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2 **Identification of unique microbiomes associated with harmful algal blooms caused by**

3 *Alexandrium fundyense* and *Dinophysis acuminata*

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Abstract: Biotic interactions dominate plankton communities, yet the microbial consortia associated with harmful algal blooms (HABs) have not been well-described. Here, high-throughput amplicon sequencing of ribosomal genes was used to quantify the dynamics of bacterial (16S) and phytoplankton assemblages (18S) associated with blooms and cultures of two harmful algae, *Alexandrium fundyense* and *Dinophysis acuminata*. Experiments were performed to assess changes in natural bacterial and phytoplankton communities in response to the filtrate from cultures of these two harmful algae. Analysis of prokaryotic sequences from ecosystems, experiments, and cultures revealed statistically unique bacterial associations with each HAB. The dinoflagellate, *Alexandrium*, was strongly associated with multiple genera of Flavobacteria including *Owenweeksia* spp., *Maribacter* spp., and individuals within the NS5 marine group. While Flavobacteria also dominated *Dinophysis*-associated communities, the relative abundance of Alteromonadales bacteria strongly co-varied with *Dinophysis* abundances during blooms and *Ulvibacter* spp. (Flavobacteriales) and *Arenicella* spp. (Gammaproteobacteria) were associated with cells in culture. Eukaryotic sequencing facilitated the discovery of the endosymbiotic, parasitic dinoflagellate, *Amoebophrya* spp., that had not been regionally described but represented up to 17% of sequences during *Alexandrium* blooms. The presence of *Alexandrium* in field samples and in experiments significantly altered the relative abundances of bacterial and phytoplankton by both suppressing and promoting different taxa, while this effect was weaker in *Dinophysis*. Experiments specifically revealed a negative feedback loop during blooms whereby *Alexandrium* filtrate promoted the abundance of the parasite, *Amoebophrya* spp. Collectively, this study demonstrates that HABs formed by *Alexandrium* and *Dinophysis* harbor unique prokaryotic and eukaryotic microbiomes that are likely to, in turn, influence the dynamics of these HABs.

36 Keywords: *Alexandrium*, bacteria, *Dinophysis*, HAB, microbiome, microbial, sequencing

Introduction

The spatial and temporal expansion of harmful algal blooms (HABs) is a globally recognized phenomenon (Hallegraeff, 1993; Glibert et al., 2005). HABs associated with human health syndromes, for example, paralytic shellfish poisoning (PSP) and diarrhetic shellfish poisoning (DSP), are a growing human health and economic concern in many coastal regions (Anderson et al., 2008; Anderson et al., 2012). These dinoflagellate-related HABs can be associated with substantial economic losses due to the closure of shellfish beds containing toxic shellfish (Hoagland et al., 2002; Koukaras and Nikolaidis, 2004; Jin and Hoagland, 2008; Jin et al., 2008). Beyond economic effects, there is evidence that *Alexandrium* can cause significant alterations in estuarine plankton communities which may ultimately alter food webs, fisheries, and biogeochemical cycling (Weissbach et al., 2010; Hattenrath-Lehmann and Gobler, 2011; Weissbach et al., 2011; Weissbach et al., 2012; Hattenrath-Lehmann et al., 2015b). In New York, the PSP- and DSP-producing dinoflagellates, *Alexandrium* and *Dinophysis*, respectively, occur in succession (Hattenrath-Lehmann et al., 2013) and provide a unique opportunity to study potential shifts in plankton community composition over the course of successive toxin-producing blooms, which currently remains unknown.

Interactions among plankton assemblages play a central role in food web productivity, elemental cycling, and ecosystem function (Daly and Smith, 1993; Falkowski et al., 2008; Sunagawa et al., 2015; D'Alelio et al., 2016). Among phytoplankton, harmful algae utilize an array of ecological strategies to form blooms including the production of allelopathic chemicals and nutritional strategies such as mixotrophy that allow them to outcompete co-occurring phytoplankton (Smayda, 1997; Smayda, 2002; Glibert and Legrand, 2006). Further, bacteria are known to influence and be influenced by phytoplankton (Lima-Mendez et al., 2015; Ramanan et

al., 2016). Bacteria can affect harmful algal bloom formation, maintenance and termination by lysing harmful algae (Su et al., 2011; Inaba et al., 2013; Li et al., 2015b), inducing (Adachi et al., 1999; Adachi et al., 2003; Mayali et al., 2007) or preventing cyst formation (Adachi et al., 2002), altering physiology (Jauzein et al., 2015), and through symbiotic relationships (Croft et al., 2005; Kazamia et al., 2012). There is also evidence that bacteria degrade HAB toxins (Manage et al., 2009; Shetty et al., 2010) and influence toxin production (Albinsson et al., 2014; Lelong et al., 2014) in a variety of HAB species and some studies have documented bacterial modification of gene expression in HABs (Moustafa et al., 2010; Kazamia et al., 2012).

During HABs, the ability of a singular algal species to gain dominance is dependent upon physical, chemical and complex biological interactions within the planktonic community. To gain insight regarding the factors facilitating HABs, an assessment of the whole planktonic community is highly desirable as it provides information regarding competitive interactions among the HABs and plankton species as well as identifies indicator species that may precede or succeed the bloom species. High-throughput sequencing is an ideal tool for such an assessment as it can better identify rare, less abundant species and picoplankton compared to traditional light microscopy (Xiao et al., 2014). To date, only a few studies have utilized high-throughput sequencing to provide a detailed assessment of bacterial communities associated with HABs (Sison-Mangus et al., 2014; Li et al., 2015a; Yang et al., 2015), none of which has targeted the PSP- or DSP- producing dinoflagellates, *Alexandrium* and *Dinophysis*, respectively. In addition, none of these studies has used experimental approaches to understand the factors driving changes in planktonic communities associated with HABs, and the bacterial assemblages associated with the DSP-producing dinoflagellate, *Dinophysis*, have yet to be described.

Here, high-throughput amplicon sequencing was used to assess bacterial (16S) and phytoplankton assemblages (18S) associated with the harmful algae, *Alexandrium fundyense* and *Dinophysis acuminata*, during successive toxic blooms in Northport Bay, NY, USA. To gain insight regarding factors driving succession, experiments were performed assessing plankton community responses to filtrate from cultures of these two harmful algae. Finally, size fractionation was used to describe and compare free-living and potential epiphytic or intracellular bacterial assemblages in both blooms as well as cultures of *Alexandrium* and *Dinophysis*. Collectively, this study reveals a novel data set describing the unique microbiomes associated with each of these HABs, as well as the mechanism by which *Alexandrium* shapes its microbiome.

Materials and Methods

Study site sampling

Field samples were collected on a weekly basis from April through July during 2011 from a site in Northport Harbor, New York (40.8916°N, 73.3572°W; site 2, Hattenrath et al., 2010), which is a shallow (2 - 4 m), well mixed, eutrophic system within the southeastern portion of the Northport-Huntington Bay complex, located on the southern shore of Long Island Sound. During 2011, the *Alexandrium* bloom led to the closure of >7,000 acres of shellfish beds in Northport and Huntington Bays due to the presence of saxitoxin-contaminated shellfish. Further, while no closures were implemented, DSP toxins were found in shellfish throughout Northport Bay due to the presence of the okadaic acid-producing *Dinophysis* bloom (Hattenrath-Lehmann et al., 2013). Whole water samples were preserved in Lugol's iodine. Aliquots were settled in counting chambers and plankton were identified and enumerated using an inverted light microscope (Hasle, 1978). Cells larger than 10 µm were identified to at least genus level and grouped as autotrophic

nanoflagellates, dinoflagellates, and diatoms. Densities of *Dinophysis* were enumerated using a 1 mL Sedgewick-Rafter slide under a compound microscope using concentrated water samples preserved in Lugol's iodine as described in Hattenrath-Lehmann et al. (2013). Densities of *Alexandrium fundyense* were enumerated using a molecular probe developed by Anderson et al. (2005) and described in Hattenrath et al. (2010). Briefly, aliquots of phytoplankton concentrates (formalin and then methanol preserved) were hybridized with an oligonucleotide probe specific for the NA1 North American ribotype *Alexandrium fundyense/catenella/tamarense* (this particular ribotype of the *Alexandrium tamarense* species complex has recently been revised to *A. fundyense* (John et al., 2014)) with Cy3 dye conjugated to the 5' terminus (5'-/5Cy3/AGT GCA ACA CTC CCA CCA-3'). Cells were enumerated using a Nikon epifluorescence microscope with a Cy3™ filter set (Anderson et al., 2005).

For molecular analysis, whole seawater from Northport Harbor was filtered onto a 0.2µm polycarbonate filter and immediately frozen at -80°C. Additionally, in the field a 2L concentrated sample was created by filtering successively through a 200µm and 20µm mesh filter, backwashing onto a 20µm polycarbonate filter and immediately flash frozen in liquid nitrogen and stored at -80°C. Select sample dates were used to compare phytoplankton and bacterial assemblages in the 0.2 and 20 µm size fractions at the peaks of both the *Alexandrium* (9 May) and *Dinophysis* (27 June) blooms to compare free-living and particle-associated bacterial assemblages.

Cultures and culturing conditions

Locally isolated cultures, *Alexandrium fundyense* (NPB8; Northport Bay, NY) and *Dinophysis acuminata* (Meetinghouse Creek, NY) were used for this study (Hattenrath-Lehmann and Gobler, 2011; Hattenrath-Lehmann and Gobler, 2015). Algal cultures were grown in sterile *f/2* medium (Guillard and Ryther, 1962) with a salinity of 25 PSU, made with autoclaved and 0.2

µm-filtered aged coastal Atlantic Ocean water (40.79698N, 72.46068W), at 18°C in an incubator with a 12:12 h light:dark cycle, illuminated by a bank of fluorescent lights that provided a light intensity of ~100 µmol quanta m⁻² s⁻¹ to cultures. Given the previous documentation of negative effects of antibiotics on *Dinophysis* cultures (Hattenrath-Lehmann and Gobler, 2015), antibiotics (stock solution, Thermo Scientific HyClone Penicillin (10,000U/mL) Streptomycin (10,000µg/mL) in 0.85% NaCl) were only added to *Alexandrium* cultures at a final concentration of 1% by volume to discourage microbial contamination. The mixotrophic, *Dinophysis acuminata* culture was maintained by using a three-step culturing process (Park et al., 2006) as described in Hattenrath-Lehmann and Gobler (2015). For experiments (see *Filtrate experiments*), *Dinophysis* cultures were fed *M. rubrum* at a ~1:1 ratio four times during a two-week period (every three to four days) prior to the start of the experiment to ensure that cells were healthy and in exponential growth phase. To compare bacterial assemblages in cultures to those found in a natural phytoplankton community, aliquots of cultures were filtered onto 0.2µm (whole bacterial assemblage) and 20µm polycarbonate (to capture potentially epiphytic and cell-associated bacteria) filters and immediately frozen at -80°C. The bacteria captured on the 0.2 µm but not 20 µm filter were considered free-living bacterial assemblages, whereas those on the 20 µm filter only were considered attached, epiphytic, or intracellular.

