage (D, 48-hours), (2) Veliger (V, 1-week), and (3)  
125 Pediveliger (PV, 2-weeks), for two separate, consecutive spawning events in June and July 2015.  
126 Hatcheries were selected for larval sampling based on location proximate to the Virginia Institute  
127 of Marine Science (VIMS), where analyses were conducted. Hatcheries C and D are both  
128 commercial oyster hatcheries located on Milford Haven and the Ware River, respectively, in the  
129 Virginia part of the Chesapeake Bay tributary system. Hatcheries A and B are both research  
130 oyster hatcheries operated by the VIMS Aquaculture Genetics and Breeding Technology Center  
131 (ABC) and located on the York River and Locklies Creek, Virginia, respectively. Water  
132 treatment at hatcheries A and B is similar and includes sequential treatments with sand filtration,  
133 diatomaceous earth, and UV light treatment. At hatchery C, larvae are raised in flow through

134 culture using water from a single pass multimedia filter. Water at hatchery D is initially passed  
135 through bag filters of decreasing pore sizes, followed by sand filtration with fluidized charcoal,  
136 followed by a final bag filter. No antibiotics or probiotics are used to treat the water or oyster  
137 larvae at any of the facilities. At all four hatcheries, a variety of cultured algal species are grown  
138 for feeding oyster larvae. Oyster larvae at hatcheries A, B, and D are batch fed, while at hatchery  
139 C, oyster larvae are allowed to feed continuously. Several different breeding lines derived from  
140 the VIMS ABC breeding program were used at the hatcheries during the course of the  
141 experiment. Hatchery water samples were collected from larval tanks at the same time as the  
142 larval samples for each of the three larval stage time points for the first two spawning events.  
143 Dissolved inorganic nitrate ( $\text{NO}_3^-$ ), ammonium ( $\text{NH}_4^+$ ) and phosphate ( $\text{PO}_4^{3-}$ ) were measured in  
144 hatchery water samples by filtering 25 mL of hatchery water through Whatman GF/F filters (25  
145 mm diameter, 0.7  $\mu\text{m}$  nominal pore size). Filtrate was then analyzed for nutrients using a Lachat  
146 Quick-Chem 8000 automated ion analyzer (Lachat Instruments, Milwaukee, WI, USA). An  
147 additional 300 mL of hatchery site water was filtered through a 0.22- $\mu\text{m}$  pore size Millipore  
148 Sterivex filter for DNA extraction. Oyster larvae were initially washed and resuspended with 20  
149 mL of sterile seawater before being collected on a 0.22- $\mu\text{m}$  pore size Millipore Sterivex (Merck  
150 KGaA, Darmstadt, Germany) filter. Both larvae and water filters were stored at  $-80^\circ\text{C}$  until DNA  
151 extraction. Time points for hatchery B spawn 2 were excluded from this analysis as a result of  
152 spawning failure. All other spawns were considered successful based on subsequent settlement  
153 and viability of larval oysters following the PV-stage.

## 154 2.2 DNA isolation and 16S rRNA gene amplification



155 DNA extractions for both oyster larvae and water samples were carried out using MoBio  
156 PowerSoil DNA isolation kit (Qiagen, Carlsbad, CA). For oyster larval samples, oyster larvae  
157 were carefully removed from the Sterivex filters, which were removed from cartridge housing,  
158 and then resuspended in approximately 3 mL of the MoBio bead beater solution. Approximately  
159 10,000, 4,000 and 500 oyster larvae were added to glass bead tubes for stages D-, V-, and PV-  
160 stages, respectively. For water DNA extractions, one half of the Sterivex filter from the water  
161 samples was used after carefully extruding the filter from the cartridge housing. The remaining  
162 extraction steps were conducted following the manufacturer's protocol. Larval DNA (3 ng) and 2  
163 water DNA (2 ng) were used for PCR. PCR amplification of the hypervariable V4 region of the  
164 16S rRNA gene was conducted on the extracted DNA using forward primer 515F (5'-  
165 GTGCCAGCMGCCGCGGTAA-3') and reverse primer 806R (5'-  
166 GGACTACHVGGGTWTCTAAT-3') (Caporaso et al. 2011) with the Ion Torrent Personal  
167 Genome Machine (PGM). The basic manufacturer's PCR protocol was used with SuperTaq  
168 DNA Polymerase (Invitrogen, Carlsbad, CA) to create a PCR master mix with the following  
169 modification: a 1 mM dNTP mixture was used in place of a 10 mM mixture for a final  
170 concentration of 0.02 mM dNTP. Thermal cycling conditions consisted of an initial denaturation  
171 step at 94°C for 3 min, followed by 30 cycles of 94°C for 1 min, 54°C for 1 min, 68°C for 2 min.  
172 A final elongation step of 68°C for 10 min was added to ensure complete amplification. These  
173 conditions were optimized using larval DNA samples to ensure amplification of 16S rRNA  
174 genes in all samples. The amplified products were cleaned using the UltraClean GelSpin DNA  
175 Purification Kit (Mo-Bio, Carlsbad, CA). The resulting amplicon libraries were then used as  
176 templates for sequencing with the Ion PGM platform following the manufacture's instruction  
177 (Thermo Fisher Scientific, Waltham, MA). Sequences for this study are deposited at the National

178 Center for Biotechnology Information (NCBI) in the Short Read Archive (SRA) and under  
179 accession ID PRJNA610764.

## 180 2.3 Sequence processing and OTU assignment

181 Removal of barcodes and primers from raw sequences was conducted using the Ribosomal  
182 Database Project (RDP) pipeline initial process (Cole et al., 2014; <http://rdp.cme.msu.edu>) with a  
183 minimum quality score of 20. Following initial trimming, sequences were denoised with Acacia  
184 (Bragg et al., 2012) using a minimum quality score of 25. Mothur v1.35.1 (Schloss et al., 2009)  
185 was used to further trim sequences against the SILVA v138 (Yilmaz et al., 2014) alignment  
186 template to a length of 253 bp, precluster (diffs=1), and screen for chimeric sequences using the  
187 chimera.vsearch command (Rognes et al., 2016). Unknown taxon, mitochondria, chloroplast,  
188 archaea, and eukaryotic sequences were removed from analysis using SILVA v123 reference  
189 taxonomy and the Wang classification method (Wang et al., 2007) with an 80% minimum  
190 identity. Archaea made up < 1.2% of total sequences, and were therefore excluded from further  
191 analysis. Sequences were clustered into operational taxonomic units (OTUs) based on a 97%  
192 identity using the vsearch abundance-based greedy clustering (AGC) algorithm and assigned  
193 consensus taxonomy using the classify.otu command in Mothur.

## 194 2.4 Bacterial diversity and taxonomy

195 Diversity metrics on OTUs including coverage, OTU numbers, Chao1, and Shannon diversity  
196 were conducted with subsampled larvae and water sequencing reads (n=5,277) in Mothur using  
197 the summary.single command. To reduce potential sequencing artifacts, OTUs with <1 sequence  
198 in 1.0% of samples were removed and non-metric dimensional multidimensional scaling (nMDS)

199 was performed on Hellinger transformed OTU counts using Bray-Curtis resemblance matrices in  
200 the R-package Vegan (Oksanen et. al., 2019) to visualize differences between water and larvae  
201 community composition. Classifications of microbiomes and larval core microbiomes at the  
202 taxonomic class level were based on the mean relative abundance of OTUs for each microbiome  
203 sample type (larvae or water) or microbiomes within each hatchery (A, B, C, or D) using SILVA  
204 v123 reference taxonomy.