Filtrate Experiments

Experiments were performed to assess the natural plankton community's response to the addition of environmentally relevant densities of *Alexandrium* and *Dinophysis*. While the allelopathic effects of *Alexandrium* on natural phytoplankton (Fistarol et al., 2004; Tillmann et al., 2009; Hattenrath-Lehmann and Gobler, 2011) and bacterial communities (Weissbach et al., 2010) have been examined, the allelochemical potential of *Dinophysis* is currently unknown. Filtrate

(0.2 μ m) was used for experiments (AlexADD and DinoADD= *Alexandrium* and *Dinophysis* addition experiments, respectively) to eliminate the introduction of bacteria into experimental treatments (Hattenrath-Lehmann and Gobler, 2011). During 2014, filtrate experiments were conducted with triplicate, 330ml bottles half-filled with unamended water from Northport Bay, NY, and half-filled with two types of filtrate (0.2 μ m) as follows: a control was established whereby half of the bottle was filled with 0.2 μ m filtered seawater, and for the treatment, half of the bottle was 0.2 μ m filtered *Alexandrium* (1,320 cells mL⁻¹ prior to filtration; 14 May) or *Dinophysis* (600 cells mL⁻¹ prior to filtration; 18 June) culture. Both Northport Bay water and cell-free *Alexandrium* and *Dinophysis* medium was obtained by gentle filtration (<5psi) through a sterile 0.2 μ m Millipore Steritop filter. To ensure that the effects seen by the addition of *Alexandrium* or *Dinophysis* filtrate were due to allelochemicals and not nutrients, saturating concentrations of N (88 μ M), P (3.6 μ M), and Si (88 μ M) as well as vitamins and trace metals (both at *f/2* concentrations) were added to all bottles. All experimental bottles were incubated at ambient light and temperature for 48 h in Shinnecock Bay at the Stony Brook Southampton Marine Science Center (Gobler et al., 2004). At the end of the incubation, contents of each experimental bottle was filtered onto 0.2 μ m polycarbonate filters that was then preserved as above for molecular analysis, and sequenced as individual biological replicates in triplicate.

DNA extraction, Illumina Sequencing and Analysis

To extract nucleic acids, 1 mL of cetyltrimethyl ammonium bromide (CTAB) buffer with fresh beta-mercaptonethanol was added to the 0.2 μ m and 20 μ m polycarbonate filters, vortexed, heated to 50°C for 20 minutes, and frozen at -80°C until processing. Genomic DNA extraction was performed using the CTAB method (Dempster et al., 1999). Following extraction, double-stranded DNA was quantified on a Qubit® fluorometer using a dsDNA BR Assay kit. Samples

174 were normalized to an equal quantity of DNA for sequencing and were sent to Molecular
 175 Research Labs (Shallowater, Texas, USA) for amplicon sequencing. The 16S rRNA gene V4
 176 variable region (~300bp) was amplified using bacterial primers A519F: 5'CAG CMG CCG CGG
 177 TAA and 802R: 5'TAC NVG GGT ATC TAA TCC (Klindworth et al., 2013). The V7/V8
 178 region of the 18S rRNA gene (~450bp) was amplified using primers 1183F: 5'AAT TTG ACT
 179 CAA CAC GGG and 1631aR: 5'TAC AAA GGG CAG GGA CG (Hadziavdic et al., 2014). For
 180 each sample, an identifying barcode was placed on the forward primer and a 30 cycle PCR using
 181 the HotStarTaq Plus Master Mix Kit (Qiagen, USA) was performed. The following PCR
 182 conditions were used: 94°C for 3 minutes, followed by 28 cycles of 94°C for 30 seconds, 53°C
 183 for 40 seconds and 72°C for 1 minute, and a final elongation step at 72°C for 5 minutes.
 184 Successful amplification was determined by visualizing PCR products using a 2% agarose gel.
 185 Samples (27 for 18S and 31 for 16s, Table S1 and S2, respectively) were pooled together for
 186 each respective primer region in equal proportions based on their molecular weight and DNA
 187 concentrations. Pooled samples were then purified using calibrated Ampure XP beads and
 188 subsequently used to prepare a DNA library by following Illumina TruSeq DNA library. Paired-
 189 end (2x300) sequencing was performed on an Illumina MiSeq following the manufacturer's
 190 guidelines. Sequence data was processed using the Quantitative Insights Into Microbial Ecology
 191 v1.9.1 pipeline (QIIME, <http://qiime.org>; Caporaso et al., 2010b). Raw sequences were depleted
 192 of barcodes, paired-end reads joined, depleted of primers, demultiplexed, and quality filtered
 193 using the default parameters in QIIME. The resulting quality filtered sequences were then
 194 clustered into operational taxonomic units (OTUs) at 97% similarity with UCLUST (Edgar,
 195 2010) using the open reference clustering protocol and SILVA release v119 ([http://www.arb-
 196 silva.de/](http://www.arb-silva.de/)) as the reference set. The representative sequence set was aligned using PyNAST

(Caporaso et al., 2010a) and taxonomically classified using UCLUST (Edgar, 2010). For 18S specifically, all non-algal OTUs were not considered in order to focus specifically on algal assemblages. Since species specificity with the QIIME pipeline was typically not possible, representative sequences for the most abundant OTUs were extracted and species specificity (percent identity) was determined using BLAST. In some cases, algal species were not identified (i.e. *Thalassiosira* spp.) due to multiple species having 100% identity with sequences. Similarly, for 16S, since our focus was on prokaryotes, all chloroplast and mitochondria (Table S2) related sequences were removed from OTU tables and not further considered in analyses.

For the V7/V8 region of the 18S rDNA, the 27 samples generated 2,847,120 paired end reads with an amplicon size of ~450bp. After quality filtering and joining reads a total of 2,035,933 reads clustered at 97% identity into 24,004 OTUs. Overall, algae represented 35 to 98% of total reads (prior to removal of non-algal OTUs) with an average of 86% for all 27 samples (Table S1). For the 519F/802R region of 16S rDNA, the 31 samples generated 4,458,146 paired end reads with an amplicon size of ~300bp. After quality filtering and joining reads a total of 3,676,342 reads clustered at 97% identity into 47,760 OTUs (Table S2). The 921,186 and 45,876 reads assigned as chloroplasts and mitochondria, respectively, were removed from the dataset and not considered in analyses (Table S2).

Statistical Analysis

Multivariate statistical analyses were conducted using PAST v3.11 (Hammer et al., 2001). Specifically, a similarity percentage (SIMPER) using Bray-Curtis metrics was conducted to determine the taxa responsible for differences in relative abundances between groups and principal component analyses (PCA) were also conducted to determine the groups of variables that behaved in a similar manner. Non-metric multidimensional scaling (NMDS) using a Bray-

Curtis metric was conducted in RStudio (vegan package, metaMDS) to assess the similarity of bacterial community composition among all samples. Student t-tests were used to compare arcsine square root transformed data of relative abundance data sets using Sigma Plot 11.0. If data failed normality, non-parametric, Mann-Whitney U-tests were used for such comparisons.

Results

Phytoplankton and bacterial assemblages of Northport Bay

During spring 2011, *Alexandrium fundyense* was present in Northport Harbor from late March through late May, with peak densities occurring on 9 May (25,300 cells L⁻¹) and a smaller secondary peak (6,600 cells L⁻¹) on 16 May (Fig. 1A). A *Dinophysis acuminata* bloom succeeded the *Alexandrium* bloom with maximal densities occurring on 27 June (1.3 million cells L⁻¹) with cells present from late April through September (Fig. 1A). Mean (\pm SD) temperature and surface salinities were 15.8 \pm 1.4°C and 23.9 \pm 0.4 during the peak of the *Alexandrium* bloom (3 – 16 May), and 22.8 \pm 1.4°C and 23.4 \pm 0.3 during the peak of the *Dinophysis* bloom (21 June -6 July). Mean (\pm SD) nitrate, ammonium, phosphate and silicate concentrations were 14.4 \pm 6.3 μ M, 2.2 \pm 2.1 μ M, 0.9 \pm 0.4 μ M and 26.6 \pm 8.2 μ M during the peak of the *Alexandrium* bloom, and 7.4 \pm 7.3 μ M, 0.7 \pm 0.6 μ M, 0.8 \pm 0.7 μ M and 37.1 \pm 18.5 μ M during the peak of the *Dinophysis* bloom. Water column temperature was the only physio-chemical parameter that differed between the blooms being significantly higher during the peak of the *Dinophysis* bloom (t-test; p<0.001).

Over the course of the time series, phytoplankton community sequence diversity changed dramatically (Fig. 1B, C). In late April, Bacillariophyceae (diatoms) represented 64% of the algal, V7/V8 sequences (Fig. 1B) being comprised mostly of *Skeletonema* spp. (29%) and *Rhizosolenia setigera* (22%; Fig. 1C). During the peak of the *Alexandrium* bloom (3 – 16 May; Fig. 1A), the community shifted to one dominated by the class Dinophyceae (dinoflagellates; 21-

78%) and Litostomatea (*Mesodinium rubrum* was the only member present within this class; 2-69%; Fig. 1B). During the *Alexandrium* bloom, the dinoflagellate community was a mixed assemblage dominated by *Heterocapsa rotundata* (1-9%), *Heterocapsa triquetra* (1-21%), *Amoebophrya* spp. (1-17%) and *Alexandrium* (1 - 3%; Fig. 1C). During the demise of the *Alexandrium* (1 June) bloom, the algal community briefly shifted back to a diatom-dominated community (58-75%) comprised mostly of *Thalassiosira* spp. (28-46%) and *Skeletonema* spp. (13-20%) before reverting back to a dinoflagellate-dominated (30-90%) community during the peak of the *Dinophysis* bloom (21 June- 6 July; Fig. 1) and beyond. In contrast to *Alexandrium*, during the peak of the *Dinophysis* bloom, *Dinophysis* represented the majority of algal sequences (24-70%; Fig. 1). At the phyla level, a similarity percentages analysis (SIMPER) identified Litostomatea (38%), Dinophyceae (30%) and Bacillariophyceae (27%) as the primary drivers (cumulative=95%; average dissimilarity=53.66) of differences between the peak *Alexandrium* and peak *Dinophysis* communities (Fig. 1). At the genus-species level, *Dinophysis acuminata* (29%), *Mesodinium rubrum* (26%), *Skeletonema* spp. (14%) and *Amoebophrya* spp. (6%) accounted for 75% of the differences seen between the two bloom communities (SIMPER, average dissimilarity=77.78; Fig. 1).