## 205 2.5 Larval core microbiome

206 Core OTUs were analyzed using the R package Phyloseq (McMurdie and Holmes, 2013).  
207 Sequencing reads prior to subsampling were used to prevent reduction in coverage of samples.  
208 The larval core microbiome was defined as the collection of OTUs present in at least 90% of the  
209 larvae samples being examined. A conservative 90% cutoff was selected to account for the  
210 possibility of errors associated with sampling or sequencing efforts.

## 211 2.6 Statistical analyses

212 Differences in Chao richness and Shannon diversity between the larval microbiomes and water  
213 microbiomes were tested using two-tailed paired t-tests. Differences relating to the main effects  
214 of larval development stage, hatchery, and spawn among the water and larval microbiomes were  
215 determined using a three factor ANOVA with post-hoc Tukey's HSD tests in R. Spearman rank  
216 correlation tests were used to determine whether Chao richness and Shannon diversity indices in  
217 larvae were correlated with water. Only samples that had both matching water and larval samples  
218 were used for this analysis (each n=18). Additional spearman rank correlation tests were  
219 conducted between Chao richness, Shannon diversity indices, and nutrients measured in the

220 water samples. PERMANOVA was performed on Bray-Curtis resemblance matrix derived from  
221 Hellinger transformed OTU counts to test for the effect of sample type on the combined larval  
222 and oyster microbiome using the `adonis2` function and the `strata` function (`strata=spawn`).  
223 PERMDISP was conducted to determine whether multivariate dispersion had an effect on sample  
224 type. To reduce complexity of the model and further test the effects of hatchery, development  
225 stage, and spawn on larval and water microbiomes, additional PERMANOVAs and PERMDISP  
226 tests were conducted on separate larval and water microbiomes. Pairwise comparison tests  
227 between hatcheries were conducted using the `pairwise.adonis2` function and p-values were  
228 corrected for FDR. PERMANOVA, pairwise tests, and PERMDISP analyses were conducted in  
229 the `vegan` R-package. DESeq2 (Love et al., 2014) using a Wald's significance test and local fit  
230 was performed on raw sequencing counts to test for differentially abundant OTUs between larval  
231 and water microbiomes. Pairwise comparisons were made using the `contrast` option in DESeq2,  
232 and Benjamini and Hochberg's p-adjusted values correcting for FDR were used to test for  
233 significance. Comparisons between the relative abundances of core larval OTUs found in the  
234 larval microbiomes and the water microbiomes were conducted using a one-tailed Wilcoxin  
235 signed rank test. All tests were based on a significance of  $p < 0.05$  and error bars represent  $\pm 1$   
236 standard error.

## 237 3. Results

### 238 3.1 Hatchery water parameters

239  $\text{NO}_3^-$ ,  $\text{NH}_4^+$ , and  $\text{PO}_4^{3-}$  were measured in each of the water samples for all larval development  
240 stages and spawning events (Table 1). In general, nutrients among the hatcheries, spawns, and

241 larval stages were highly variable. Concentrations of  $\text{NO}_3^-$  ranged from 0.43  $\mu\text{M}$  at hatchery D  
242 from spawn 2 during stage V to 154.64  $\mu\text{M}$  at hatchery B from spawn 1 during stage PV. With  
243 the exception of hatchery D water during spawn 2, concentrations of  $\text{NO}_3^-$  within each hatchery  
244 were generally lowest at the D-stage, ranging from 4.42  $\mu\text{M}$  at hatchery C from spawn 1 to 15.51  
245  $\mu\text{M}$  at hatchery B from spawn 1. Similar to  $\text{NO}_3^-$ , concentrations of  $\text{NH}_4^+$  were highly variable  
246 and ranged from 0.36 at hatchery A from spawn 1 during stage D to 12.56  $\mu\text{M}$  at hatchery C  
247 from spawn 2 during stage PV. The lowest  $\text{NH}_4^+$  concentrations, however, were consistently  
248 found at hatchery A, with an average concentration of  $0.53 \pm 0.20 \mu\text{M}$ . Levels of  $\text{PO}_4^{3-}$  ranged  
249 from 0.26  $\mu\text{M}$  at hatchery A from spawn 1 during stage D to 8.55  $\mu\text{M}$  at hatchery C from spawn  
250 2 during stage PV.

### 251 3.2 Microbiome diversity comparisons among larvae and hatchery water

252 A total of 854,695 clean, trimmed bacterial 16S rRNA gene sequences were obtained from 19  
253 oyster larval and 20 water samples. (SI Table 1) Average number of sequences was  $21,195 \pm$   
254  $1,953$  with an average coverage of  $98.2 \pm 0.2\%$  (Table S1). Overall, richness was significantly  
255 higher in the water microbiomes than the larval microbiomes (paired t-test,  $t = 2.312$ ,  $p = 0.034$ ),  
256 while no significant difference was detected in diversity (paired t-test,  $t = -1.19$ ,  $p = 0.251$ ).  
257 Testing for main effects only (stage, hatchery, and spawn) in the larval samples, larval  
258 development stage had a significant effect on richness ( $F_{2,18} = 4.272$ ,  $p = 0.0306$ ), with D-stage  
259 being significantly higher in richness than PV-stage (Tukey's  $p = 0.0263$ ) (Fig. 1). No  
260 developmental stage effect was found in the water samples. No significant effect of spawning  
261 events was detected in either the larval or water samples. To test whether richness or diversity in  
262 larvae stages was correlated with richness or diversity in water samples, Spearman rank tests

263 were performed on Chao and Shannon indices for each larval stage and the corresponding water  
264 sample. The rank tests showed no significant positive correlations between larvae and water  
265 microbiomes for either Chao or Shannon indices (SI Table 2). Spearman rank tests were also  
266 conducted between Chao and Shannon indices and nutrient measurements in the water and larvae  
267 microbiomes to determine whether nutrients correlated with richness and diversity of water  
268 microbiomes (Table 2). For the larval microbiomes, no significant correlations were found  
269 between nutrients and Chao or Shannon indices. For the water microbiomes,  $\text{NO}_3^-$ ,  $\text{NH}_4^+$ , and  
270  $\text{PO}_4^{3-}$  were significantly and negatively correlated with both richness and diversity.

### 271 3.3 Microbiome composition comparisons of larvae and water

272 Differences in  $\beta$ -diversity between sample types were visualized using nMDS and dispersion  
273 plots (Fig. 2) and analyzed using PERMANOVA and PERMDISP, respectively (SI Table 3).  
274 There was a clear and significant separation between the larval and oyster microbiomes based on  
275 sample type ( $F_{1,39} = 3.913$ ,  $p < 0.001$ ) with water showing significantly higher dispersion than  
276 larvae ( $F_{1,39} = 10.679$ ),  $p = 0.002$ ). To reduce complexity, larval and water microbiomes were  
277 analyzed separately for the effects of hatchery, development stage, and spawn on their respective  
278 communities. The largest, significant effect with the most variation explained in both  
279 microbiomes was due to hatchery origin with a clear separation between samples from different  
280 hatcheries (Fig. 3, SI Table 4 and 5). In the larval microbiome, the effect of developmental stage  
281 was also found to be significant ( $F_{2,18} = 1.3236$ ,  $p < 0.05$ ) and explained a moderate level of  
282 variation in the model ( $R^2 = 0.1181$ ) with some separation seen between D/V- and PV-stages, but  
283 no separation seen between D- and V-stages in the nNMDS plot (SI Fig. 1A). Following FDR  
284 correction of pairwise comparisons, however, no significant differences between development

285 stages were detected. No similar separation or significance of water microbiomes were detected  
286 as a function of the larval developmental stages (SI Table 5, SI Fig. 1B). In both the larval and  
287 water microbiomes, the effect of the spawning events on microbiome  $\beta$ -diversity was significant,  
288 although variation explained was low ( $R^2 < 0.076$ ; SI Table 4A, 5A).

289 The overall compositions of both larval and water microbiomes comprised primarily  
290 Alphaproteobacteria, Gammaproteobacteria, and Flavobacteriia, with Flavobacteriia having an  
291 overall higher abundance in the water microbiomes and Gammaproteobacteria having an overall  
292 higher relative abundance in the larval microbiome (Fig. 4). Combined, these classes represented  
293 on average  $58.2 \pm 2.7\%$  of total sequences for all larval and water microbiomes, regardless of  
294 hatchery site. Among the larval microbiomes, the greatest differences in taxonomy at the class  
295 level among sites were primarily due to a high relative abundance of Sphingobacteriia (family  
296 *Saprospiraceae*) at hatchery A, Betaproteobacteria (family *Methylophilaceae*) at hatchery B,  
297 Mollicutes (family *Mycoplasma*) at hatchery C, and Bacilli (family *Lactobacillus*) and  
298 Planctomycetacia (family *Planctomycetaceae*) at hatchery D. In the water microbiomes, most of  
299 the differences among hatchery sites were a result of few lower relative abundance classes that  
300 varied among the hatcheries, including Betaproteobacteria (families *Methylophilaceae* and  
301 *Comamonadaceae*) at hatcheries B and D, Bacilli (Family XII) at hatchery C, and Actinobacteria  
302 (family *Microbacteriaceae*) at hatcheries A and D.

303 Comparing the larval and water microbiomes using differential abundance testing, 5 OTUs were  
304 found to be significantly higher in the oyster larval microbiomes than in the water microbiomes  
305 (Table 3). Three of the OTUs, genera *Marinicella*, *Simiduia*, and an unclassified *Colwelliaceae*,

306 belonged to class Gammaproteobacteria. The other 2 OTUs, *Mycoplasma* and *Fluviicola*,  
307 belonged to classes Mollicutes and Flavobacteriia, respectively.

### 308 3.4 Core microbiome identification in larvae

309 A total of 25 OTUs, designated as the core microbiome, were present in 90% of the larval  
310 samples and made up  $43.3 \pm 3.8\%$  of the larval microbiome (SI Table 6). The most abundant  
311 OTUs making up the core microbiome (Fig 5) belonged to families *Rhodobacteraceae* (12  
312 OTUs,  $22.8 \pm 2.4\%$ ), *Flavobacteriaceae* (4 OTUs,  $9.5 \pm 2.6\%$ ), *Alteromonadaceae* (2 OTUs,  $2.5$   
313  $\pm 0.9\%$ ), *Marinicella* from an unclassified family of Gammaproteobacteria (1 OTU,  $1.7 \pm 0.5\%$ ),  
314 *Erythrobacteraceae* (1 OTU,  $2.0 \pm 0.5\%$ ), and *Pseudomonadaceae* (1 OTU,  $1.1 \pm 0.8\%$ ). The  
315 remaining 4 OTUs belonged to families *Phyllobacteriaceae*, *Oleiphilaceae*,  
316 *Pseudoaltermonadaceae*, and *Cryomorphaceae* and made up an average relative abundance of  
317  $<1\%$ . Overall, the relative abundance of the core microbiome was higher in hatcheries A ( $52.9 \pm$   
318  $1.3\%$ ) and B ( $45.6 \pm 1.7\%$ ) than in C ( $33.5 \pm 0.6\%$ ) and D ( $39.1 \pm 0.8\%$ ).

319 The 25 OTUs identified in the larval core were compared with the water microbiomes. In the  
320 water microbiome, the larval core OTUs made up  $30.2 \pm 6.3\%$  of the water microbiome, which  
321 was significantly lower in relative abundance than that of the larval microbiome ( $z=-1.8073$ ,  
322  $p=0.04$ ). Core OTUs belonging to genera *Marinicella* and *Fluviicola* were identified as  
323 differentially abundant between total larval microbiomes and water microbiome (Table 3).

324



## 325 4. Discussion

### 326 4.1 Effects of hatchery, spawn, and development stage on larval and water 327 microbiomes

328 Of the three principal factors – hatchery, spawn, and development stage – examined in this study,  
329 hatchery was found to have the greatest effect on the composition and structure of the oyster  
330 larval and water microbiomes (Fig 3, SI Table 4 and 5). Variations among the hatcheries in this  
331 study included differences in location, water filtration methods, and feeding methods, which all  
332 contributed to the uniqueness of individual operations. While oyster larval and hatchery water  
333 microbiomes were both highly influenced by the effect of hatchery, there was a clear distinction  
334 between the oyster larvae and their corresponding water microbiomes (Fig 2, SI Table 3),  
335 indicating that various components of the hatchery operation may affect the oyster larvae or  
336 water microbiomes differently. For example, nutrients in water were significantly and negatively  
337 correlated with richness in the water microbiome, and had no correlation with the oyster larvae  
338 microbiome (Table 2), suggesting that different water treatment methods or other hatchery  
339 practices may have a significant impact on the water microbiome, but may not be as important to  
340 the composition of the oyster larvae microbiome.

341 Other oyster hatchery studies have also found distinctions between the oyster larvae microbiome  
342 and water microbiomes the larvae are raised in. Asmani et al. (2016) found a difference between  
343 *C. gigas* larval microbiomes and seawater microbiomes when examining larvae raised under  
344 different oyster rearing systems, including a flow-through and recycling system. Stevick et al.  
345 (2019) also reported *C. virginica* larval microbiome was significantly different from the

346 microbiomes of biofilm and water in a rearing tank. Both studies, like ours, suggest that the  
347 oyster microbiomes are not merely reflections of the surrounding hatchery seawater, but may be  
348 selectively colonized by distinct bacterial taxa. Furthermore, in our work, this distinction  
349 between oyster associated bacteria at each of the hatcheries and bacteria in the seawater is further  
350 evidenced by the lack of correlation between richness and diversity of the oyster larvae  
351 microbiomes and their corresponding water microbiomes (SI Table2).

352 The effect of spawn season (June or July) was significant in the larval and water microbiomes,  
353 however, its contribution to the overall variation in the community was low compared to the  
354 hatchery effect (SI Table 4A, 5B). Environmental conditions such as temperature and substrate  
355 availability, which exhibit clear seasonal trends, have been shown to strongly influence bacterial  
356 communities (Shiah and Ducklow, 1994; Schultz et al., 2003), particularly those in the water  
357 community. Furthermore, in the larvae samples for each of the spawning seasons different pairs  
358 or groups of oysters were used to conduct the spawns, introducing a component of genetic  
359 variation into the oyster larval microbiome. Genotypes have been shown to play a role in  
360 shaping of oyster gill bacterial communities (Wegner et al., 2013), which may have further  
361 contributed to variation due to spawning in the larvae microbiomes.