Over the course of both blooms the phyla Bacteroidetes (24-37%) and Proteobacteria (41-60%) were the dominant contributors to the bacterial community (Fig. 2B). Within the phyla Bacteroidetes, the order Flavobacteriales comprised 20-32% of 519F/802R sequences (Fig. 2C) and within the phyla Proteobacteria, Rhodobacterales (9-15%), Rickettsiales (1-8%) and SAR11 clade (2-11%) of the Class Alphaproteobacteria, and Alteromonadales (3-8%) and Oceanospirillales (4-10%) of the Class Gammaproteobacteria dominated (Fig. 2C). At the phyla level, a similarity percentages (SIMPER) analysis identified ‘Unassigned’ (43%), Proteobacteria

(31%) and Bacteroidetes (17%) as the primary drivers (cumulative=91%; average dissimilarity=21.57) of differences between the peak *Alexandrium* and peak *Dinophysis* bacterial communities (Fig. 2). During the peak of the *Alexandrium* bloom, the relative abundances of Proteobacteria and Bacteroidetes were significantly (t-test, $p<0.01$) greater than during the *Dinophysis* bloom, while the relative abundances of ‘Unassigned’ sequences were significantly (t-test, $p<0.001$) lower (Fig. 2B). At the order level, ‘Unassigned’ (41%), Flavobacteriales (18%) and SAR11 clade (13%) account for 72% of the differences seen between the two bloom communities (SIMPER, average dissimilarity=22.36; Fig. 2C). The relative abundances of Flavobacteriales and the SAR11 clade were significantly (t-test, $p<0.01$) greater during the *Alexandrium* bloom compared to during the *Dinophysis* bloom (Fig. 2C). At the genus level, the NS5 marine group (11%) and an uncultured bacterium (Rhodobacteracea; 11%) were the dominant sequences during the peak of the *Alexandrium* bloom while the peak of the *Dinophysis* bloom was dominated by ‘Unassigned’ sequences (21%; Table 1).

Phytoplankton and bacterial assemblages differed across size fractions (0.2 μ m vs. 20 μ m) during the peak of the *Alexandrium* (9 May) and *Dinophysis* (27 June) blooms (Fig. 3). Among phytoplankton, while Litostomatea (= *Mesodinium*; 69%) and Dinophyceae (21%) dominated the 0.2 μ m size fraction, Dinophyceae (82%) dominated the 20 μ m fraction at the peak of the *Alexandrium* bloom (9 May; Fig. 3A). At the genus/species level, *Mesodinium rubrum* (69%) and *Amoebophrya* spp. (14%) dominated the whole community while *Alexandrium fundyense* and *Amoebophrya* spp. comprised 23 and 41% of the 20 μ m size fraction, respectively (Fig. 3B). The relative abundances of Proteobacteria and Bacteroidetes shifted from 59 to 76%, and 34 to 14% in the 0.2 and 20 μ m size fractions, respectively (Fig. 3C). At the order-level, the major drivers of differences (SIMPER) between the size fractions were the Flavobacteriales,

Rhodobacterales and ‘other’ bacteria which shifted from 32 to 11%, 15 to 6% and 19 to 58%, in the 0.2 and 20 μm size fractions, respectively (Fig. 3D). At the genus level, the NS5 marine group (Flavobacteriales) dominated 0.2 μm size fraction while the *Perlucidibaca* (Gammaproteobacteria, Moraxellaceae) dominated the 20 μm size fraction (Table 1). The peak of the *Dinophysis* bloom (27 June) was dominated by Dinophyceae (>90%), specifically *Dinophysis acuminata* (>70%), in both the 0.2 and 20 μm size fractions (Fig. 3A, B). The relative abundances of Proteobacteria and Bacteroidetes shifted from 44 to 53%, and 28 to 17% in the 0.2 and 20 μm size fractions, respectively (Fig. 3C). At the order-level, the major drivers of differences (SIMPER) between the size fractions were the Rickettsiales, Flavobacteriales, and Rhodobacterales which shifted from 3 to 13%, 22 to 13% and 15 to 7%, in the 0.2 and 20 μm size fractions, respectively (Fig. 3D).

Filtrate experiments using natural communities

The addition of *Alexandrium* filtrate significantly altered both bacterial and phytoplankton assemblages of Northport Bay (Fig. 4). Specifically, for bacterial sequences, the addition of *Alexandrium* filtrate yielded a community in which the relative abundances of Bacteroidetes were significantly (t-test, $p < 0.001$) greater, while Proteobacteria, Cyanobacteria, ‘other’ bacteria and ‘Unassigned’ relative abundances were significantly (t-test, $p < 0.01$) lower compared to the control (Fig. 4). At the order level, the addition of *Alexandrium* filtrate caused the relative abundances of Flavobacteriales to significantly (t-test, $p < 0.001$) increase, while Rhodobacterales, Rickettsiales, the SAR11 clade, Alteromonadales, Oceanospirillales, ‘other’ bacteria, and ‘Unassigned’ relative abundances all significantly decreased (t-test, $p < 0.05$) compared to controls (Fig. 4). The addition of *Alexandrium* filtrate significantly (t-test, $p < 0.05$) decreased an ‘uncultured bacterium’ from the Rhodobacterales while significantly (t-test,

p<0.05) increasing the relative abundances of *Owenweeksia* spp. and the NS5 marine group. The *Alexandrium* filtrate treatment was dominated by sequences of the NS5 marine group and *Owenweeksia* spp, both from the Flavobacteriales, while ‘Unassigned’ and an ‘uncultured bacterium’ from the Rhodobacterales dominated the control (Table 1). In regards to algal sequences, the addition of *Alexandrium* filtrate significantly (t-test, p<0.001) increased relative abundances of Dinophyceae and Dictyochophyceae but significantly (t-test, p<0.05) decreased relative abundances of Litostomatea (*Mesodinium*) and ‘other’ phytoplankton (Fig. 4). The addition of *Alexandrium* filtrate led to a significant increase in the relative abundances of *Amoebophrya* spp., Dictyochophyceae, ‘other Dinophyceae’ and *Gyrodinium* spp. (t-test, p<0.05), while *Mesodinium rubrum* and ‘other algae’ relative abundances significantly decreased (t-test, p<0.05; Fig. 4). The addition of *Dinophysis* filtrate caused no significant changes in the relative abundances among bacterial or phytoplankton sequences at any level of classification.

Bacterial assemblages associated with cultures

The relative abundances of bacterial sequences differed between size fractions in both *Alexandrium* and *Dinophysis* cultures (Fig. 5). In *Alexandrium* cultures, Bacteroidetes and Proteobacteria were the most abundant, with relative abundances of Bacteroidetes being 85% in the 0.2µm size fraction and 65% in the 20µm size fraction and Proteobacteria being 13 and 32% in these two fractions, respectively (Fig. 5A). At the order-level, Flavobacteriales dominated both size fractions, with relative abundances of 82 and 63% in the 0.2 and 20µm size fractions, respectively (Fig. 5B). The dominant bacterial genus in *Alexandrium* cultures was *Maribacter* spp. (Order Flavobacteriales) with relative abundances of 65% and 50% in the 0.2 and 20µm size fractions (Table 1). In *Dinophysis* cultures, Proteobacteria and Bacteroidetes were also the most abundant sequences present, with relative abundances of 76 and 59%, and 11 and 35% in the 0.2

and 20µm size fractions, respectively (Fig. 5A). At the order-level, Rhodobacterales and Flavobacteriales were the dominant sequences in *Dinophysis* cultures, with relative abundances of 39 and 17%, and 7 and 31% in the 0.2 and 20µm size fractions, respectively (Fig. 5B). Genus specific information demonstrates that *Arenicella* spp. (Gammaproteobacteria; 22%) and *Ulvibacter* spp. (Flavobacteriales; 23%) dominated the 0.2 and 20 µm size fractions of *Dinophysis* cultures, respectively (Table 1).

Discussion

Interactions among plankton shape the succession of communities and broadly influence food web dynamics. Bacteria play a central role in marine food webs and engage in complex interactions with phytoplankton (Falkowski et al., 2008; de Vargas et al., 2015; Lima-Mendez et al., 2015; Sunagawa et al., 2015; Ramanan et al., 2016). An important first step in describing phytoplankton-bacterial interactions and associations is identifying the covariance of members within these assemblages. Traditional microscopy, however, often underestimates phytoplankton species diversity (Xiao et al., 2014) and dated methodologies such as terminal restriction fragment length polymorphisms (TRFLP) and denaturing gradient gel electrophoresis (DGGE) fail to completely and/or accurately describe bacterial community composition (Zhang et al., 2007; Koch et al., 2014; Samarajeewa et al., 2015). In contrast, the use of high-throughput amplicon sequencing during this study allowed for a precise assessment of bacterial (16S) and phytoplankton assemblages (18S) associated with blooms of two harmful algal species, *Alexandrium fundyense* and *Dinophysis acuminata*. Prokaryotic sequences in field, experimental, and culture samples revealed unique bacterial consortia associated with *Alexandrium* and *Dinophysis*. Further, the use of 18S sequencing revealed less abundant as well as difficult to identify species, such as the parasitic dinoflagellate, *Amoebophrya* spp.

Collectively, these findings describe the precise microbiome associated with these HABs and the extent to which they are shaped by these HABs.

The amplicon sequencing of the V7/V8 region of 18S rDNA during this study provided a series of novel insights that microscopy could not have facilitated. For example, sequencing revealed the presence of picoplankton (i.e. *Picomonas* spp.), algae that do not preserve well for microscopy (i.e. *Heterosigma akashiwo*; Chang et al., 1990), and the dominance of the parasitic dinoflagellate, *Amoebophrya* spp. The dinoflagellate, *Amoebophrya* is ~5µm in its free-living infectious dinospore form, intracellular in its trophont form, and short-lived in its free-swimming vermiform stage (Park et al., 2013; Velo-Suárez et al., 2013). Globally, *Amoebophrya* spp. is known to cause the demise of *Alexandrium fundyense* blooms (Taylor, 1968; Velo-Suárez et al., 2013; Brosnahan et al., 2015), but has never been observed in association with *Alexandrium* blooms in the mid-Atlantic region of the US, despite decades of *Alexandrium* studies in this region (Schrey et al., 1984; Colin and Dam, 2002; Hattenrath et al., 2010; Hattenrath-Lehmann and Gobler, 2011; Hattenrath-Lehmann et al., 2015b; Zhuang et al., 2015). In the present study, however, *Amoebophrya* was found to be universally present and, at times, highly abundant in field samples, accounting for up to 17% of 18S sequences. It was not, however, observed microscopically. Considering the higher relative abundance (1-17%) of *Amoebophrya* during the peak of the *Alexandrium* bloom and its greater dominance (41%; Fig. 3) in the >20µm size fraction relative to the 0.2µm fraction, it is likely that *Alexandrium* was its target host (Velo-Suárez et al., 2013). Given the presence of *Heterocapsa triquetra* during the peak and demise of the *Alexandrium* bloom and the presence of *Amoebophrya* after the demise of the *Alexandrium* bloom, and the inability of dinospores to survive >10 days in the water column (Coats and Park, 2002), *H. triquetra* may have been a secondary host. Alternatively, there may have been

different strains of *Amoebophrya* infecting each of these dinoflagellates given host-specificity for this parasite is known to be at the species or strain level (Coats et al., 1996; Coats and Park, 2002; Park et al., 2013). The discovery of *Amoebophrya* spp. in this region is ecologically relevant given its role in the occurrence, duration, and termination of these toxic HABs (Velo-Suárez et al., 2013; Brosnahan et al., 2015; Ralston et al., 2015) and was facilitated specifically by the high-throughput sequencing approach used here.

Many species of the *Alexandrium* are known to be allelopathic (Tillmann et al., 2009). During this study, consistent with prior studies in this system (Hattenrath-Lehmann and Gobler, 2011; Hattenrath-Lehmann et al., 2015b), a clear allelopathic signal was observed in the field as during the peak of the *Alexandrium* bloom diatoms levels significantly decreased compared to before and after the *Alexandrium* bloom. In addition, *Alexandrium* filtrate, presumably enriched in allelochemicals (Fistarol et al., 2004; Tillmann et al., 2009; Hattenrath-Lehmann and Gobler, 2011), significantly decreased the relative abundance of ‘other algae’ and *Mesodinium rubrum* but significantly enhanced the relative abundances of *Amoebophrya* spp. and *Gyrodinium* spp. Consistent with this, prior studies of the same *Alexandrium* species using microscopy demonstrated it was capable of enhancing dinoflagellate densities while allelopathically depressing diatom and nanoflagellate abundances (Hattenrath-Lehmann and Gobler, 2011) as well as *Mesodinium* densities (Fistarol et al., 2004). The higher relative abundance of *Amoebophrya* spp. in response to *Alexandrium* allelochemicals has not been previously reported, but may represent a host-parasite cellular signaling mechanism (Yoshino et al., 2001; Hemphill et al., 2006; Ressurreição et al., 2016). In an ecosystem setting, this would create a negative feedback loop during *Alexandrium* blooms whereby increasing *Alexandrium* densities and allelochemicals may ultimately promote infections by *Amoebophrya* spp. and lead to bloom

demise. This hypothesis is consistent with observations in the Northeast US (i.e. New England) where *Amoebophrya* spp. plays a prominent role in the demise of *Alexandrium* blooms (Velo-Suárez et al., 2013; Brosnahan et al., 2015; Ralston et al., 2015). While the effects of *Alexandrium* on planktonic organisms vary, it is clear that *Alexandrium* can shape phytoplankton communities via inhibiting or promoting the growth of other algae.

While the sequencing of 18S rDNA facilitated a series of new discoveries during this study, some differences between sequencing analyses and microscopy were detected (Fig. S1). In some cases, sequencing was not species-specific (e.g. *Thalassiosira* spp., *Prorocentrum* spp.) while in other cases, for certain taxa (Euglenoids), genes were not amplified during sequencing but species were quantifiable via microscopy (Fig. S1). These issues are likely, in part, due to informatic shortcomings as the current eukaryotic SILVA database does not contain sequences for some genera or species (i.e. *Prorocentrum gracile*, *Eutreptiella* spp.) that were identified via light microscopy in our samples. These issues could also be related to the primers used in this study as even ‘universal’ primers do not amplify all taxa (Hadziavdic et al., 2014) with additional primer sets and regions of interest (e.g. ITS, *cox1*, *rbcL* regions) needed to attain species-specificity within particular genera (e.g. Raho et al., 2008; Hamsher et al., 2013; Fernandes et al., 2014; Wallace and Gobler, 2015). Further, it is possible that differences between sequencing and microscopy could arise from species specific differences in copies of rDNA (Zhu et al., 2005; Godhe et al., 2008). Of specific concern is the high copy numbers of rDNA in eukaryotes with larger genomes (Prokopowich et al., 2003) such as that commonly seen in dinoflagellates (Zhu et al., 2005). We attempted to circumvent this potential issue, however, by using relative abundances in effort to normalize for these differences. Further, we note that, beyond the close correspondence between OTUs and microscopically quantified dinoflagellates

of interest the ability to observe the *Alexandrium* allelopathic signal (as mentioned above) in the dynamics of field populations gives us confidence in our approach indicating that high or variable copy numbers of dinoflagellates did not obfuscate environmentally important trends such as allelopathy. The increased diversity and, in some cases, lack of species specificity with sequencing compared to microscopy was also demonstrated by Xiao et al. (2014), who therefore recommended using dual amplicon sequencing and microscopy approaches for maximal detection and identification.

In a manner consistent with prior studies of HABs including *Cochlodinium polykrikoides*, *Alexandrium* spp., *Pseudonitzschia* spp., and *Akashiwo sanguinea* (Wichels et al., 2004; Jasti et al., 2005; Kaczmarek et al., 2005; Garces et al., 2007; Hasegawa et al., 2007; Sison-Mangus et al., 2014; Park et al., 2015; Yang et al., 2015), bacterial populations associated with *Alexandrium* and *Dinophysis* cultures, field samples, and experiments were dominated by Proteobacteria (alpha- and gammaproteobacteria) and Bacteroidetes (Flavobacteria). A principal component analysis (PCA) comparing *Alexandrium* and *Dinophysis* abundances with the relative abundances of bacterial (16S) sequences revealed that both HABs were associated with specific bacterial groups. At the order-level, 73% of the data set was explained by three principal components. The first principal component (PC 1) explained 40% of the variance and was comprised of *Alexandrium* densities, Flavobacteriales, the SAR11 clade (alphaproteobacteria) and Oceanospirillales (gammaproteobacteria; Table 2). PC2 explained an additional 19% of the variance with *Dinophysis* abundances and Alteromonadales (gammaproteobacteria) co-varying together and being inversely correlated to Rickettsiales (alphaproteobacteria; Table 2). Finally, in PC3 ‘other bacteria’ and Rhodobacterales (alphaproteobacteria) co-varied together and were

inversely correlated to ‘unassigned bacteria’ and explained an additional 14% of the variance (Table 2).

While both *Alexandrium* and *Dinophysis* cultures and field populations were dominated by Proteobacteria (alpha- and gammaproteobacteria) and Bacteroidetes (Flavobacteria), these HABs had distinct microbiomes. Consistent with PC1 of the PCA, the relative abundances of Flavobacteriales and the SAR11 clade were significantly greater during the *Alexandrium* bloom compared to during the *Dinophysis* bloom, and in cultures of *Alexandrium*, Flavobacteriales (Fig. 5) represented the majority of sequences (>63%) of both size fractions indicating that they were primarily epiphytic and/or intracellular associated. At the genus-level, the NS5 marine group (Flavobacteriales), an uncultured bacterium (Rhodobacteracea), and *Owenweeksia* spp. were commonly the dominant genera among *Alexandrium*-associated field samples with *Perlucidibaca* spp. (order Pseudomonadales) and *Limnobacter* spp. (order Burkholderiales) found at the peak of the *Alexandrium* bloom in the >20micron size fraction. Further, *Alexandrium* cultures were dominated by the Flavobacteria, *Maribacter* spp., which represented 65% and 50% of the whole and >20 µm size fractions, respectively, the latter suggesting a direct cellular association (Table 1). In contrast, *Dinophysis* had a greater association with Proteobacteria and ‘unassigned bacteria’ (Table 1). For example, ‘unassigned bacteria’ and an uncultured bacterium (Rhodobacteracea) dominated *Dinophysis* related field samples. In addition, *Marivita* spp. (order Rhodobacterales), *Arenicella* spp. (Gammaproteobacteria), and *Ulvibacter* spp. (order Flavobacteriales) were found in cultures of *Dinophysis* (Table 1), with the latter two genera found in the >20 µm size fraction and thus directly associated with cells. Given that our cultures of *Dinophysis* are incapable of survival when exposed to even modest levels of antibiotics (Hattenrath-Lehmann and Gobler, 2015), it is plausible that these bacteria may have an

important, nutritional, symbiotic relationship with this alga (Croft et al., 2005). Further, while the microbiome of *Dinophysis* prey in culture may alter the bacterial communities, given the high similarity of the bacterial communities in the two size fractions in culture (Fig. 6) it would seem the prey do not appreciably contribute to *Dinophysis* microbiomes. Collectively, high-throughput sequencing revealed the unique microbiomes of these HABs.

The positive association between *Alexandrium* and the Flavobacteriales identified in PC1 was also evident during incubation experiments. *Alexandrium* filtrate significantly suppressed some Proteobacteria (e.g. Rhodobacterales, Rickettsiales, the SAR11 clade, Alteromonadales, Oceanospirillales) but strongly promoted the relative abundance of *Owenweeksia* spp. and the NS5 marine group, both Flavobacteriales (Table 1, Fig. 4). Among the Flavobacteriales, the impact of *Alexandrium* filtrate on *Owenweeksia* spp. was the most remarkable as filtrate (22%) enhanced relative abundances 11-fold compared to the control (2%) over the 48 h experiment. Similarly, through TRFLP analysis, Weissbach et al. (2010) demonstrated that continuous additions of the two strains of *Alexandrium* resulted in bacterial communities that differed from untreated communities. Moreover, the enhancements of Flavobacteria with the addition of *Alexandrium* filtrate is consistent with observations during *Alexandrium* blooms and in cultures as Flavobacteria made up a significant portion of these communities. In addition, some of these effects could have also been due to bacterial stimulation via the introduction of organic matter either leaked from *Alexandrium* cells and thus in the filtrate itself or from allelopathically lysed phytoplankton due to the presence of *Alexandrium* during blooms. Both such processes occur during *Alexandrium* blooms and thus are likely to contribute to the close correspondence between bacterial communities established during experiments and blooms.