362 In both the larval microbiome sample, development stage as an oyster phenotype was found to  
363 have a significant effect and explained a moderate level of variability (SI Fig 1A, SI Table 4A).  
364 While nMDS showed a distinction between early D-stage and PV-stage, pairwise testing  
365 revealed no significant difference in  $\beta$ -diversity between the stages. Further testing with larger  
366 sample sizes may be necessary to identify significant compositional differences between the  
367 larval stages. One measurable difference among the larval development stages, however, was an

368 overall decrease in species richness, with a significant difference between D-stage and PV-stage  
369 (Fig 1). Chao richness indices for PV-stage larvae determined in this study ( $301.1 \pm 31.9$ ) were  
370 consistent with those found in different post larvae *Crassostrea* oysters from Trabal Fernández et  
371 al. (2014), suggesting that by the PV-stage, oyster larval richness stabilizes as it enters post larval  
372 growth. This same decrease in species richness or effect of developmental stage on the  
373 microbiome was not found in the water microbiomes, signifying a different selection pressure on  
374 the oyster microbiome compared to the water microbiome. Early D-stage larvae may be more  
375 likely to be rapidly colonized by several transient bacterial taxa from the surrounding water  
376 column, while later PV-stage larvae microbiomes may prevent bacterial colonization and instead  
377 host permanent, resident bacteria. Alternatively, bacteria that have a competitive advantage may  
378 begin to outcompete and replace other bacteria by the PV-stage. Several bacteria species are  
379 known to colonize surfaces and produce polymers, inhibitory compounds, and antimicrobials  
380 that prevent competitors from succeeding (Bruhn et al., 2005; Rao et al., 2005; Xavier and  
381 Foster, 2207).

#### 382 4.2 Larval core microbiome and its implications

383 Evidence of the establishment of a set of resident bacteria associated with oyster larvae is  
384 demonstrated by examining the larval core microbiome. Of the 9,261 OTUs found in oyster  
385 larvae, a total of 25 OTUs were present across 90% of the oyster larvae regardless of  
386 development stage, hatchery, or spawning event (SI Table 6). While the number of larval core  
387 OTUs was small, the combined core OTUs averaged more than 43% of the larval microbiomes  
388 indicating a strong presence of a core microbiome in larval oysters. In comparison, adult oyster

389 gut core microbiomes have been shown to have a higher number of shared OTU, but represent a  
390 lower percentage of the total microbiome (Pierce and Ward, 2019).

391 The majority (12 OTUs) and most abundant core OTUs belonged to family *Rhodobacteraceae*  
392 from the class Alphaproteobacteria (Fig 5). *Rhodobacter* are rapid primary surface colonizers  
393 (Dang et al., 2008) and have been shown to be abundant in phytoplankton cultures used in  
394 bivalve larvae feed (Nicolas et al., 2004), and thus may explain the dominance of  
395 *Rhodobacteraceae* as a dominant family in early core larval microbiomes. Some  
396 *Rhodobacteraceae* bacteria, specifically *Phaeobacter* [*Roseobacter*] *gallaciensis*, have been  
397 shown to benefit mollusc larvae (Ruiz-Ponte et al., 1999) and provide protection against  
398 pathogens (Kesarcodi-Watson et al., 2012), while others have been shown to contribute to  
399 diseases like Juvenile oyster disease (Boettcher et al., 2000). Additionally, *Phaeobacter* has been  
400 shown to be a core genus present in the gut microbiomes of adult mussels and oysters across  
401 seasons (Pierce and Ward, 2019), indicating a potential relationship with the bivalve hosts.

402 The second and third most abundant families shared by the larvae were *Flavobacteriaceae* from  
403 class Flavobacteriia (4 OTUs) and *Alteromonadaceae* (2 OTUs) from class  
404 Gammaproteobacteria. OTU #00010 from family *Flavobacteriaceae* most closely identified  
405 with genus *Tenacibaculum*, which has been identified in juvenile and adult oysters (Fernandez-  
406 Piquer et al., 2012; Lee et al., 2009; Trabal Fernández et al., 2014) as well as in other marine  
407 animals and macroalgae (Suzuki et al., 2001; Heindl et al, 2008; Wang et al., 2008). Of the two  
408 OTUs (OTU #00015) from family *Alteromonadaceae*, one closely identified with *Alteromonas*  
409 *macleodii*. *A. macleodii* has been isolated from microalgal cultures in an aquaculture hatchery  
410 (Schulze et al., 2006) and found in larval cultures of flat oysters (Farto et al., 2006). In mollusc

411 larvae, *A. macleodii* has been demonstrated to offer some protection against oyster larvae  
412 pathogens *V. coralliilyticus* and *V. pectenocida* (Kesarodi-Watson et al., 2012).

413 Of the OTUs identified in the larval core microbiome, only core OTUs from family  
414 *Cryomorphaceae* and *Marinicella* from an unidentified Gammaproteobacteria family were found  
415 to be differentially abundant from the water samples (Table 3). *Cryomorphaceae* has not been  
416 previously linked to the oyster core microbiome, however, it has been found to be abundant in  
417 algal cultures (Asmania et al., 2016). This may indicate that higher abundances of  
418 *Cryomorphaceae* in the oyster larval core may be due to algae during feeding in the later larval  
419 stages of development. While still part of the core microbiome by definition, these bacteria may  
420 be an important component of the oyster larval diet rather than permanent resident bacteria. In  
421 comparison to *Cryomorphaceae*, *Marinicella* has been found to be part of the oyster core  
422 microbiome in *Crassostrea sikameae*, remaining consistently present during probiotic treatments  
423 and depuration (García Bernal et al., 2017). It is unclear as to the role of *Marinicella* in oyster  
424 larvae, however, its higher abundance in oyster larvae compared to the surrounding water  
425 suggest that it may be an important component of larval health or is preferentially consumed  
426 during feeding. Overall, the presence of 25 core OTUs in successfully reared larvae provides the  
427 first insight into the development of potentially important microbial indicators to evaluate and  
428 predict the success of larvae rearing practices at hatcheries.

429 Oyster larvae showed a wide range of variation in their microbiomes primarily due to the  
430 hatchery in which they were raised. These significant effects of hatchery on the larval  
431 microbiome may have implications in the selection of hatchery operation and rearing methods.

432 **However, our study was limited in the number of samples and our findings may not sufficiently**

433 capture or represent the full range of variation present in oyster microbiomes at each hatchery,  
434 season or time point. In our study, hatcheries varied according to water treatment, feeding  
435 methods, and location. Isolation and testing of each of these different methods on larvae  
436 microbiome is necessary to identify which specific hatchery practices have the most impact on  
437 the oyster larval microbiome. While development stage was not determined to have a significant  
438 effect in our study, there were a few distinct differences between the larval stages of  
439 development including a significant decrease in species richness between the early and late  
440 stages of oyster development and greater variability in class composition than corresponding D-  
441 stage larval and water microbiomes. Together, our data suggests a shift towards a more selective  
442 larval microbiome as the oyster develops. The transition in microbiomes from D-stage to PV-  
443 stage may be a critical time period in larval development to ensure the oyster larvae are exposed  
444 to beneficial bacteria, including probiotics. Additionally, the 25 core OTUs identified here in  
445 successfully settled larval oysters provides insight into core microbiomes that may be essential to  
446 oyster growth and development. Future studies comparing larval core OTUs in this study to  
447 larval core OTUs from other geographical locations in the U.S. and Canada will help further  
448 determine the presence and potential importance of these OTUs in developing oysters. The  
449 investigation of changes that occur to the oyster larval microbiome as it develops as well as  
450 identification of the larval core provides an important step in unravelling the complexity  
451 associated with the oyster larval microbiome aid in the development diagnostic tools to monitor  
452 hatchery practices.