The consistency of bacterial clade-HAB associations among the field samples, experiments, and in culture evidences the ability of these dinoflagellates to shape surrounding bacterial communities. Non-metric multidimensional scaling (NMDS) analyses revealed that bacterial communities associated with *Dinophysis* and *Alexandrium* during blooms, experiments, and in culture were distinct and statistically different from each other at both the order- and genus-level (Fig 6). The single exception to this was bacteria from the *Dinophysis* experiment (DINOADD) where the control and filtrate treatment grouped closely to each other and were not significantly different (Fig. 6), supporting the hypothesis that *Dinophysis* has weaker control of bacterial communities compared to *Alexandrium*. Regardless, bacterial communities do seem to play a significant role in *Dinophysis* survival as the addition of antibiotics was found to be lethal to *Dinophysis* cultures (Hattenrath-Lehmann and Gobler, 2015). At the genus-level, field-based samples (including experiments) were more closely related to one another than both cultures, with the *Dinophysis* culture being more similar to the field samples than the *Alexandrium* culture, a finding likely related to the presence of antibiotics in *Alexandrium*, but not in *Dinophysis*, cultures (Fig. 6). Further, we note that the low levels of antibiotics added upon initial inoculation of the stock *Alexandrium* culture (see methods) likely degraded during the two weeks prior to collecting samples for sequencing bacterial amplicons in cultures and creating filtrate for experiments (Kummerer, 2009). Bacteria associated with *Dinophysis* and *Alexandrium* blooms and experiments were also clearly and statistically separated from each other, supporting the concept that each of these HABs is associated with their own core microbiome (Sunagawa et al., 2015). Finally, NMDS revealed the manner in which *Alexandrium* filtrate transformed bacterial communities as at the order- and genus-level the

experimental addition of *Alexandrium* filtrate resulted in a bacterial community statistically distinct from the control treatment (Fig 6).

While sequencing of field, experimental, and culture samples revealed unique bacterial associations with the HABs formed by *Alexandrium* and *Dinophysis*, precise algal-bacterial interactions are uncertain but can be hypothesized from the literature. For example, bacteria from the *Alteromonas* group have been shown to inhibit cyst formation in *Alexandrium* (Adachi et al., 1999; Adachi et al., 2002; Adachi et al., 2003) and displayed decreasing relative abundance over the course of the bloom which may have allowed cyst formation at the end of this event (Anglés et al., 2012). Flavobacteria, the most abundant group found in a majority of the field, experimental, and culture samples, especially those associated with *Alexandrium*, are known to facilitate macromolecule conversion (Buchan et al., 2014). Teeling et al. (2016), for example, found an increase in the gene frequency and diversity of carbohydrate-active enzyme families associated with increased relative abundances of Flavobacteria during the spring bloom in the North Sea. More specifically, they found that the NS5 marine group, which was a dominant group in bloom samples (Table 1), was rich in glycoside hydrolase family fucosidases (Teeling et al., 2016). Hence, these bacteria may play a role in nutrient and organic matter cycling during *Alexandrium* and *Dinophysis* blooms which are strongly promoted by organic compounds and regenerated forms of nutrients (Hattenrath et al., 2010; Hattenrath-Lehmann et al., 2015a).

The use of high throughput sequencing during this study provided a more detailed assessment of bacterial communities associated with HABs than previously described. In some cases, findings here were consistent with prior studies using older technologies. For example, Adachi et al. (2003) found that Pseudomonads co-dominated *Alexandrium* blooms in Japan,

while during this study *Pseudomonas* spp. was associated with the >20 μ m size fraction of *Alexandrium* cultures and thus likely attached or intracellular (Table 1). In contrast to some prior studies using older technologies (plate isolation, DGGE, FISH) concluded that bacteria from the Roseobacter clade were a dominant bacteria associated with *Alexandrium* (Adachi et al., 2003; Wichels et al., 2004; Jasti et al., 2005; Garces et al., 2007). During this study, Roseobacter (order Rhodobacterales), while present in all samples, was not dominant within *Alexandrium* cultures or field samples (<1% of OTUs). This difference is partly expected as older technologies were incapable of describing whole microbial communities. The present study, therefore, represents a novel data set as high-throughput sequencing has not been used to describe microbial communities associated with *Alexandrium* or *Dinophysis*, in an ecosystem setting or in culture.

High-throughput sequencing studies continue to expand our understanding of planktonic communities (de Vargas et al., 2015; Lima-Mendez et al., 2015; Sunagawa et al., 2015; Yang et al., 2015). Ocean sequencing studies such as the Tara Oceans study have demonstrated that global eukaryotic diversity has yet to be fully described (de Vargas et al., 2015) but that biotic interactions are better predictors of prokaryotic and eukaryotic community structure than abiotic factors (Lima-Mendez et al., 2015). Bacteria are known to influence and be influenced by phytoplankton (Bratbak and Thingstad, 1985; Lima-Mendez et al., 2015; Ramanan et al., 2016), and anthropogenic nutrient loading and climate change are facilitating a global expansion of HABs (Heisler et al., 2008; Hallegraeff, 2010; Anderson et al., 2012, Gobler et al. submitted). Going forward, high-throughput sequencing will be an important tool for assessing the manner and extent to which anthropogenic processes influence interactions among HABs and bacterial communities.

In summary, this study defined distinct microbiomes associated with HABs formed by the toxic dinoflagellates *Alexandrium* and *Dinophysis*. While *Alexandrium* was found to directly and strongly shape bacterial and algal communities, microbial communities associated with *Dinophysis* were more likely a consequence of prevailing biogeochemical conditions and/or other biotic interactions. While some members of the microbial consortia associated with these HABs may aid in promoting these events (e.g. nutrient and organic matter regeneration by Flavobacteria), others may promote bloom demise (e.g. *Amoebophrya* spp). Regardless, the identification of the precise microbiome associated with each of these HABs opens a series of new lines of research to better understand the interactions among microbes during these events.

Acknowledgements

We would like to thank Jennifer Jankowiak and Tony Walters for assistance with R code and QIIME troubleshooting, respectively. We are grateful for financial support from NOAA's Monitoring and Event Response to Harmful Algal Blooms (MERHAB) program (NA11NOS4780027) as well as grants from the Chicago Community Trust and the Rauch Foundation.

578 **Tables**

579 **Table 1.** Dominant genus in size fractionated field, experimental and culture samples based on
 580 relative abundances of 16S sequences. AlexADD= *Alexandrium* filtrate addition experiment.

Sample	Size fraction (μm)	Dominant lineages	Relative abundance (%)
<u>Alexandrium peak</u>			
(3-May to 16-May)	0.2	NS5 marine group (Flavobacteriales)	11
		Rhodobacteracea_uncultured bacterium (Rhodobacterales)	11
		<i>Owenweeksia</i> (Flavobacteriales)	7
<u>Dinophysis peak</u>			
(21-June to 6-July)	0.2	Unassigned	21
		Rhodobacteracea_uncultured bacterium (Rhodobacterales)	7
		<i>Owenweeksia</i> (Flavobacteriales)	5
		NS5 marine group (Flavobacteriales)	5
<u>AlexADD experiment</u>			
Control	0.2	Unassigned	12
		Rhodobacteracea_uncultured bacterium (Rhodobacterales)	9
		NS5 marine group (Flavobacteriales)	9
+ <i>Alexandrium</i> filtrate	0.2	<i>Owenweeksia</i> (Flavobacteriales)	23
		NS5 marine group (Flavobacteriales)	11
		Rhodobacteracea_uncultured bacterium (Rhodobacterales)	5
<u>Size fractionated field samples</u>			
9-May	0.2	NS5 marine group (Flavobacteriales)	12
		Rhodobacteracea_uncultured bacterium (Rhodobacterales)	11
	20	<i>Perlucidibaca</i> (Pseudomonadales)	17
		<i>Limnobacter</i> (Burkholderiales)	7
27-Jun	0.2	Unassigned	19
		Rhodobacteracea_uncultured bacterium (Rhodobacterales)	8
		<i>Owenweeksia</i> (Flavobacteriales)	6
	20	Unassigned	23
<u>Culture</u>			
<i>Alexandrium</i>	0.2	<i>Maribacter</i> spp. (Flavobacteriales)	65
		<i>Owenweeksia</i> (Flavobacteriales)	4
	>20	<i>Maribacter</i> spp. (Flavobacteriales)	50
		<i>Pseudomonas</i> spp. (Pseudomonadales)	7
<i>Dinophysis</i>	0.2	<i>Arenicella</i> spp. (Gammaproteobacteria)	22
		Rhodobacteracea_uncultured bacterium (Rhodobacterales)	11
		<i>Marivita</i> spp. (Rhodobacterales)	9
	>20	<i>Ulvibacter</i> (Flavobacteriales)	23
		<i>Arenicella</i> spp. (Gammaproteobacteria)	19

Table 2. Factors loadings for the three principal components of correlations between *Alexandrium fundyense* and *Dinophysis acuminata* abundances and the relative abundances of 16S sequences at the Order level. Values in bold type indicate the groupings of the 3 PCs that described 73% of the variance in the data.

Parameter	PC 1	PC 2	PC 3
<i>Alexandrium</i>	0.40717	0.21792	-0.1701
<i>Dinophysis</i>	-0.2599	0.41213	-0.0677
Flavobacteriales	0.38334	-0.0078	-0.1262
Rhodobacterales	0.24455	0.33997	0.46422
Rickettsiales	0.28505	-0.448	-0.1479
SAR11 clade	0.36586	-0.1897	-0.1144
Alteromonadales	0.13214	0.6085	-0.074
Oceanospirillales	0.34149	0.1532	0.12701
Unassigned bacteria	-0.4099	0.08095	-0.4408
Other bacteria	-0.2066	-0.1733	0.69586
% of variance explained	40	19	14

Figure Legends:

Figure 1. A) 2011 Log *Alexandrium fundyense* and *Dinophysis acuminata* densities (cells L⁻¹). Red and blue panel represent the peaks of the *Alexandrium* and *Dinophysis* blooms respectively. B) & C) are the relative abundances of algal sequences over the course of the 2011 *Alexandrium* and *Dinophysis* blooms at Class- and genus/species-level, respectively. The red and blue boxes represent the dates included in the peaks of the *Alexandrium* and *Dinophysis* blooms, respectively.