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641

642 Figure legends

643 Figure 1. Chao richness and Shannon diversity in oyster larval and water microbiomes by  
644 developmental stage. Mean Chao richness in (A) oyster larvae (B) and water and mean Shannon  
645 diversity in (C) oyster larvae and (D) water for larval stages D-, V-, and PV (oyster, n = 18;  
646 water, n = 18). Significance differences between larvae stages are denoted with different letters  
647 ( $p < 0.05$ ). Error bars represent  $\pm$  SE.

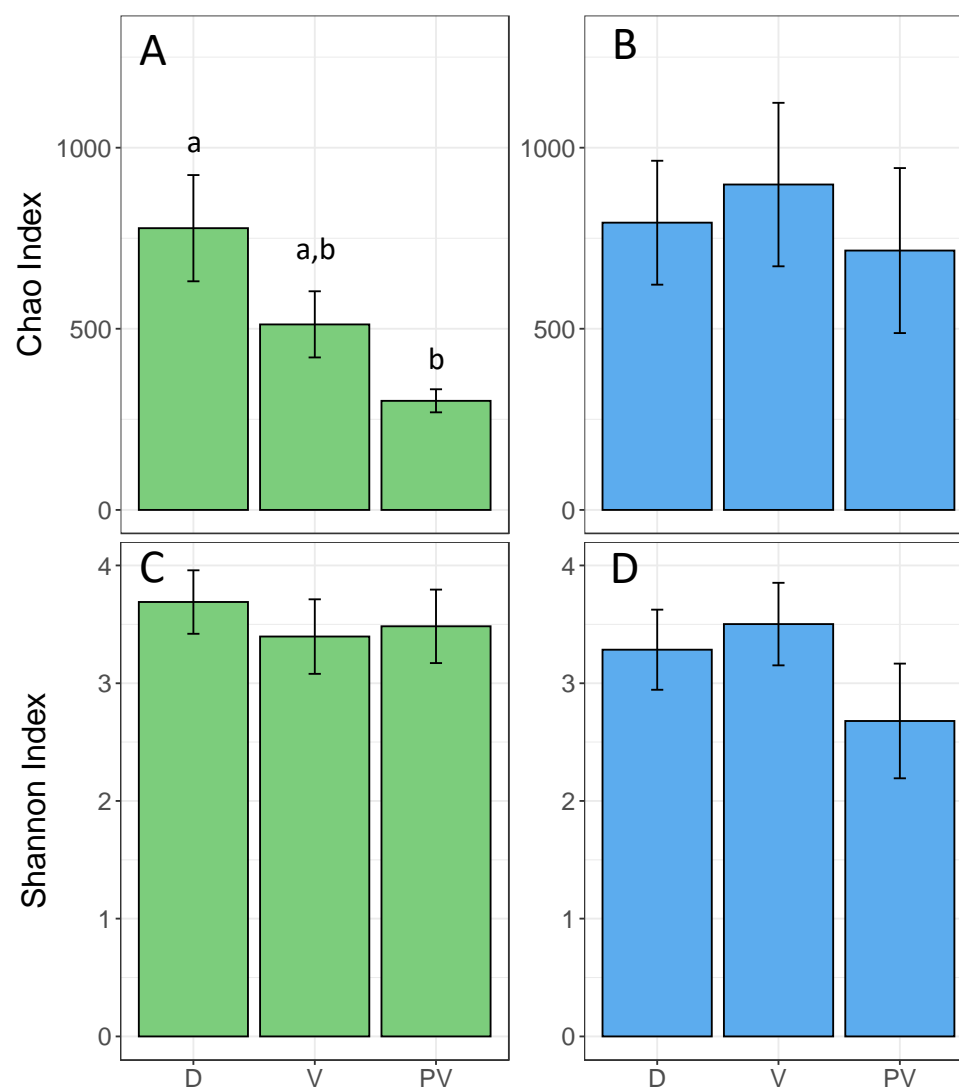
648 Figure 2. Beta-diversity among different sample types in the larval and water microbiomes. Non-  
649 metric multidimensional scaling plots based on a Bray-Curtis resemblance matrix (A) and  
650 dispersion plots (B) depicting  $\beta$ -diversity between sample types: larvae (n = 19) and water (n =  
651 20). Ellipses represent  $\pm$  SE and significance ( $p < 0.05$ ) indicated by (\*).

652 Figure 3. Beta-diversity among different hatcheries in the larval and water microbiomes. Non-  
653 metric multidimensional scaling (nMDS) plot based on Bray-Curtis resemblance matrices  
654 depicting differences in hatcheries between (A) larval and (B) water microbiomes. Ellipses  
655 represent  $\pm$  SE.

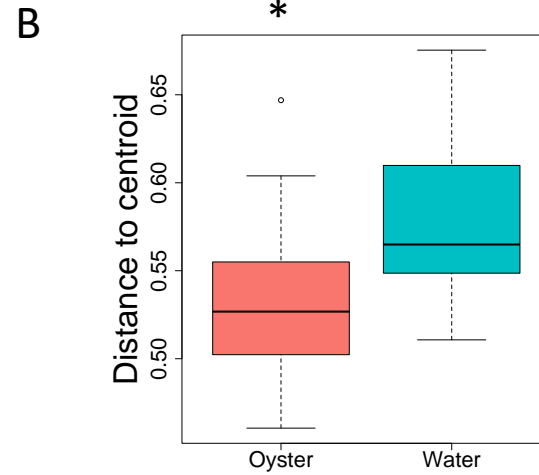
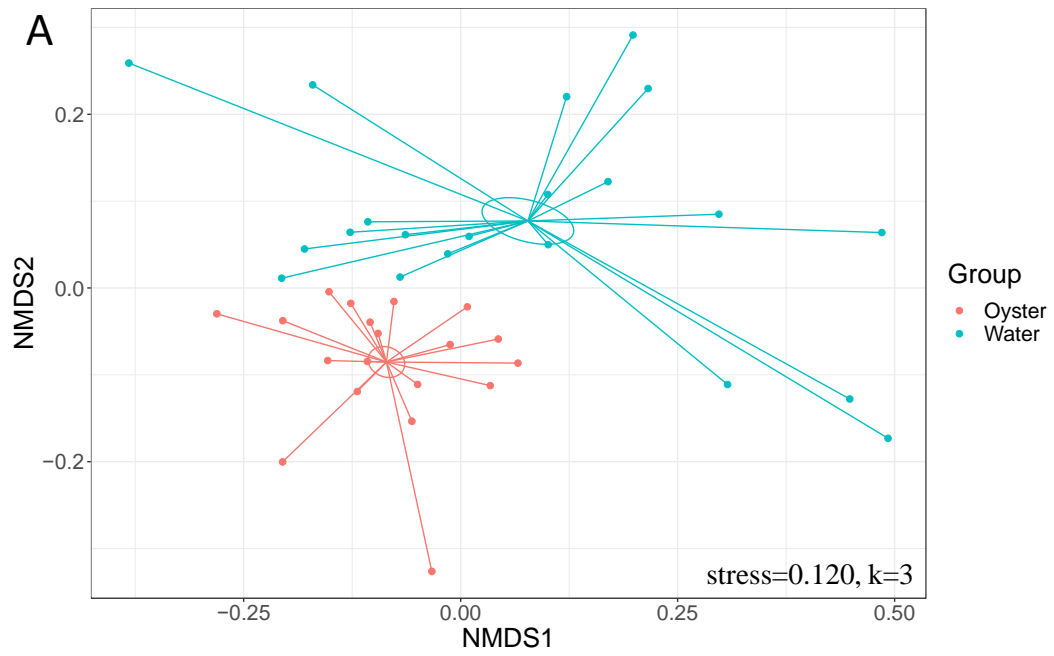
656 Figure 4. Taxonomic composition of oyster larvae and water microbiomes. Mean relative  
657 abundances of bacterial classes by hatchery and sample type (oyster, n = 19; water, n = 20). Only  
658 classes with  $> 1\%$  relative abundance are shown.