Figure 2. A) & B) are the relative abundances of bacterial sequences over the course of the 2011 *Alexandrium fundyense* and *Dinophysis acuminata* blooms at Phylum- and Order-level, respectively. The red and blue boxes represent the dates included in the peaks of the *Alexandrium* and *Dinophysis* blooms, respectively.

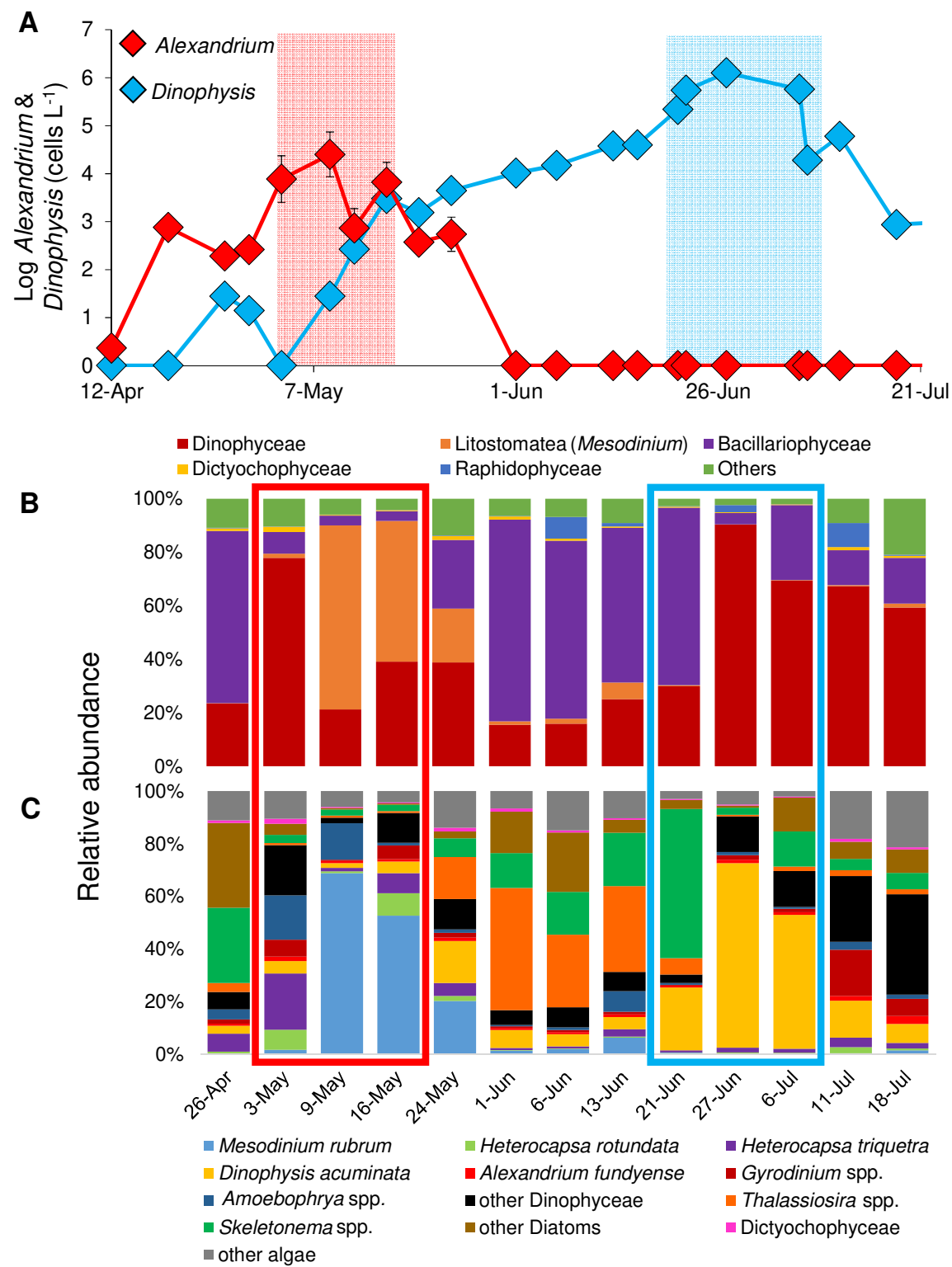
Figure 3. Relative abundances of size fractionated (0.2µm=whole bacterial assemblage and 20µm= potentially endosymbiotic or epiphytic bacteria) algae and bacterial communities during the peak of the *Alexandrium fundyense* (May 9th) and *Dinophysis acuminata* (June 27th) bloom. A) & B) are relative abundances of algal assemblages at Class- and genus/species-level, respectively. C) & D) are relative abundances of bacterial assemblages at Phylum- and order-level, respectively.

Figure 4. Relative abundances of bacterial (16s) and algal (18s) sequences for control and *Alexandrium fundyense* culture filtrate additions during an experiment conducted using the natural phytoplankton community of Northport Bay.

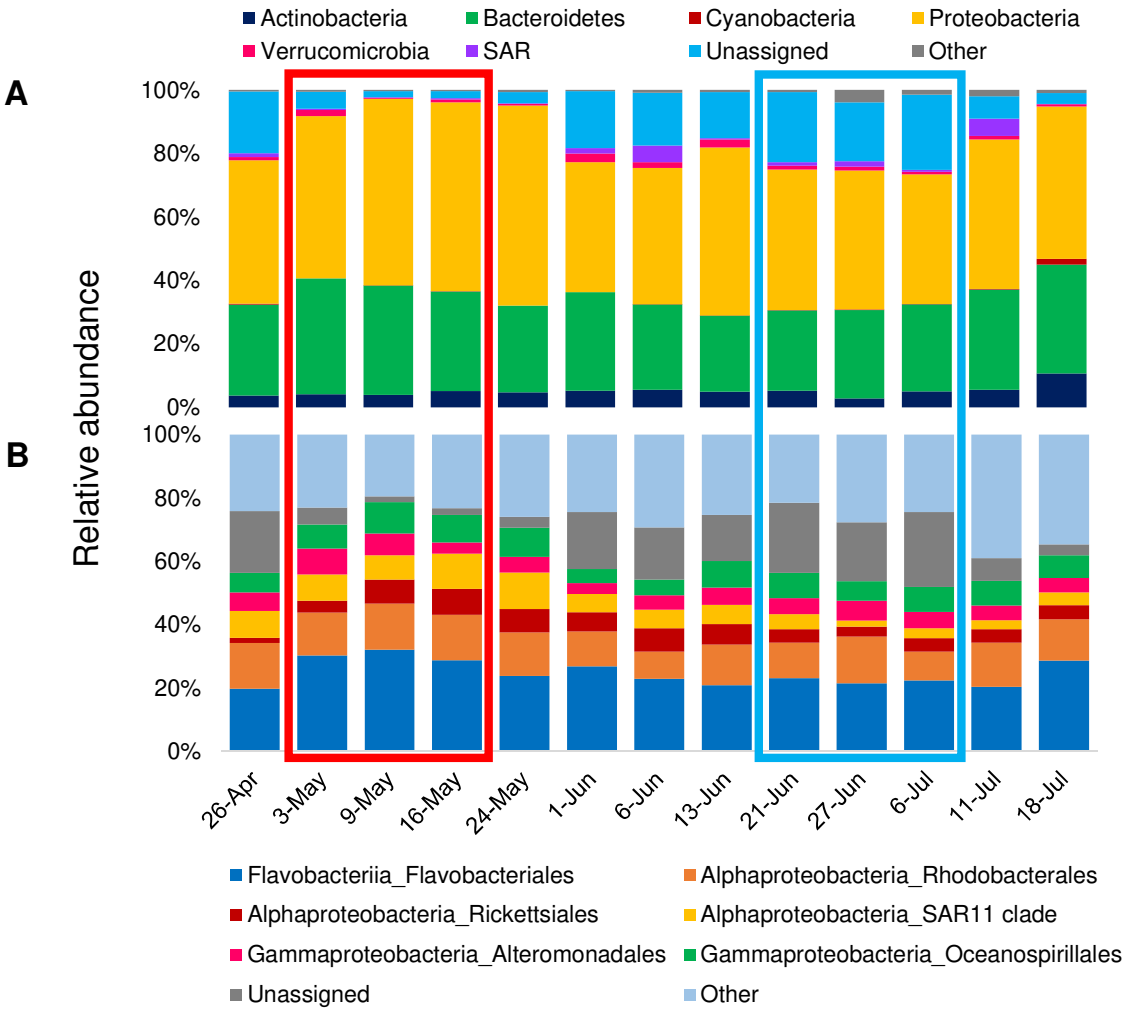
Figure 5. Relative abundances of size fractionated (0.2µm=whole bacterial assemblage and 20µm= potentially endosymbiotic or epiphytic bacteria) bacterial communities associated with *Alexandrium fundyense* and *Dinophysis acuminata* cultures. A) & B) are relative abundances of bacterial assemblages at Phylum- and Order-level, respectively. Alex= *Alexandrium* and DA= *Dinophysis*.

Figure 6. Relative abundances of bacterial community composition data analyzed via non-metric multidimensional scaling using a Bray-Curtis metric. 95% confidence interval was drawn using the standard deviation of the points from the centroid of the cluster using a chi-squared distribution. Top: Order-level; Bottom: Genus-level. AlexADD and DinoADD= *Alexandrium* and *Dinophysis* addition experiments, respectively.

Figure 1.



632 **Figure 2.**



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Figure 3.