659 Figure 5. Taxonomic composition of larval core microbiome. Mean relative abundances by  
660 hatchery of bacterial families in the larval core microbiome (oyster, n = 19). Core microbiome is  
661 defined as OTUs found in 90% of oyster larvae samples.

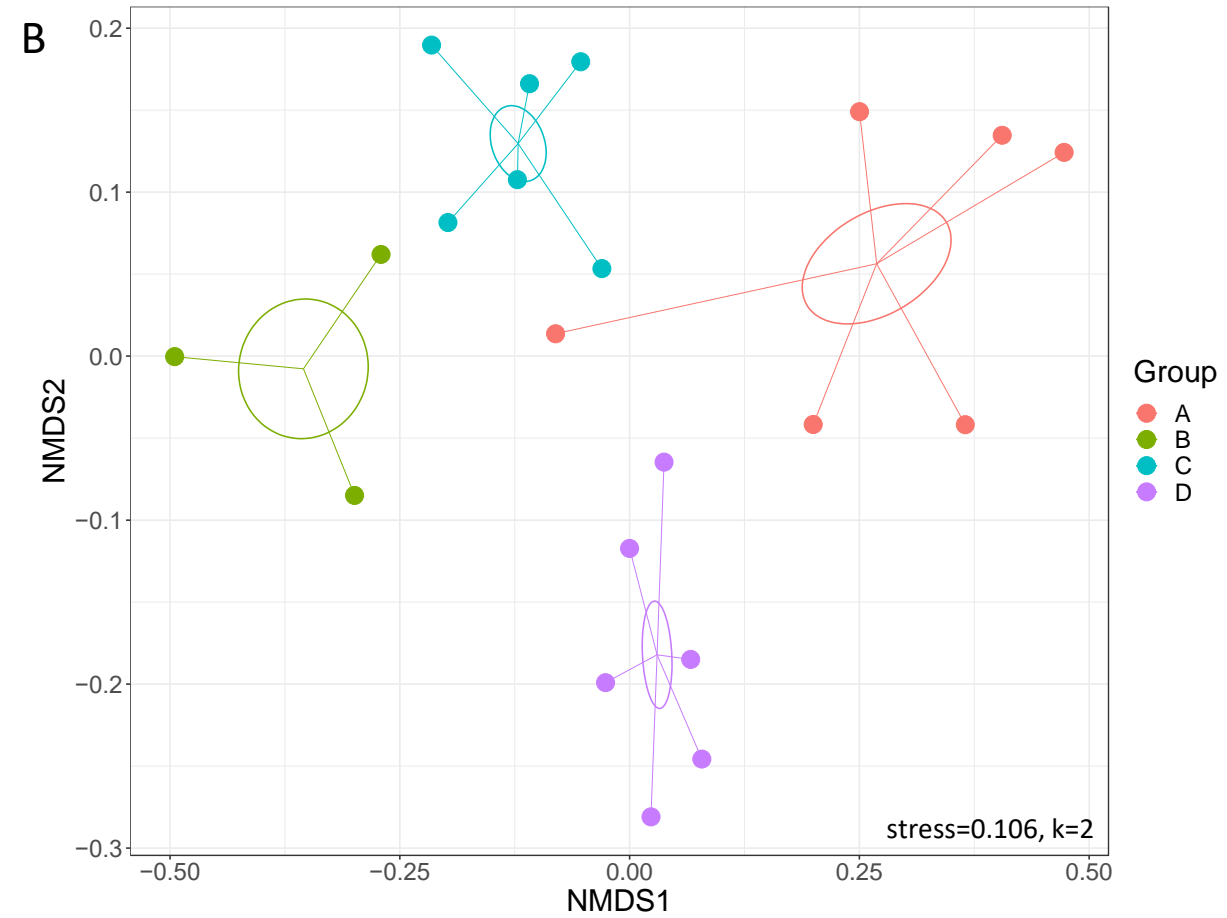
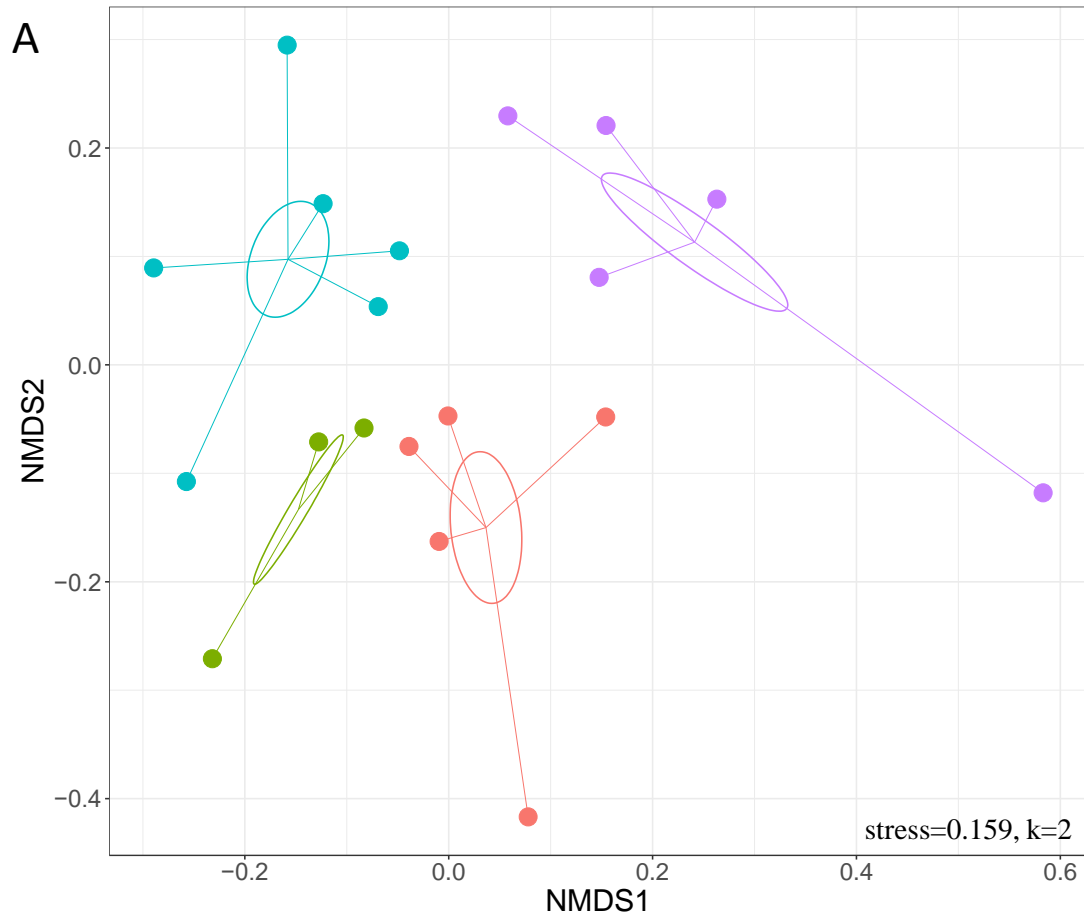
662 SI Figure 1. Beta-diversity among different developmental stages in the larval and water  
663 microbiomes. Non-metric multidimensional scaling (nMDS) plot based on Bray-Curtis  
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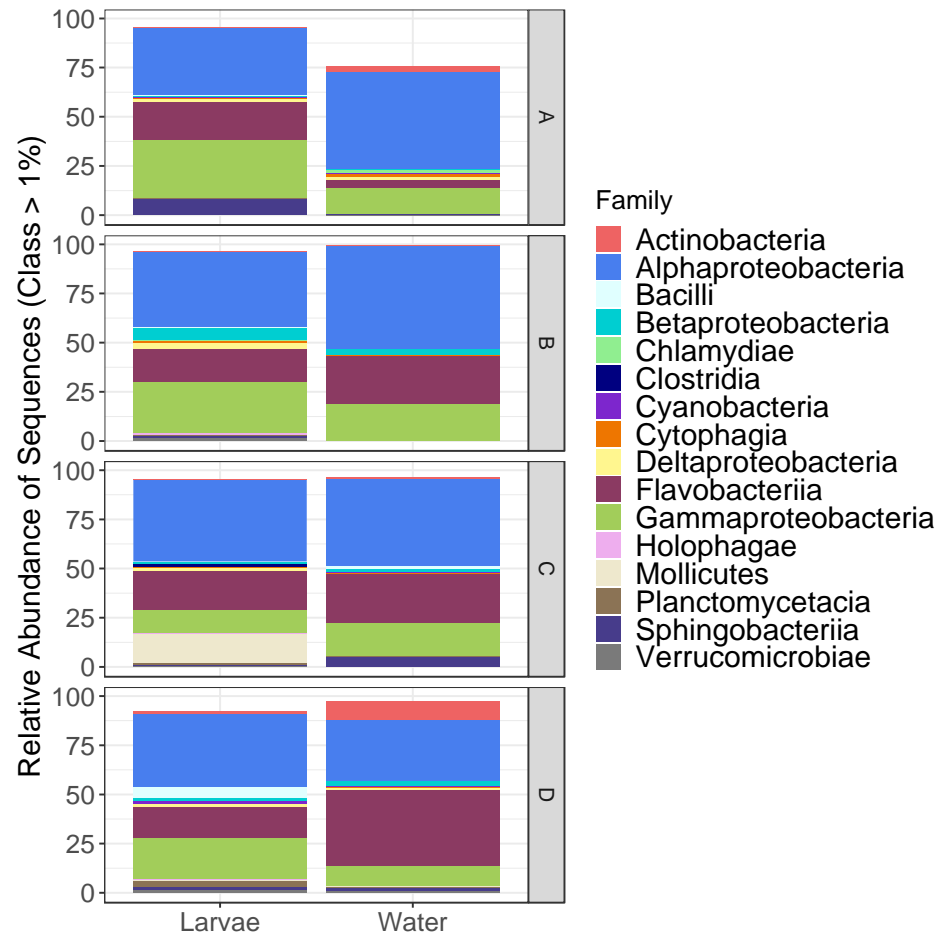
**Figure 1. Chao richness and Shannon diversity in oyster larval and water microbiomes by developmental stage.** Mean Chao richness in (A) oyster larvae (B) and water and mean Shannon diversity in (C) oyster larvae and (D) water for larval stages D-, V-, and PV (oyster, n = 18; water, n = 18). Significance differences between larvae stages are denoted with different letters ( $p < 0.5$ ). Error bars represent  $\pm$  SE.



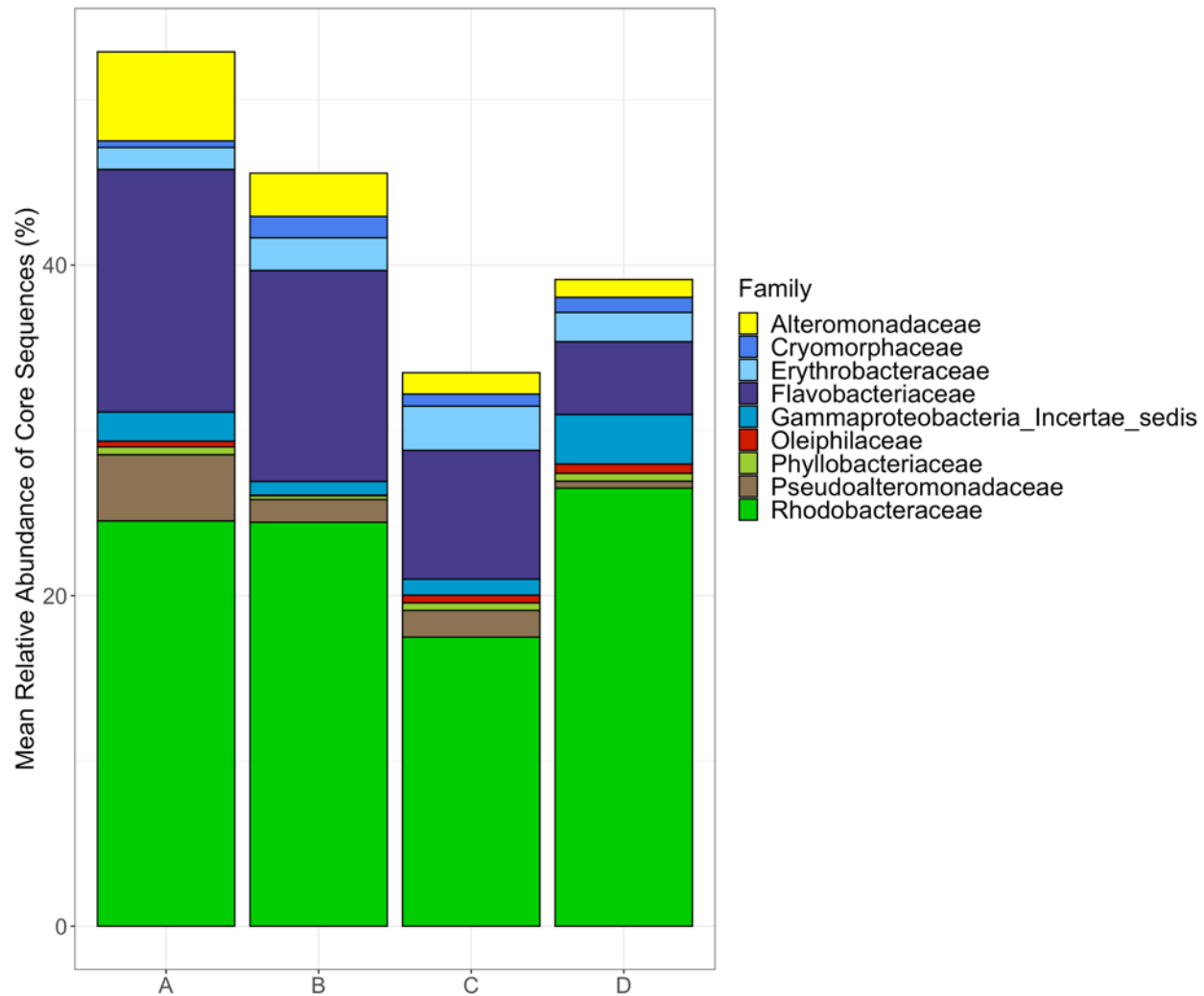
**Figure 2. Beta-diversity among different sample types in the larval and water microbiomes.** Non-metric multidimensional scaling plots based on a Bray-Curtis resemblance matrix (A) and dispersion plots (B) depicting  $\beta$ -diversity between sample types: larvae (n=19) and water (n=20). Ellipses represent  $\pm$  SE and significance ( $p < 0.05$ ) indicated by (\*).