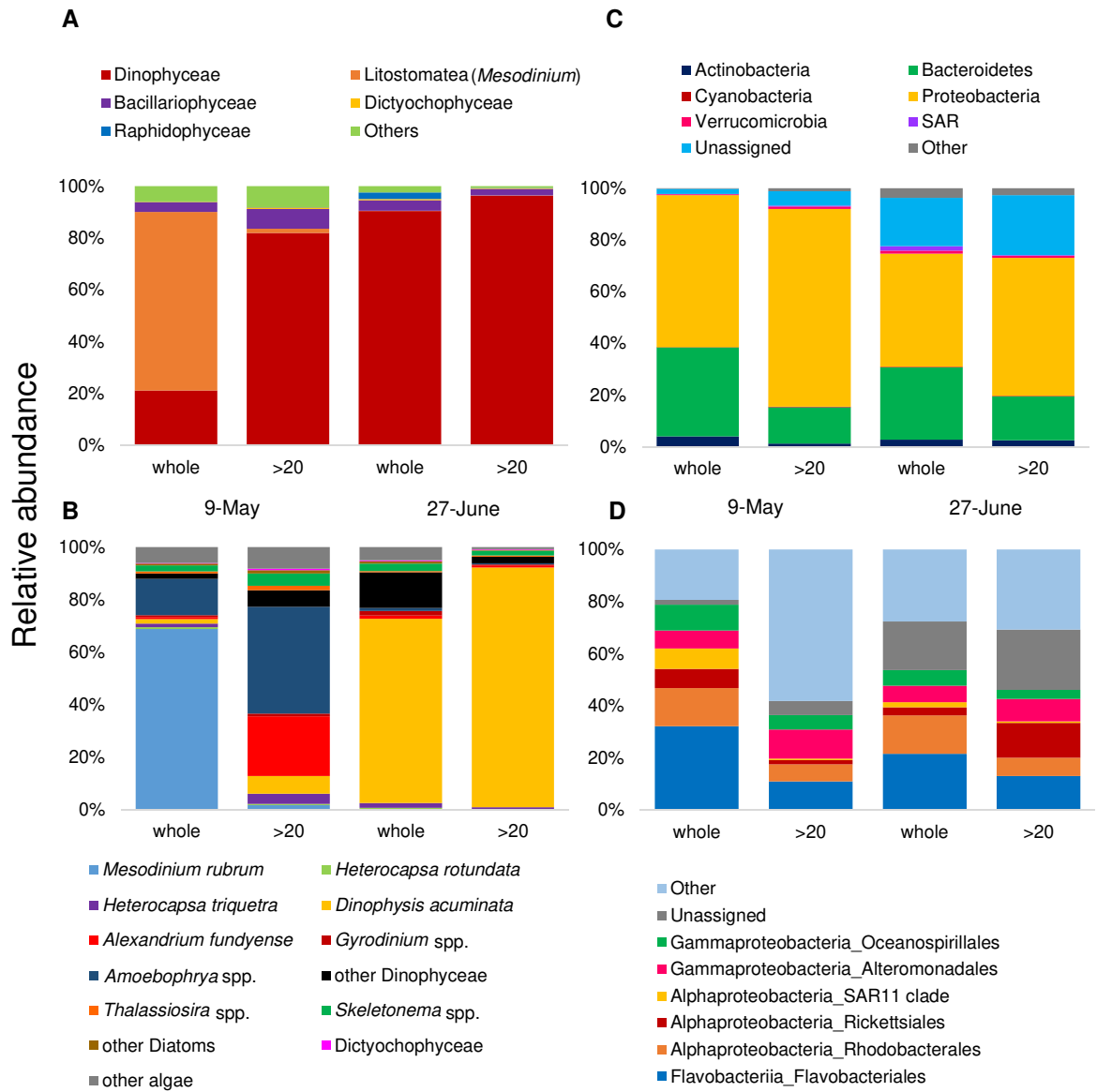


Figure 4.

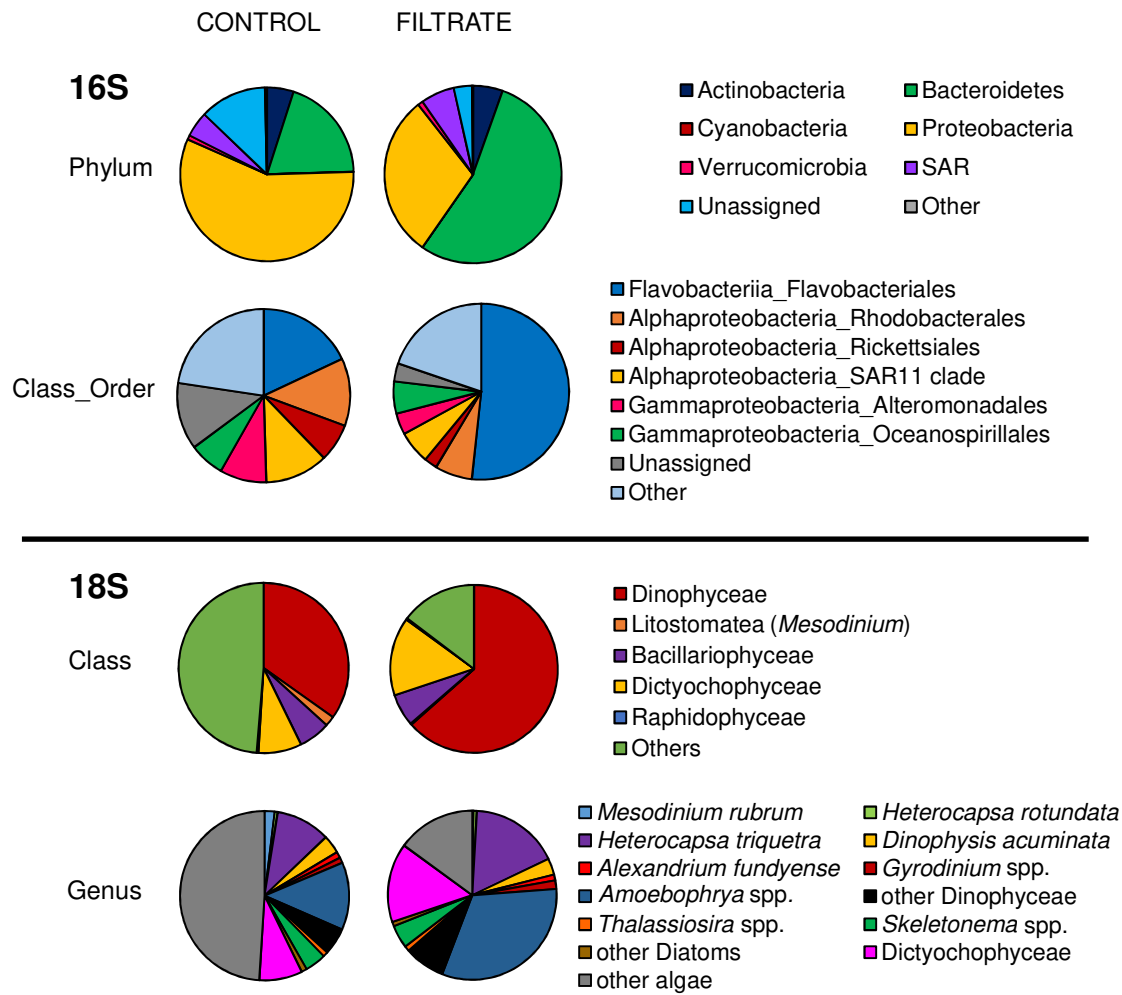


Figure 5.

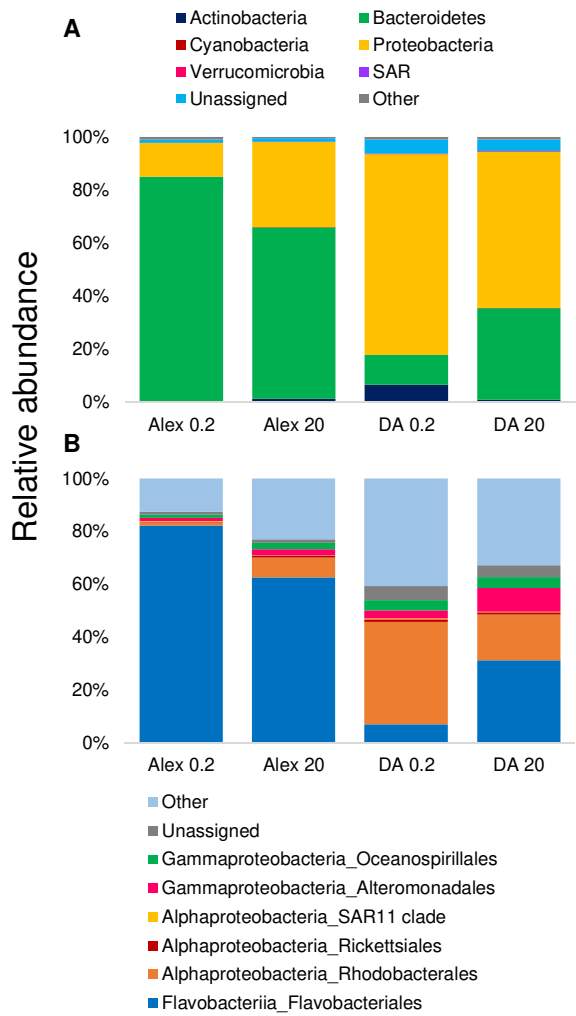
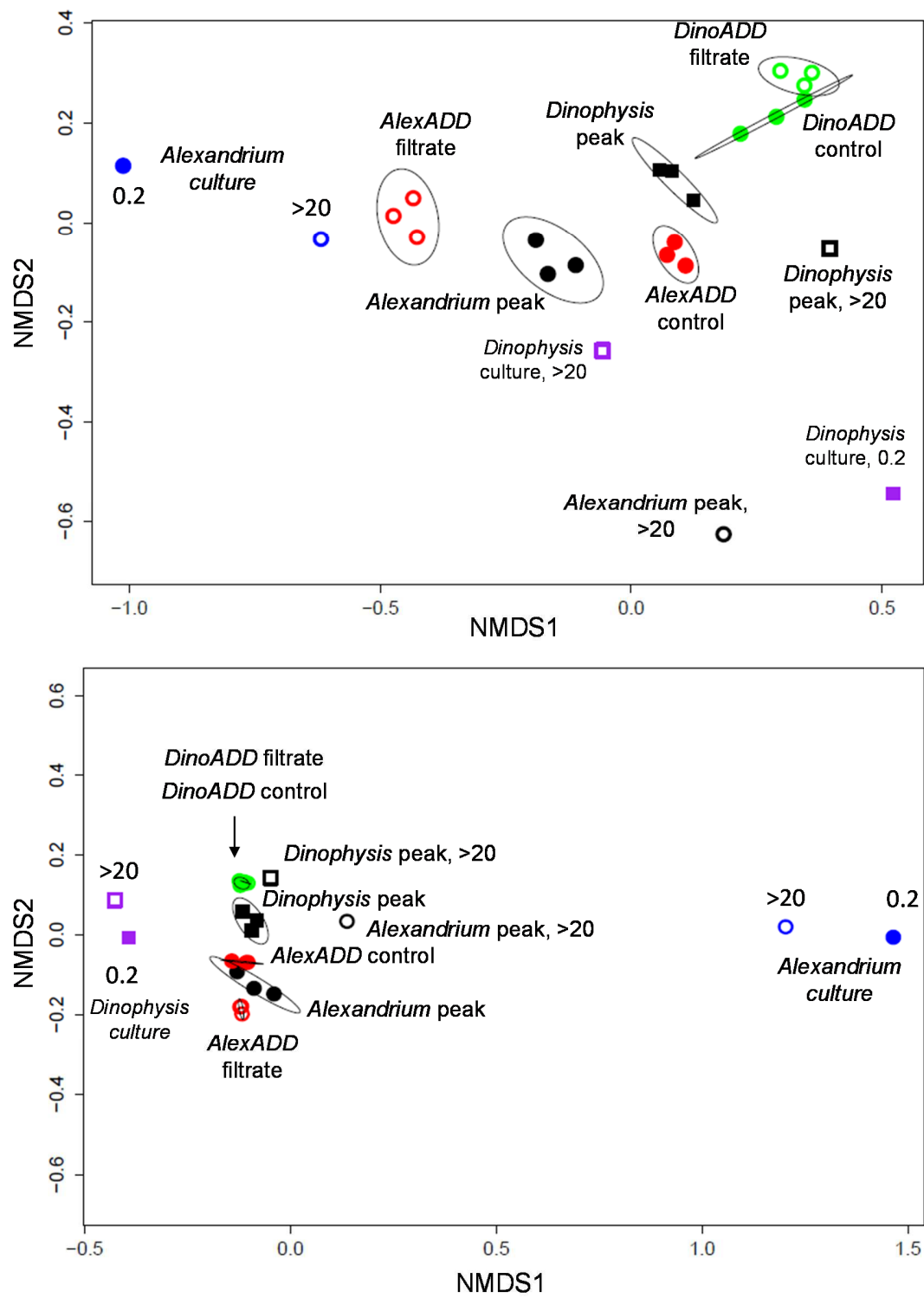


Figure 6.