**Figure 3. Beta-diversity among different hatcheries in the larval and water microbiomes.** Non-metric multidimensional scaling (nMDS) plot based on Bray-Curtis resemblance matrices depicting differences in hatcheries between (A) larval and (B) water microbiomes. Ellipses represent  $\pm$  SE.



**Figure 4. Taxonomic composition of oyster larvae and water microbiomes.** Mean relative abundances of bacterial classes by hatchery and sample type (oyster, n =19; water, n =20). Only classes with > 1% relative abundance are shown.



**Figure 5. Taxonomic composition of larval core microbiome.** Mean relative abundances by hatchery of bacterial families in the larval core microbiome (oyster,  $n = 19$ ). Core microbiome is defined as OTUs found in 90% of oyster larvae samples.



**Table 1. Nutrient parameters of hatchery water.** Water samples were collected from each hatchery corresponding to different spawning events and larval development stages. Missing data points from sample collection are indicated by “NA”.

Hatchery	Spawn	Stage	NO <sub>3</sub> <sup>-</sup> (μM)	NH <sub>4</sub> <sup>+</sup> (μM)	PO <sub>4</sub> <sup>3-</sup> (μM)
A	1	D	5.43	0.36	1.16
		V	4.04	0.55	0.26
		PV	5.46	0.57	0.29
A	2	D	9.71	0.89	0.76
		V	20.75	0.48	1.14
		PV	11.90	0.31	0.72
B	1	D	15.51	0.68	0.32
		V	36.28	0.53	0.55
		PV	154.64	10.29	3.42
C	1	D	4.42	1.22	0.78
		V	12.59	2.02	1.96
		PV	17.11	7.74	3.06
C	2	D	NA	NA	NA
		V	48.18	2.70	6.10
		PV	63.58	12.56	8.55
D	1	D	14.52	11.71	0.72
		V	15.32	4.73	0.76
		PV	16.51	5.08	1.61
D	2	D	19.90	1.06	0.93
		V	0.43	0.69	0.18
		PV	0.45	2.21	0.29

**Table 2. Correlation between nutrients and microbiome richness and diversity.** Spearman rank correlations between nutrients and corresponding Chao richness and Shannon diversity in oyster larvae and water microbiomes. Significance is denoted in bold ( $p < 0.05$ ).

Sample Type	Nutrient	$\rho$ (rho)	p-value	$\rho$ (rho)	p-value
Oyster	NO <sub>3</sub> <sup>-</sup>	0.07	0.77	0.12	0.60
	NH <sub>4</sub> <sup>+</sup>	0.07	0.78	0.35	0.14
	PO <sub>4</sub> <sup>3-</sup>	-0.16	0.53	-0.09	0.72
Water	NO <sub>3</sub> <sup>-</sup>	-0.55	<b>0.02</b>	-0.24	0.34
	NH <sub>4</sub> <sup>+</sup>	-0.47	0.05	-0.46	0.06
	PO <sub>4</sub> <sup>3-</sup>	-0.49	<b>0.04</b>	-0.30	0.22

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Water	$\text{NO}_3^-$	-0.55	<b>0.02</b>	-0.24	0.34
	$\text{NH}_4^+$	-0.47	0.05	-0.46	0.06
	$\text{PO}_4^{3-}$	-0.49	<b>0.04</b>	-0.30	0.22

**Table 3. Differentially abundant OTUs between oyster larval microbiomes and water microbiomes.** OTUs were identified from DESeq2 using Benjamini Hochberg's p-adjusted values corrected for FDR. Only OTUs that were found to be significant (p<0.5) are listed. OTUs indicated in bold are OTUs found in the core larval microbiome. Larvae and water values given are mean relative abundances of OTUs.

OTU	Phylum	Class	Order	Family	Genus	log2Fold Change	p-adjusted value	Larvae*	Water*
Otu00009	<i>Tenericutes</i>	<i>Mollicutes</i>	<i>Mycoplasmatales</i>	<i>Mycoplasmataceae</i>	<i>Mycoplasma</i>	8.89	5.80E-05	4.92 ± 3.60	0
<b>Otu00031</b>	<i>Proteobacteria</i>	<i>Gammaproteobacteria</i>	<i>Incertae_Sedis</i>	<i>Incertae_Sedis</i>	<i>Marinicella</i>	2.87	2.80E-02	1.70 ± 0.48	0.07 ± 0.03
Otu00046	<i>Proteobacteria</i>	<i>Gammaproteobacteria</i>	<i>Cellvibrionales</i>	<i>Cellvibrionaceae</i>	<i>Simiduiia</i>	5.90	2.80E-02	0.50 ± 0.25	0
<b>Otu00060</b>	<i>Bacteroidetes</i>	<i>Flavobacteriia</i>	<i>Flavobacteriales</i>	<i>Cryomorphaceae</i>	<i>Fluviicola</i>	3.18	8.87E-03	0.76 ± 0.23	0.13 ± 0.07
Otu00086	<i>Proteobacteria</i>	<i>Gammaproteobacteria</i>	<i>Alteromonadales</i>	<i>Colwelliaceae</i>	Unclassified <i>Colwelliaceae</i>	5.18	4.44E-02	0.42 ± 0.24	0

\*Mean relative abundances < 0.01 are represented as 0

**Table 3. Differentially abundant OTUs between oyster larval microbiomes and water microbiomes.** OTUs were identified from DESeq2 using Benjamini Hochberg's p-adjusted values corrected for FDR. Only OTUs that were found to be significant (p<0.5) are listed. OTUs indicated in bold are OTUs found in the core larval microbiome. Larvae and water values given are mean relative abundances of OTUs.

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<b>Otu00031</b>	<i>Proteobacteria</i>	<i>Gammaproteobacteria</i>	Order_Incertae_Sedis	Family_Incertae_Sedis	<i>Marinicella</i>	2.87	2.80E-02	1.70 ± 0.48	0.07 ± 0.03
Otu00046	<i>Proteobacteria</i>	<i>Gammaproteobacteria</i>	<i>Cellvibrionales</i>	<i>Cellvibrionaceae</i>	<i>Simiduia</i>	5.90	2.80E-02	0.50 ± 0.25	0
<b>Otu00060</b>	<i>Bacteroidetes</i>	<i>Flavobacteriia</i>	<i>Flavobacteriales</i>	<i>Cryomorphaceae</i>	<i>Fluviicola</i>	3.18	8.87E-03	0.76 ± 0.23	0.13 ± 0.07
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