648 **Supplementary Tables:**

649 **Table S1.** QIIME outputs for the sequencing of the V7/V8 region of the 18S rRNA gene,
650 including split libraries output (demultiplexed reads), total UCLUST assigned reads and the total
651 number of algal assigned reads for time series, and experimental (AlexADD and DinoADD)
652 samples and size fractions. % algal reads= (total number of algal assigned reads divided by the
653 total number of UCLUST assigned reads) x 100. AlexADD and DinoADD= *Alexandrium* and
654 *Dinophysis* addition experiments, respectively.

655 **Table S2.** QIIME outputs for the sequencing of the V4 variable region of the 16S rRNA gene,
656 including split libraries output (demultiplexed reads), total UCLUST assigned reads and the total
657 number of chloroplast and mitochondria assigned reads for time series, culture and experimental
658 (AlexADD and DinoADD) samples and size fractions. AlexADD and DinoADD= *Alexandrium*
659 and *Dinophysis* addition experiments, respectively.

660

661 **Table S1.**

size fraction	sample	split libraries output	UCLUST assigned total reads	UCLUST assigned algal reads	% algal reads
	Unassigned	452,066	422,175	368,882	87
	Time series				
0.2	26-Apr	31,929	29,348	26,846	91
0.2	3-May	28,258	25,853	22,474	87
0.2	9-May	61,523	59,143	42,010	71
0.2	16-May	48,520	46,110	29,703	64
0.2	24-May	80,920	75,313	51,810	69
0.2	1-Jun	89,280	83,505	75,665	91
0.2	6-Jun	68,263	63,774	60,089	94
0.2	13-Jun	30,803	28,569	25,816	90
0.2	21-Jun	49,241	47,141	45,233	96
0.2	27-Jun	54,582	52,036	49,461	95
0.2	6-Jul	48,736	46,407	44,808	97
0.2	11-Jul	27,608	25,112	20,421	81
0.2	18-Jul	47,917	45,505	15,960	35
>20	9-May	40,229	37,271	13,130	35
>20	27-Jun	165,270	160,618	157,252	98
	AlexADD				
0.2	Control 1	30,067	28,038	19,026	68
0.2	Control 2	34,058	31,639	21,540	68
0.2	Control 3	34,181	31,658	22,807	72
0.2	+ Alex 1	40,162	38,019	15,376	40
0.2	+ Alex 2	50,539	47,958	31,614	66
0.2	+ Alex 3	92,503	86,572	77,747	90
	DinoADD				
0.2	Control 1	62,340	60,223	54,201	90
0.2	Control 2	61,152	59,263	57,016	96
0.2	Control 3	68,612	66,813	65,018	97
0.2	+ Dino 1	142,996	138,346	133,817	97
0.2	+ Dino 2	79,649	77,177	75,334	98
0.2	+ Dino 3	125,951	122,347	119,425	98
	Total	2,147,355	2,035,933	1,742,481	86

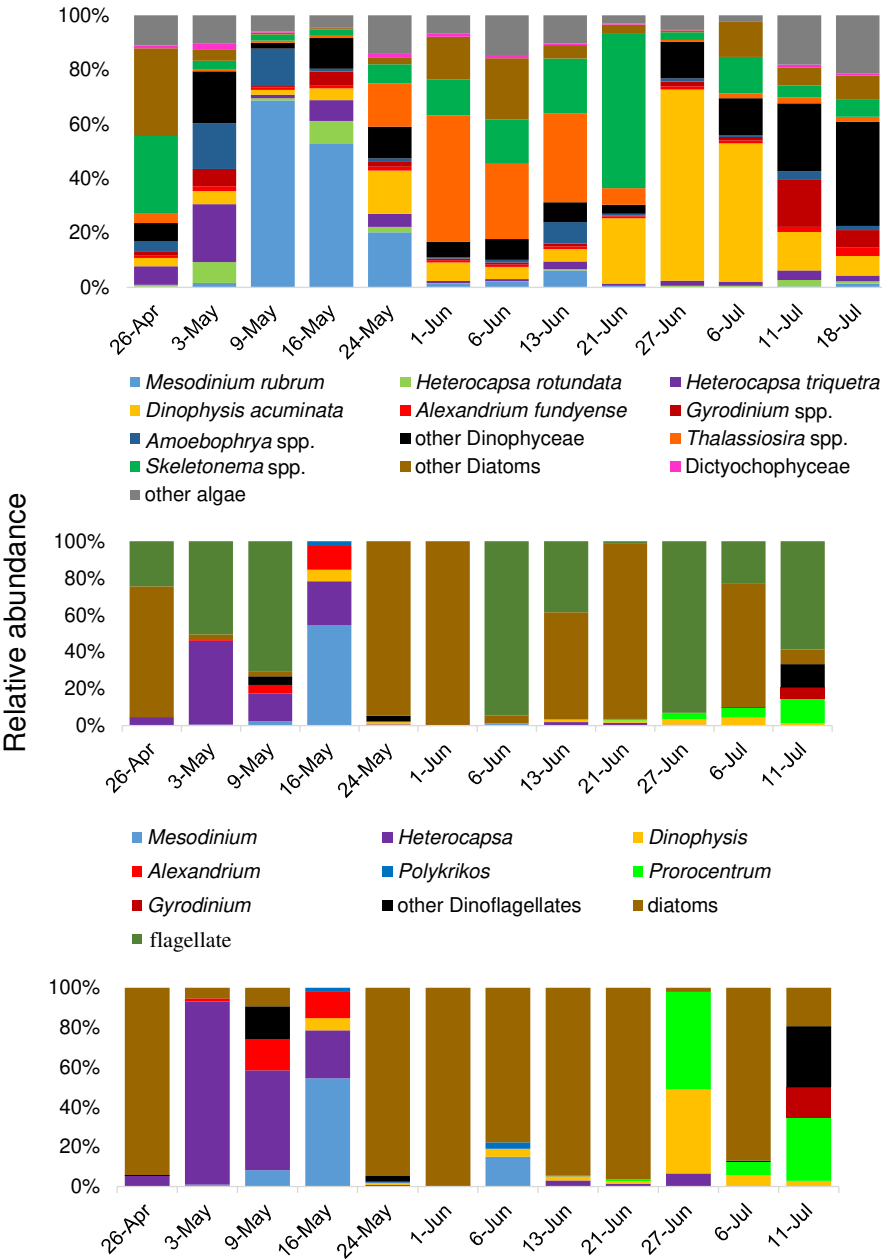
662

663 **Table S2.**

size fraction	sample	split libraries output	UCLUST assigned total reads	# of reads assigned as chloroplasts	# of reads assigned as mitochondria
	Unassigned	1,082,447	944,829	225,807	13,221
	Time series				
0.2	26-Apr	132,919	121,718	24,179	520
0.2	3-May	65,801	60,886	11,582	1,189
0.2	9-May	59,293	57,110	6,722	287
0.2	16-May	127,767	121,621	17,105	287
0.2	24-May	159,942	151,458	24,739	389
0.2	1-Jun	111,623	107,084	25,012	403
0.2	6-Jun	129,811	124,963	36,802	598
0.2	13-Jun	126,142	119,359	33,780	390
0.2	21-Jun	136,191	129,218	41,072	624
0.2	27-Jun	112,113	97,688	62,953	2,022
0.2	6-Jul	142,151	130,826	47,116	265
0.2	11-Jul	125,039	112,586	28,535	311
0.2	18-Jul	51,908	47,364	8,239	120
>20	9-May	119,419	84,142	20,636	1,022
>20	27-Jun	31,256	26,519	14,093	2,917
	Cultures				
0.2	<i>Alexandrium</i>	24,501	17,791	276	18
>20	<i>Alexandrium</i>	35,735	17,671	610	28
0.2	<i>Dinophysis</i>	47,245	45,579	10,714	91
>20	<i>Dinophysis</i>	42,093	40,907	21,171	50
	AlexADD				
0.2	Control 1	102,215	86,926	22,539	2,680
0.2	Control 2	132,743	111,867	28,990	3,136
0.2	Control 3	112,746	96,890	22,847	2,719
0.2	+ Alex 1	142,295	124,812	26,068	4,274
0.2	+ Alex 2	116,393	102,937	23,517	3,456
0.2	+ Alex 3	142,580	126,575	24,613	4,162
	Dinoadd				
0.2	Control 1	56,338	54,590	12,460	70
0.2	Control 2	122,331	118,238	22,241	179
0.2	Control 3	55,046	53,238	13,883	77
0.2	+ Dino 1	58,050	56,188	14,160	73
0.2	+ Dino 2	67,803	65,657	17,208	124
0.2	+ Dino 3	122,383	119,105	31,517	174
	Total	4,094,319	3,676,342	921,186	45,876

Supplementary Figures:

Fig. S1. QIIME species specific analysis (Top). Lugol’s preserved samples counted via light microscopy. This includes flagellates that were mostly dominated by Euglenoids (Middle). Lugol’s preserved samples counted via light microscopy with flagellate removed (Bottom). Lower legend is used for both ‘Middle’ and ‘Bottom’ figures.



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